

A NEW FRAMEWORK FOR EVALUATION OF FIELD BASED ACADEMIC
PERFORMANCES OF HIGHER EDUCATION INSTITUTIONS

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ABSTRACT

A NEW FRAMEWORK FOR EVALUATION OF FIELD BASED ACADEMIC PERFORMANCES OF HIGHER EDUCATION INSTITUTIONS

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Measurement and evaluation of academic performance is an highly debated research area and results of the studies in this area are closely followed by a large segment of the society. In general, researches conducted in this domain evaluate higher education institutions as a whole, but such an approach actually represents an average performance of the research fields, which are actively studied by the members of institutions. This may be misleading, because academic performance varies for each university depending on the field of research. However, people who are interested in the results of these studies require more detailed information about field based academic performances of institutions.

One of these studies mentioned above have been implemented in 2011 by *University Ranking by Academic Performance* (URAP) research laboratory which was established in Middle East Technical University - Informatics Institute. In this study, 2000 universities around the world have been ranked according to multiple criteria in terms of overall academic performance.

Interests shown to results of the system implemented by URAP revealed a need for a more comprehensive ranking system, which deals with the evaluation of field based academic performance.

In this sense, within the scope of this study, universities ranked by URAP research laboratory were evaluated in terms of their academic performance in the following six research fields;

- Agriculture & Environmental Sciences (AGE)
- Clinical Medicine (MED)
- Engineering, Computing & Technology (ENG)
- Life Sciences (LIFE)
- Natural Sciences (SCI)
- Social Sciences (SOC)

Institutions in this study has been evaluated according to data that have been collected from ISI - Web of Knowledge for the indicators listed below.

- Article Count (last year)
- Total Document Count (last 5 years)
- Cumulative Journal Impact (last 5 years)
- Total Citation Count (last 5 years)
- H-Index (average of last 5 years)

The results indicate that status of universities from the point of academic performance varies according to the research field.

Keywords: academic performance evaluation, measurement of research quality, university ranking

ÖZ

YÜKSEKÖĞRETİM KURUMLARINDA ALAN BAZLI AKADEMİK BAŞARIM DEĞERLENDİRMESİ İÇİN YENİ BİR ÇERÇEVE

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Akademik başarımın ölçümü ve değerlendirilmesi oldukça fazla tartışılan araştırma konularından birisidir. Bu alandaki çalışmaların sonuçları toplumun büyük bir kesimi tarafından yakından takip edilmektedir.

Bu alanda yapılan çalışmalar genellikle yükseköğretim kurumlarını bir bütün halinde değerlendirmekte, dolayısıyla çalışmaların sonuçları kurumların araştırma yaptığı tüm alanlardaki ortalama akademik başarımlarını ortaya koymaktadır. Fakat, kurumlardaki akademik başarım, araştırma yapılan alana göre farklılık göstermektedir. Yükseköğretim kurumlarının alan bazlı başarımlarının ölçüldüğü çalışmalarda ise genellikle incelemeye alınan kurumların miktarının yetersizliği göze çarpmaktadır. Akademik başarımın ölçümü ve değerlendirilmesi konusunda yapılan çalışmaların sonuçlarıyla yakından ilgilenen kişi ve kurumlar, değerlendirmeye alınan kurumların farklı araştırma alanlarındaki başarımları hakkında daha fazla bilgiye ihtiyaç duymaktadır.

Yukarıda bahsedilen çalışmaların bir örneği Orta Doğu Teknik Üniversitesi - Enformatik Enstitüsü bünyesinde kurulan University Ranking by Academic Performance (URAP) araştırma

laboratuvarı tarafından 2011 yılında yapılmıştır. Bu çalışmada dünya çapında 2000 üniversite çoklu başarımlar ölçütleri doğrultusunda ortalama akademik başarımlar açısından değerlendirilmiştir.

Çalışmaya gösterilen yoğun ilgi neticesinde, yükseköğretim kurumlarının alan bazlı başarımları hakkında bilgi verebilecek yeni bir çalışma ihtiyacı doğmuştur.

Bu çalışma bünyesinde, yukarıda bahsedilen ihtiyaçtan yola çıkılarak, URAP araştırma laboratuvarı tarafından incelenen yükseköğretim kurumlarının akademik başarımları bu kez aşağıda adı geçen araştırma alanları açısından değerlendirilmiştir;

- Ziraat ve Çevre Bilimleri
- Tıp
- Mühendislik Bilimleri
- Yaşam Bilimleri
- Temel Bilimler
- Sosyal Bilimler

Çalışma bünyesinde değerlendirilen üniversiteler, verileri ISI - Web of Knowledge'dan alınmış olan aşağıdaki başarımlar ölçütleri açısından incelenmiştir;

- Makale Sayısı (son yıl)
- Toplam Döküman Sayısı (son 5 yıl)
- Toplam Dergi Etki Faktörü (son 5 yıl)
- Toplam Atıf Sayısı (son 5 yıl)
- H-İndeks Değeri (son 5 yıla ait ortalama)

Araştırmanın sonuçları ve istatistiksel analizler göstermektedir ki üniversitelerin akademik başarımları araştırma alanlarına göre değişmektedir.

Anahtar Kelimeler: akademik başarımlar, araştırma kalitesi, üniversite sıralaması

to my family and members of URAP Center...

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CHAPTER 1

INTRODUCTION

In recent years, there has been an increasing interest in performance and quality measurement issues regarding all kind of organizations in their field of activity. These studies may be done by the organizations themselves and also be made by impartial parties. As a result of these works, organizations take advantages of monitoring their past or current status to be aware of their positions through others.

As in other fields, performance and quality evaluation is also an important issue for academia and they play a crucial role on improvement of academic quality for all kind of academic units such as academicians, departments or institutions. Due to competitive and collaborative environment of academia, the academic units are deeply interested in the results of these studies, in order to plan their short and long term goals. Outputs of researches conducted on this topic are also followed closely by individuals and policy makers in higher education. Therefore, many local or global scale studies have been done on this subject and number of similar studies are increasing day by day. However, results of these studies are discussed heatedly and there are many objections raised due to their methodologies, metrics and data sources.

Since the declaration of the first institution based ranking system named “U.S. News and World Report College and University Rankings”, there have been a proliferation on this topic. As it is mentioned earlier, this attention on ranking systems has have made discussions regarding their procedures, indicators and data sources significant. Performance indicators used by ranking systems have become the most criticized components of these studies. Owing the fact that all the studies in this topic prefer to use different indicators, their sufficiency always became an objected issue. In addition to this, data sources used by systems are always criti-

cized in terms of their objectivity and compliance. Depth and scope of ranking systems have also been considered by the audience of the studies. For instance, some systems evaluate institutions in their scope as a whole unit, where others examine field based performances of the institutions. Similarly, certain studies limit their scope with institutions from a specific counties, on the other hand, regional and global wide studies also have been done.

In correlation, the first promising study in this domain in Turkey was published by Prof. Dr. Ural Akbulut (Former President of METU) to overlay the status of Turkish universities in world ranking lists of that time. Subsequently next year, Dr. Akbulut announced a follow-up study that ranks Turkish universities according to their academic performances. This research has been initiated with the establishment of *University Ranking by Academic Performance (URAP)* research laboratory in Middle East Technical University - Informatics Institute. In 2011, overall academic performance ranking of 2000 world universities was published by URAP which was the first study that is also going to be conducted annually in the upcoming years (University Ranking by Academic Performance, 2011). Results of this study has seen a great interest all around the world, so that, members of the URAP research laboratory decided to elaborate the analysis with a field based academic performance ranking. In accordance, this piece of work covers up field based academic performance evaluation of those universities that were involved in the URAP 2010 world ranking.

In this study, the terms "university", "institution", "organization", and "Higher Education Institution (HEI)" are used interchangeably. Also, the terms "system", "ranking system", and "university ranking system" carry the same meaning.

Structure of the Study

Chapter 2 begins by describing relevant disciplines about the topic. Later on, key terms about the study are explained to smooth the way for readers. The third part gives a large scaled review about the term university ranking. In the last part, world wide known field based ranking systems and field based academic performance evaluation methods proposed in the literature are discussed.

Chapter 3 involves the new framework that constitutes the main component of the thesis, and consists of three parts. In the first part methodology of the new framework is detailed. The following part explain the phases of research conducted: aim & scope definition, performance

indicators, data collection steps, and used methods while scoring and weighting of the results obtained. The last part of Chapter 3 gives information about the limitations of the study.

Results of the study and corresponding statistical analysis are given in Chapter 4.

Chapter 5 consists of conclusions and future studies related with the research conducted.

Finally, appendices are presented at the end of the document.

CHAPTER 2

LITERATURE SURVEY

This chapter consists of four parts and starts with a deep review of disciplines related with the study. In the next part, description of the terms relevant to academic performance evaluation will be given. The following part informs the reader about university ranking phenomenon by presenting classification of current systems and listing common processes and challenges they share. In the fourth part of this chapter, a comprehensive survey on current field and/or subject based global ranking systems will be undertaken.

2.1 Relevant Disciplines

The rapid increase in number of studies related with bibliography has led to emergence of new disciplines which deals with extraction, classification, analysis and evaluation of bibliographic data. However, (Hood & Wilson, 2001) indicates that, definitions of the terms bibliometrics, scientometrics and informetrics cause a semantic confusion. This section of the study presents an overview of these disciplines in terms of their history and field of interest.

2.1.1 Bibliometrics

In December 1969, Alan Pritchard published a paper in which he described the term bibliometrics as “*the application of mathematics and statistical methods to books and other media of communication*” (Pritchard, A, 1969). In the same issue of *Journal of Documentation*, there had been another article written by Fairthorne, who depicts the term bibliometrics as “*quantitative treatment of the properties of recorded discourse and behaviour appertaining to it*” (Fairthorne, 2005). However, this definition was criticized by Broadus, in terms of unlimited

features of published items and unmanageably wide nature of this definition (Broadus, 1987).

Afterwards, definition of bibliometrics had been reinterpreted by others and they have proposed well-formed descriptions. In 1981, Potter demarcated the definition of bibliometrics and redefined the term as:

“Bibliometrics is, simply put, the study and measurement of the publication patterns of all forms of written communication and their authors” (Potter, 1981)

After two years, Machlup and Mansfield have put forward a follow up clarification to the concept as *“statistical studies of the growth and distribution of the literature”* (Machlup & Mansfield, 1983).

On the other hand, (Sengupta, 1992) argues that the first bibliometric study have been done by (Campbell, 1896) using statistical methods to exhibit distribution of subjects in publications.

Overall, keeping all these definitions in mind, one of the most comprehensive conception of bibliometrics came from ALA Glossary of Library and Information Science: *“The use of statistical methods in the analysis of a body of literature to reveal the historical development of subject fields and patterns of authorship, publication, and use. Formerly called statistical bibliography”* (Usdin, 1985).

2.1.2 Scientometrics

The term *“naukometriya”*, namely the scientometrics, was first introduced by (Nalimov & Mulechenko, 1969) in Russian. Basically, the term bibliometrics can be defined as *“the study of all aspects of the literature of science and technology”* (Hood & Wilson, 2001).

Tibor Braun has founded journal *Scientometrics* in 1978 in Hungary, and this step has played an important role in increasing awareness of the term. Establishment of *International Society for Scientometrics and Informetrics (ISSI)* in 1993 is also a milestone in the history of scientometrics.

In addition to (Hood & Wilson, 2001), an alternative definition for scientometrics have been provided by (Tague-Sutcliffe, 1992) as:

“the study of the quantitative aspects of science as a discipline or economic ac-

tivity. It is part of the sociology of science and has application to science policy-making”.

2.1.3 Informetrics

The term informetrics was derived from German term “informetrie” and introduced by (Nacke, 1979) to define a component of information science, which deals with measurement of information by applying mathematical methods. Also, he designates the term as a sister field of scientometrics.

The proximity between the definitions of informetrics, scientometrics and bibliometrics was remarked by (Bonitz, 1982) and it is suggested that “library informetrics” and “informetrics of science” should be separated as two different terms.

Accordingly, formally the concept could be defined as:

“the study of quantitative aspects of information in any form, not just records, bibliographies, and in any social group not just scientists. ... Two phenomena that have not, in the past, been seen as a part of bibliometrics or scientometrics, but fit comfortably within the scope of informetrics are: definition and measurement of information, and types and characteristics of retrieval performance measures.” (Tague-Sutcliffe, 1992)

2.2 Related Terminology

In this section of the study, definitions of terms related with the concepts of academic performance evaluation, measurement of research performance and university ranking are presented.

2.2.1 Scientific Publication / Document

In the most simple sense, scientific publication is the output of a research in an academic discipline, which includes justification, methodology, conclusion, results and utilized resources. Type of scientific publication varies according to the field that the research carried on. For instance, in science and medical fields, usually result of a research is shared via publishing an

article. On the other hand, researchers in different fields such as social sciences and arts & humanities share their findings in different formats. List of commonly used scientific publication types are listed in Table 3.1.

2.2.2 Citation

Generally, definition of citation is to provide a reference to some one's published or unpublished intellectual property in a formal structure. In bibliometrics, citation count of a document is widely accepted as a popularity indicator for the related study. Because of this reason, citation count is included in many of the academic performance evaluation systems. It should not be ignored that, some studies in the literature are criticized and cited due to their inadequacy and mistakes.

2.2.3 Self Citation

A reference is called self-citation when the author cites his/her own previous study. From the point of research performance measurement, if the citation count is preferred as an indicator, it's vital to exclude number of self citations from total citations count.

2.2.4 Citation Database / Index

The most important reason of emergence of citation databases is to make a determination of how the information produced is used by the community. This is an important indicator to measure the quality of the information.

According to (Thomson Reuters' Scientific Essays, 2011), there are definite factors which motivates the foundation of citation indexing systems. Firstly, as a result of the augmenting investments in scientific research and development after the World War II, the number of scientific publications drastically increased. Hence, this development has forced researchers to seek high quality journals for their publications. The second reason was the slowness of the process of subject indexing at that time, which influenced the researchers negatively. Finally, major developments in computer technology has played an important role in the emergence of citation databases.

Idea of machine generated citation database was first mentioned by Dr. Eugene Garfield, who aimed to remove human factor in document indexing, in 1955 (Garfield, 1955). Nowadays, citation databases track millions of scientific documents in numerous fields and make it possible to search or report entire content for researchers.

2.2.5 H-Index

Within the literature, there have been huge number of methods proposed to measure the impact of an individual’s research output. Undoubtedly, H-Index is one of the most well known method among these studies and it is described as follows by (Hirsch, 2005);

A scientist has index h if h of his/her N_p papers have at least h citations each, and the other (N_p-h) papers have no more than h citations each.

where N_p = Number of papers.

An example H-Index calculation is given in Table.

Table 2.1: Example calculation of H-Index

Publication	Citation Count
Publication 1	6
Publication 2	7
Publication 3	9
Publication 4	11
Publication 5	13
Publication 6	15
Publication 7	17
Publication 8	19
Publication 9	20
Publication 10	38

According to the above presented definition, author’s 10 publications are cited at least 10 times. Then, the author’s H-Index value becomes 10.

2.2.6 Journal Impact Factor

It’s a fact that, one of the important factors in determining the quality of a publication is the quality of the journal where the article is published. Based on this idea, “impact factor” was

suggested by (Garfield, 1955), who is the founder of the Institute for Scientific Information (ISI).

The data used during the calculation of impact factor journals is as follows;

A journal's impact factor is based on 2 elements: the numerator, which is the number of citations in the current year to items published in the previous 2 years, and the denominator, which is the number of substantive articles and reviews published in the same 2 years. (Garfield, 2006)

As an example, impact factor calculation of journal x for year 2011 is given in Figure 2.1.

$$\text{Journal Impact Factor} = \frac{\text{Citation count of items published in 2009 and 2010:30}}{\text{Total citable items published in 2009 and 2010:120}} = \mathbf{0.25}$$

Figure 2.1: Example Journal Impact Factor calculation

2.3 University Ranking

As mentioned in Chapter 1, declaration of first institution based ranking system “U.S. News and World Report College and University Rankings” has led to an increase in attention to university ranking phenomenon and development of alternative ranking systems. In this part of the study, an overview of categorization, common process and possible challenges of ranking systems will be presented.

2.3.1 Categories

Since the early 1980s, increased interest in the university ranking systems has resulted in emergence of alternative systems which differentiated in focus, scope, and data sources.

In terms of scope, university ranking systems can be classified as national, regional or national level. The biggest variation between these systems are related to the type of data used and number of institutions covered. In general, global or regional systems prefer to use more generic data such as citation and publication count, international awards or medals etc. On the other hand, national wide systems can use more elaborative data, due to ease of access.

Annual research budgets, student and faculty count and number of projects handled are some of the preferred indicators of national wide systems.

In addition to scope, focus of a ranking system is another distinguishing factor in terms classification. Ranking systems can be divided into two groups according to their focus. First group covers the systems that evaluate HEIs as a whole, and the second group includes field or subject based ranking systems. The disadvantage of the systems included in the first group is that they represent average performance of the research fields, which are actively studied by the members of the HEIs. Therefore, members of the society who need detailed information on the subject does not prefer these systems. On the other hand, systems in the second group are also criticized due to their methodologies in selection of fields or subjects. In spite of the discussions about their methodologies, field or subject based ranking systems present more accurate results for the people who are interested in university ranking systems.

The data sources preferred in the methodology of ranking systems is another discriminating point. Some of the systems rank universities according to surveys or expert opinions. This approach causes a discussion about the objectivity of the data source. On the other hand, ranking systems that make use of open data sources such as citation databases, annual reports are also available. Possibility of accessing data sources by the audience increases confidence in such systems.

2.3.2 Processes

In spite of the fact that each ranking system involves different infrastructure and methodology, majority of these systems include the following processes;

- **Determination of Scope and Focus** As mentioned in 2.3.1, scope and focus definition forms the boundary of a system and plays a crucial role in preparation of the methodology. In order to specify these significant points, answers of the questions related to the below criteria should be clear:
 1. Geographical limits of the study (national, regional or global)
 2. The number of institutions to be included in the study
 3. Academic fields and/or subjects to be used in classification of the universities

- **Indicator Definition** Indicators are the components of a system that shape data collection and scoring phases of the study. Institutions which are being evaluated are ranked according to these criteria. According to the methodology, systems prefer to use single or multiple indicators. Indicators are weighted according to their importance.
- **Data Collection** After the determination of indicators, related data is collected according to the data source. This step can be done manually or using computer based crawling tools.
- **Scoring** The next step is the scoring of collected data according to weights of indicators. After this stage, results of the study take its final form.
- **Publishing** In the final stage, results of the study are shared with the community via different methods such as websites, scientific publications or annual reports.

2.3.3 Challenges

Other than the common processes described in the previous section, university ranking systems also share common challenges. In this section, potential difficulties faced by the systems are presented.

Objectivity is one of the most important points that affects reliability of the system. Because of this reason, indicators and related data source must be chosen carefully. Otherwise, the transparency of the system will be a matter of debate. The second important issue occurs in the stage of data collection. Unfortunately, authors of scientific publications use many alternative names while addressing their research outputs. This situation leads to serious problems, especially when collecting data from citation databases. Inadequate or outdated compilation of name alternatives of the institutions causes retrieval of missing data and affects the results of the study. To eliminate this problem, some operations on university name alternatives must be done according to the data source. These operations can be summarized as follows:

- Creating a list of abbreviations of the institutions,
- Determination of the name alternatives of institutions in different languages,
- Defining locational expressions to split universities having the same or similar names,

- Cancellation of unrelated name alternatives (hospitals or research centers in the same location)

Another challenge that is mostly encountered by these systems is the accuracy of data collection. Due to the large size of the data that the systems deal with, manual data collection may result in evaluation of the institutions according to missing data. In order to solve this problem, majority of these systems utilize automated data crawling tools.

2.4 Field and/or Subject Based Global Ranking Systems

As mentioned in the previous sections, the increase of interest in the university ranking systems and developments in fields of bibliography have led to the emergence of alternative systems. In this part of the study, current field and/or subject based global ranking systems will be examined in terms of their history, scope, focus, performance indicators and related data sources.

2.4.1 Academic Ranking of World Universities (ARWU)

Center for World-Class Universities was established by the Institute of Higher Education, Shanghai Jiao Tong University with the aim of detecting status of Chinese universities among world universities. With the publication of initial list by Center for World-Class Universities (the list a.k.a. ARWU) in June 2003, reputation of their system has increased expeditiously (Liu & Cheng, 2005).

- **Scope and Focus**

Center for World-Class Universities ranks 1000 institutions around the world, having Nobel Laureates, Fields Medalists, Highly Cited Researchers, or publishing papers in Nature or Science Journals. However, only %50 of the selected institutions are announced in the ranking list. According to their methodology, ARWU announces overall performance of 500 universities and top 100 universities in Natural Sciences and Mathematics, Engineering / Technology and Computer Sciences, Life and Agriculture Sciences, Clinical Medicine and Pharmacy, Social Sciences. In addition to these cat-

egories, ARWU announces ranking of top 100 universities in certain subjects such as Mathematics, Physics, Chemistry, Computer Science, and Economics / Business.

- **Indicators**

In ARWU, institutions are evaluated according to the following indicators (Shanghai Ranking Consultancy, 2010);

Alumni : The number of graduates of a university awarded with a Nobel Prize or Field Medal. Data source: <http://nobelprize.org/> and <http://www.mathunion.org/medals/>.

Award : The number of faculty of a university awarded with Nobel Prize in Physics, Chemistry, Medicine and Economics and Fields Medal in Mathematics. Data source: <http://nobelprize.org/> and <http://www.mathunion.org/medals/>.

HiCi (Highly Cited Researcher): The number of highly cited researchers in the list published by <http://www.isihighlycited.com>.

N&S (Nature and Science Journals): The number of articles published in Nature and Science Journals within last five years. Data source: <http://www.isiknowledge.com>.

PUB (Publication) : The total number of articles and conference proceedings indexed in SCI-Expanded and SSCI in last year. Data Source: <http://www.isiknowledge.com>.

PCP (Per Capita Performance): Calculated by dividing total number of full-time faculty in an institution to sum of all other indicator scores that are presented above. Data source: National agencies.

2.4.2 QS World University Rankings

The ranking was initially published in between 2004 and 2010, under the name of THE-QS World University Rankings by the collaboration of Quacquarelli Symonds and Times Higher Education. The system, with the end of partnership in 2010, was renamed to QS World University Rankings.

- **Scope and Focus** In 2010, QS World University Rankings (a.k.a. Top Universities) ranked 660 universities from 2500 institutions surveyed around the world and published overall performance of top 500 universities. Additionally, QS World University Rankings provides ranking of top 200 universities in 5 fields and 20 subject categories.

- **Indicators**

QS World University Rankings evaluates institutions according to the 6 indicators (QS, 2011);

Academic Reputation Index: This is the most debated indicator of the system. Evaluation data is based on expert opinions. Data source: Over 15.000 Academicians around the world.

Employer Review: This indicator is similar to the previous one, expert group is composed of people who hires the graduates of the universities. Data source: Global companies.

Citations per Faculty: It's calculated by dividing total number of citations to number of faculty members. Data source: Scopus, information provided by the institutions.

Student / Faculty Ratio: The number of students per faculty. Data source: Information provided by the institutions.

International Faculty: Ratio of foreign faculty members in all faculties. Data source: Information provided by the institutions.

International Students: Ratio of foreign students in all students. Data source: Information provided by the institutions.

2.4.3 Times Higher Education World University Rankings

THE World University Rankings is a subsidiary of Times Higher Education Magazine - TSL Education Ltd., and published since 2010 with the contribution of Thomson Reuters. As it can be seen in the indicators section, the survey results (in other words the expert opinions) about the institutions being evaluated have a major impact on THE World University Rankings. This situation leads to criticism of the methodology.

- **Scope and Focus**

Times Higher Education World University Rankings publishes overall performance of top 200 universities from 6 regions. In addition to this ranking, top 50 institutions in Engineering & Technology, Life sciences, Clinical, Pre-clinical & Health, Physical sciences, Social sciences, Arts & Humanities are also announced. The first time in

2011, ranking of top 100 universities by their reputation, based on a survey conducted with 13,000 experienced academics from 131 countries, was also published.

- **Indicators**

Times Higher Education World University Rankings groups 13 indicators in the following 5 groups (Baty, 2010);

Teaching: This group consists of 5 indicators which are reputational survey on teaching, student/faculty ratio, rate of PhD and undergraduate students, number of PhD graduates and number of faculty members. Data Source: Academic Reputation Survey carried out by Thomson Reuters, expert opinions, information provided by the institutions.

Research: With this indicator group, THE World University Rankings aims to determine research quality of an institution. This group includes the following indicators: expert opinions about the research fields in an institution, per-faculty research income of a university scaled to purchasing power, per-faculty research volume, ratio of public research income to total income. Data Source: Expert opinions, national agencies, information provided by the institutions.

Citations: In order to measure research impact, THE World University Rankings uses total citation counts of the institutions. Data Source: Thomson Reuters.

Industry Income: This indicator presents the knowledge transfer capacity of an institution from academia to industry. Data Source: Information provided by the institutions.

International Mix: This group of indicators evaluates the globality of a university by measuring the ratio of international to domestic staff, and the rate of international students to domestic students.

2.4.4 HEEACT Performance Ranking of Scientific Papers for World Universities

The ranking is prepared and published since 2007 by Higher Education Evaluation and Accreditation Council of Taiwan to measure scientific paper performance of top 500 universities around the world. According to (Huang, 2007), this focus make this system more different from the others and indicators that measure current research performance increase the objectivity of the system.

- **Scope and Focus** HEAACT Performance Ranking of Scientific Papers selects and ranks 700 from 4000 institutions listed by Essential Science Indicators (ESI) and publishes overall performance of top 500 universities. In terms of categorization, system evaluates the same number of universities but announces top 300 in each 6 fields and 10 subject categories.
- **Indicators** The indicators included in HEEACT Performance Ranking of Scientific Papers for World Universities are presented in Table 2.2 (HEEACT, 2009).

Table 2.2: Indicators used by HEEACT Performance Ranking of Scientific Papers for World Universities

Criteria	Performance Indicators	Weighting
Research productivity	Number of articles in the last 11 years	10
	Number of articles in the current year	10
Research impact	Number of citations in the last 11 year	10
	Number of citations in the last 2 years	10
	Average number of citations in the last 11 years	10
Research excellence	h-index of the last 2 years	20
	Number of Highly Cited Papers	15
	Number of articles of the current year in high-impact journals	15

2.4.5 SCIMAGO Institutions Rankings (SIR)

SCIMAGO Institutions Ranking has been published since 2009 by SCIMAGO Research Group, a subsidiary of SCOPUS. This is the only ranking system developed by a citation database.

- **Scope and Focus**

In 2011, 2.833 research institutions were evaluated by the SIR and the ranking list was published under the name of World Report 2nd Edition. In this respect, SIR has a wider scope than the other ranking systems. Additionally, SIR announces ranking of 1.369 Ibero-American universities from 42 different countries.

- **Indicators** SCIMAGO Institutions Rankings uses 4 performance metrics to evaluate higher education institutions.

Output: The total number of documents published in scholarly journals. Data Source: Scopus.

International Collaboration: The ratio of researches conducted in collaboration with foreign institutions. Data Source: Scopus.

Normalized Impact: Measures the impact of an institution's research output by comparing the world average for the same subjects. Data Source: Scopus.

High Quality Publication: Ratio of the scientific documents published in scholarly journals with highest impact factors. Data Source: Scopus.

CHAPTER 3

Methodology

As it is mentioned in previous sections, current global university ranking systems have some disadvantages and weaknesses in terms of scope, objectivity of data sources used and preferred performance indicators.

There have been various systems developed and introduced to measure academic performance of world universities, however, none of these studies have applied multiple objective academic indicators to evaluate field or subject based academic performance of more than 500 institutions. This situation influences the systems adversely, because considerable amount of universities can not take a place in this studies. On the other hand, there have been some studies ranking world universities in a wider range using non-academic criteria. Webometrics Ranking of World Universities is the most well known study in this classification. It covers more than 20.000 higher education institutions around the world and ranks universities according to some web popularity metrics such as hugeness of search engine query results related with the domain name of the university, number of inlinks received from other sites, volume of reach files provided under the domain and Google Scholar search results. Second biggest study in this category is 4ICU and it ranks web popularity of 10.000 institutions in terms of Google Page Rank, Yahoo Inbound Links, Alexa Traffic Ranking. In addition to these studies, SCImago Institutions Ranking (SIR) publishes a ranking list of 2.833 research institutions using only one indicator that is the number of publications indexed by Scopus who is the developer of SIR. The 2011 European University Association (EUA) Report on global ranking systems also draws attention to this shortcoming and criticises that more than 16.000 of the world's universities have never been ranked in these studies (Rauhvargers, 2011).

Another issue which have been discussed widely about current ranking systems is the objec-

tivity and properness of the data sources. In point of fact, a reliable ranking system must use open data sources which will be accessible to all audience of the study. Therefore, systems that are ranking institutions based on unclear metrics such as survey responses come under heavy criticism.

Validity of indicators used by ranking systems have been another controversial point. It is crucial for a ranking system that chosen performance indicators must be applicable to all institutions in scope of the study. Size dependency is an obvious example of this situation and it should be taken into consideration while developing a ranking system.

In the light of above presented information and to lessen drawbacks of current ranking systems, a new framework has been designed in this study to evaluate field based academic performance of 2,000 higher education institutions those have never been ranked using multiple objective academic criteria.

3.1 Methodology

3.1.1 Aim and Scope Definition

The framework implemented in this study has been designed to evaluate 2000 higher education institutions around the world, in terms of their academic performance in 6 different research fields. The fields used in the evaluation of academic performance of institutions are as follows;

- Agriculture & Environmental Sciences (AGE)
- Clinical Medicine (MED)
- Engineering, Computing & Technology (ENG)
- Life Sciences (LIFE)
- Natural Sciences (SCI)
- Social Sciences (SOC)¹

¹ Field of Arts & Humanities (AHCI) is included in Social Sciences (SOC).

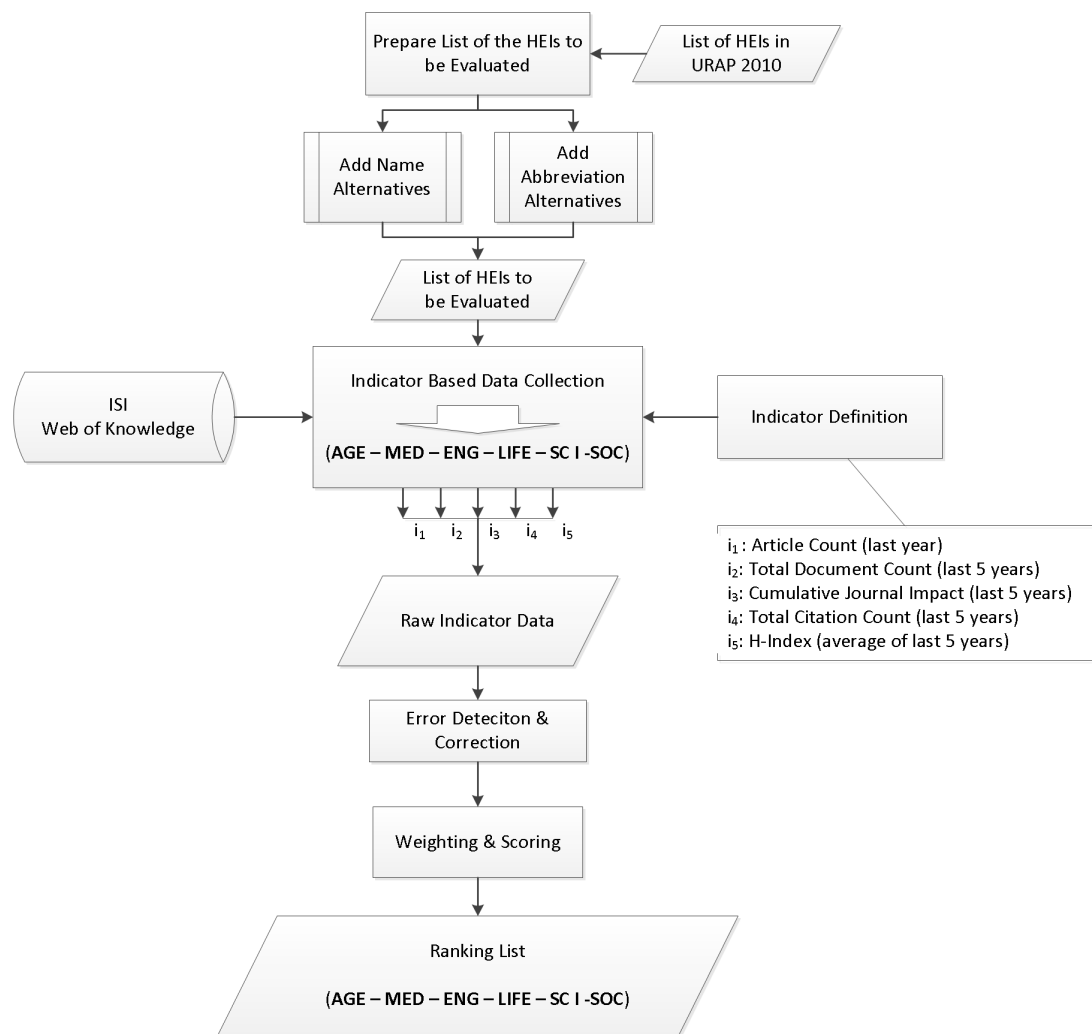


Figure 3.1: Workflow diagram of proposed framework.

The research fields that are given above are composed of 24 subject categories and corresponding 248 subjects. The full list of subjects, subject categories and related research fields are given in Appendix A.

The universities within the scope of this study were selected from the institutions, having largest number of articles indexed by ISI Web of Knowledge.

3.1.2 Indicator Definition

As mentioned in previous sections, university ranking systems use one or more indicators to rank institutions. According to the methodology, indicators included in these systems evaluate

different aspects of the universities, such as research impact, reputation, income, number of graduates etc.

In respect to the methodology of the framework implemented in this study, preferred indicators are used to evaluate the higher education institutions in terms of their academic performance. In this sense, many performance indicators have been tested in the development of this study. In the test period, each indicator was applied on a small group of universities. The consistency of test results has determined whether an indicator will be used in the system or not.

Consequently, indicators whose details are presented in the following sub-sections were selected to be used in the evaluation process of the institutions.

3.1.2.1 Article Count

One of the quantitative indicators in this study is the number of articles indexed by SCI, SSCI and AHCI under the name of institution. In order to measure current scientific productivity of an institution, only previous year's article counts were taken into consideration.

3.1.2.2 Total Document Count

It is a fact that document type of an academic output is varied between fields, even subject categories under the same field. In medical, science, and life categories, publishing an article is the most popular way of sharing result of a research. Contrary to this phenomenon, researchers in arts & humanities and social categories use different document types to share their findings such as letters, scripts, TV and radio reviews etc. In order to normalize these differences, number of total documents published by an institution within previous five years is used to measure continuing academic performance. Document types indexed by ISI - Web of Knowledge are listed in Table 3.1.

3.1.2.3 Cumulative Journal Impact

One of the most significant current discussions in scientometrics is about measuring the research impact of an academic unit using qualitative and / or quantitative indicators. Journal

Table 3.1: Document types indexed by ISI.

Article	Meeting Abstract
Art Exhibit Review	Meeting Summary
Bibliography	Meeting-Abstract
Biographical-Item	Music Performance Review
Book Review	Music Score
Chronology	Music Score Review
Correction	News Item
Correction, Addition	Note
Dance Performance Review	Poetry
Database Review	Proceedings Paper
Discussion	Record Review
Editorial Material	Reprint
Excerpt	Review
Fiction, Creative Prose	Script
Film Review	Software Review
Hardware Review	TV Review, Radio Review
Item About An Individual	TV Review, Radio Review, Video Review
Letter	Theatre Review

Impact Total is designed to include both qualitative and quantitative metrics to measure an academic units' research impact. It is calculated by aggregating the multiplication of article count and impact factor of journals where the articles published. This calculation is based on data from the last five years.

Journal Impact Total is calculated with the following formula;

$$CJI = \sum_{i=0}^n (\text{Impact Factor of Journal } i) \times (\text{Number of Articles in Journal } i)$$

where;

n is the number of journals in which an academic unit published articles.

An example calculation of Cumulative Journal Impact of University X for one year is given in Table 3.2.

Table 3.2: Example calculation of Cumulative Journal Impact for University X for one year.

Journal	Impact Factor	Number of Articles	Journal Impact
Journal A	1	120	120
Journal B	4	5	20
Journal C	2.5	50	125
Journal D	3	10	30
		Cumulative Journal Impact	295

3.1.2.4 Citation Count

Citation count is one of the most used academic impact metrics in scientometrics. In this study, it is used to measure sustainability of the quality of an academic output and calculated by aggregating total citations received in previous year for the articles published within last five years. In order to increase the objectivity of this indicator, total citations counts were calculated after excluding self-citations. Table 3.3 indicates the calculation of citation count for Institution X for the year 2010.

Table 3.3: Example calculation of Citation Count for University X for the year 2010.

Year	Citation Count
2006	2000
2007	1800
2008	2400
2009	2250
2010	2500
TOTAL	10950

3.1.2.5 H-Index

In this study, as indicated in section 2.2.5, H-Index was used to measure research impact of an institution. For a more robust result, average of the last 5 years' H-Index values were taken into consideration. In this context, average of H-Index values belong to the years 2006, 2007, 2008, 2009 and 2010 was included into scoring.

3.1.3 Data Collection

In order to collect required indicator data, the infrastructure used in URAP system have been updated for field based evaluation of the universities. With the purpose of eliminating human oriented errors, most of the data collection process have been done programmatically except the preparation of the institutions list. This problem will be discussed in the limitations section.

Details of phases and tools used in data collection phase are given in the following subsections.

3.1.3.1 Tools

This part describes the tools used in data collection process.

- **Microsoft Excel with VBA**

In this study, Microsoft Excel VBA was used as a programming environment and data storage tool. Dynamic scripts that automatizes web crawling tool were generated by Microsoft Excel VBA environment. The data obtained at the end of crawling process was also stored on Microsoft Excel.

- **Imacros Web Scripting Tool**

Imacros Scripting Edition is a data extraction tool developed by iOpus Inc. that allows user to record and iterate repetitious jobs. The biggest advantage of the Imacros in terms of usability is that it's scripts can be embedded in a programming environment such as VBA or vb.NET. This provides a great benefit during the data collection and storage.

3.1.3.2 Phases

In this part of the study, stages of data collection process will be discussed.

- **List of Institutions**

The list of institutions within the scope of this study was taken from URAP World 2010 ranking. In order to collect indicator data accurately, the list was updated by insertion of new name alternatives and abbreviations of the universities.

- **Indicator Based Data Collection**

After obtaining the updated list of the universities, indicator based data collection process has been done in 6 fields. All of the indicator data was collected from ISI - Web of Knowledge programmatically by the help of technologies mentioned in section 3.1.3.1. In this phase, database search queries were generated by a software developed in Microsoft Excel VBA. Subsequently, embedded Imacros scripts for web automation in the software were run.

- **Error Detection and Correction**

Even all of the required indicator data was collected programmatically, some errors encountered in the raw data. The main reasons of these errors are interruption of internet connectivity and problems caused by ISI - Web of Knowledge system. In case of an error, related piece of data was flagged according to type of the problem. Later on, the software scans all the data for flags and re-run the related scripts to collect missed data again.

3.1.4 Weighting & Scoring

The statistical tests presented in Chapter 4 shows that distribution of indicator data is not normal. Existence of outliers in the raw data makes linear scoring disadvantageous to rest of the universities. Because of this reason, scoring of all indicator values were calculated according to the median. In this sense, indicator values above and below the median are linearly scored in two groups. Maximum value of each indicator was scaled to 100 and weights of the indicators were arranged as follows;

3.2 Limitations

There have been some limitations in the data collection phase of the study. The sharpest encountered limitation in that phase was originated from constraints of ISI - Web of Knowledge.

Table 3.4: Weights of Indicators

Indicator	Weight(%)
JIT	18
Article	28
Total Document	13
H-Index	18
Citation	23

The system's citation report is limited for maximum 10.000 documents. In order to solve this problem, indicator values were collected for each year separately.

Another limitation encountered in data collection phase was the multitude of name alternatives of the institutions. In case of ignoring this problem, indicator data of the institutions can be collected incorrectly and this situation affects the ranking of universities directly. As an example, "Middle East Technical University" has lots of alternatives such as "METU", "Middle East Tech Univ", "ODTU" and "Orta Dogu Teknik Universitesi". In order to overcome this problem 11 alternative names and abbreviations of the institutions were included into the query strings.

The similarity between institution names is another key-point in data collection phase. This problem was solved by taking location information of the institution into account. City or country names where the universities located were included into the query strings.

CHAPTER 4

STATISTICAL ANALYSIS & RESULTS

This section of the study consists of two parts. In the first part, descriptive statistical analysis of raw indicator data is presented to demonstrate the variation of indicators between the fields. The last part involves a benchmarking analysis that presents the status of evaluated institutions in terms of overall and field based academic performance.

4.1 Descriptive Statistics & Analysis

Firstly in this sub-section, descriptive statistics of collected data is presented to summarize quantitative features of each indicator. In order to describe main characteristics of the data ideally, they were grouped within 6 field categories.

Descriptive statistical analysis given in Tables 4.1 to 4.6 clearly demonstrates the differences between fields according to the indicators used in this study. According to the analysis, average journal impact total value of AGE is 472.52 where the same indicator values in MED, ENG, LIFE, SCI and SOC are 1938.36, 643.50, 1999.75, 3001.82, 300.99, respectively. This difference is directly related to the number of articles produced in the field and impact factors of the journals where the articles published. From the point of average article counts published in each field, AGE spearheads with 319.47. Besides, average article counts of MED, ENG, LIFE, SCI and SOC are 122.53, 88.63, 115.22, 220.38, 62.61, respectively. The variation between these two indicators clearly indicates the diversity of journal impact factors in different fields. In terms of total document count per institution, another indicator of scientific productivity, SCI takes the first place with 1258.63 and MED, ENG, LIFE, SOC, AGE follow it with 910.18, 822.47, 705.19, 396.81 and 235.84, respectively.

Table 4.1: Descriptive statistics of AGE raw indicator data.

	N	Range	Min	Max	Mean		Median	Std. Dev.	Variance	Skewness	Kurtosis	Kolmogorov-Smirnova		Shapiro-Wilk	
	Statistic	Statistic	Statistic	Statistic	Statistic	Std. Err.	Statistic	Statistic	Statistic	Statistic	Statistic	Statistic	Sig.	Statistic	Sig.
Journal Impact Total	2000	10262.92	0.00	10262.92	472.52	18.45	164.65	825.08	680761.24	4.06	24.39	.283	.000	.564	.000
Article Count	2000	6909.50	0.00	6909.50	319.47	12.37	123.80	553.29	306128.55	4.54	31.70	.282	.000	.551	.000
Total Document	2000	5692.33	0.00	5692.33	235.84	9.88	82.08	441.80	195185.68	4.94	36.44	.297	.000	.515	.000
H-Index	2000	26.00	0.00	26.00	6.46	0.10	5.40	4.66	21.68	1.01	0.74	.099	.000	.926	.000
Citation Count	2000	10774.00	0.00	10774.00	520.97	20.16	184.00	901.47	812647.02	3.87	21.71	.282	.000	.573	.000

Table 4.2: Descriptive statistics of MED raw indicator data.

	N	Range	Min	Max	Mean		Median	Std. Dev.	Variance	Skewness	Kurtosis	Kolmogorov-Smirnova		Shapiro-Wilk	
	Statistic	Statistic	Statistic	Statistic	Statistic	Std. Err.	Statistic	Statistic	Statistic	Statistic	Statistic	Statistic	Sig.	Statistic	Sig.
Journal Impact Total	2000	107867.58	0.00	107867.58	1938.36	117.60	205.38	5259.27	27659907.85	7.54	101.64	.356	.000	.564	.000
Article Count	2000	3609.08	0.00	3609.08	122.53	5.69	21.62	254.54	64789.16	4.38	30.57	.315	.000	.551	.000
Total Document	2000	27704.33	0.00	27704.33	910.18	44.57	148.71	1993.29	3973211.57	4.64	32.78	.324	.000	.515	.000
H-Index	2000	74.80	0.00	74.80	8.60	0.21	5.20	9.47	89.59	1.99	4.86	.182	.000	.926	.000
Citation Count	2000	84715.00	0.00	84715.00	1625.58	99.17	180.00	4435.17	19670752.30	6.94	81.97	.357	.000	.573	.000

Table 4.3: Descriptive statistics of ENG raw indicator data.

	N	Range	Min	Max	Mean		Median	Std. Dev.	Variance	Skewness	Kurtosis	Kolmogorov-Smirnova		Shapiro-Wilk	
	Statistic	Statistic	Statistic	Statistic	Statistic	Std. Err.	Statistic	Statistic	Statistic	Statistic	Statistic	Statistic	Sig.	Statistic	Sig.
Journal Impact Total	2000	11048.32	0.00	11048.32	643.50	24.79	242.15	1108.74	1229293.33	3.86	19.94	.281	.000	.567	.000
Article Count	2000	1510.83	0.00	1510.83	88.63	3.13	36.75	140.16	19644.96	3.58	18.26	.264	.000	.609	.000
Total Document	2000	13616.00	0.00	13616.00	822.47	28.55	346.50	1277.00	1630736.84	3.35	15.97	.260	.000	.626	.000
H-Index	2000	35.80	0.00	35.80	7.44	0.12	6.40	5.35	28.57	1.24	2.02	.095	.000	.913	.000
Citation Count	2000	13563.00	0.00	13563.00	730.16	29.93	258.50	1338.46	1791469.80	4.18	23.57	.293	.000	.538	.000

Table 4.4: Descriptive statistics of LIFE raw indicator data.

	N	Range	Min	Max	Mean		Median	Std. Dev.	Variance	Skewness	Kurtosis	Kolmogorov-Smirnova		Shapiro-Wilk	
	Statistic	Statistic	Statistic	Statistic	Statistic	Std. Err.	Statistic	Statistic	Statistic	Statistic	Statistic	Statistic	Sig.	Statistic	Sig.
Journal Impact Total	2000	91841.35	0.00	91841.35	1999.75	103.73	425.57	4638.98	21520147.39	6.75	84.55	.333	.000	.434	.000
Article Count	2000	3014.25	0.00	3014.25	115.22	4.60	37.71	205.53	42243.01	4.25	30.48	.288	.000	.559	.000
Total Document	2000	18851.33	0.00	18851.33	705.19	29.28	205.63	1309.56	1714935.87	4.32	30.28	.295	.000	.542	.000
H-Index	2000	82.00	0.00	82.00	10.20	0.20	7.80	8.83	77.96	1.86	5.29	.127	.000	.842	.000
Citation Count	2000	81560.00	0.00	81560.00	1733.19	91.64	364.00	4098.48	16797545.34	6.88	86.83	.336	.000	.425	.000

Table 4.5: Descriptive statistics of SCI raw indicator data.

	N	Range	Min	Max	Mean		Median	Std. Dev.	Variance	Skewness	Kurtosis	Kolmogorov-Smirnova		Shapiro-Wilk	
	Statistic	Statistic	Statistic	Statistic	Statistic	Std. Err.	Statistic	Statistic	Statistic	Statistic	Statistic	Statistic	Sig.	Statistic	Sig.
Journal Impact Total	2000	64920.34	1.04	64921.38	3001.82	128.40	875.65	5742.41	32975216.14	4.45	28.58	.301	.000	.522	.000
Article Count	2000	2994.00	0.00	2994.00	220.39	7.21	93.63	322.32	103890.99	3.07	12.65	.247	.000	.646	.000
Total Document	2000	18940.92	0.83	18941.75	1258.63	41.61	536.33	1861.04	3463454.88	3.21	14.41	.250	.000	.640	.000
H-Index	2000	79.40	0.00	79.40	12.98	0.22	10.20	9.86	97.21	1.76	4.31	.140	.000	.849	.000
Citation Count	2000	62380.00	0.00	62380.00	2478.88	110.21	710.50	4928.71	24292153.27	4.89	35.22	.308	.000	.498	.000

Table 4.6: Descriptive statistics of SOC raw indicator data.

	N	Range	Min	Max	Mean		Median	Std. Dev.	Variance	Skewness	Kurtosis	Kolmogorov-Smirnova		Shapiro-Wilk	
	Statistic	Statistic	Statistic	Statistic	Statistic	Std. Err.	Statistic	Statistic	Statistic	Statistic	Statistic	Statistic	Sig.	Statistic	Sig.
Journal Impact Total	2000	11524.75	0.00	11524.75	300.99	15.09	79.10	674.70	455219.08	5.88	56.80	.328	.000	.445	.000
Article Count	2000	1259.25	0.00	1259.25	62.61	2.44	22.50	109.13	11909.21	3.69	18.87	.283	.000	.574	.000
Total Document	2000	7627.84	0.00	7627.84	396.81	15.44	148.96	690.53	476826.66	3.65	17.63	.283	.000	.570	.000
H-Index	2000	29.60	0.00	29.60	4.48	0.09	3.40	3.86	14.88	1.56	3.13	.133	.000	.867	.000
Citation Count	2000	13891.00	0.00	13891.00	326.71	17.14	78.00	766.44	587431.77	6.38	68.65	.335	.000	.426	.000

However, when the highest values of total document counts are analyzed for each field, it has been seen that MED with 27704.33 documents gets ahead of SCI that it has 18941.75 scientific documents. Scattered indicator values of the universities cause such a situation so that Kurtosis rates presented in descriptive statistics tables confirm this claim.

Furthermore, descriptive analysis of the data gives an idea about the citation behaviours of the fields. Average H-Index values of the fields show that, 12.98 articles were cited at least 12.98 times in SCI. On the other hand, average H-Index value of the SOC is 4.48 and this variation between two fields is evident when the data is analyzed from the point of mean value of total citations.

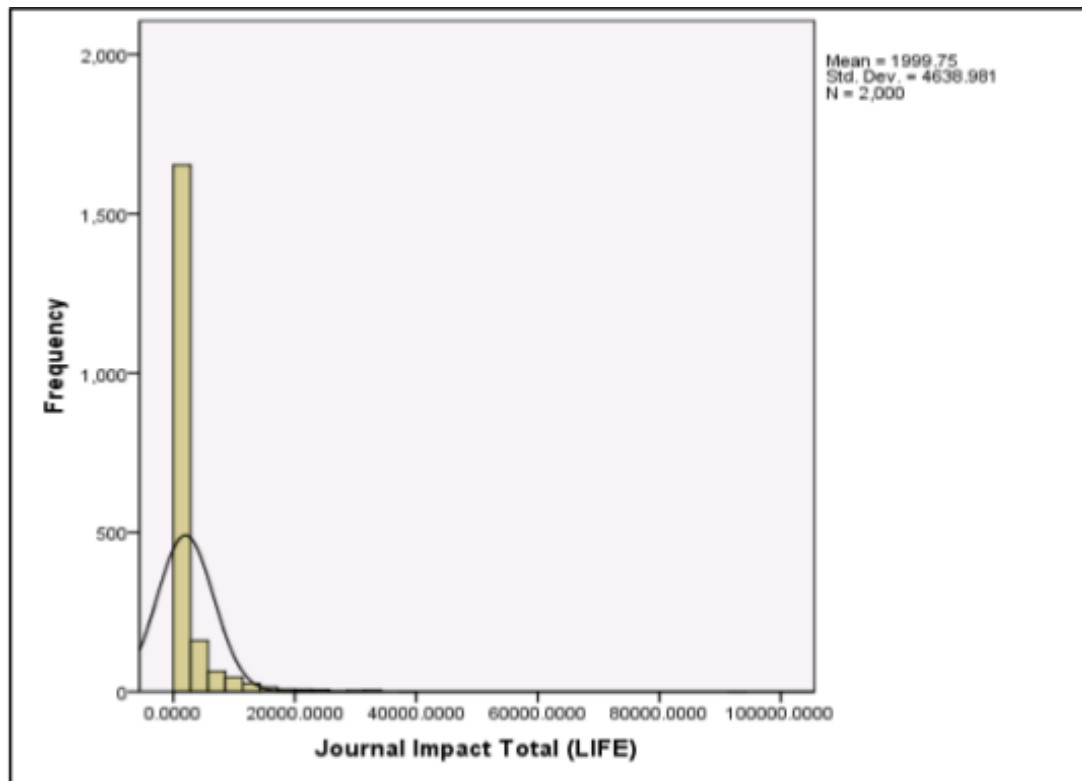


Figure 4.1: Histogram of JIT raw indicator data.

Normality tests are other key-points that describes the characteristics of the data. Results of Kolmogorov-Smirnov and Shapiro-Wilk tests show that distribution of any data group is not normal. In order to demonstrate right skewed pattern of the data, Figure 4.1 and 4.2 presents samples that show histogram of JIT in LIFE and detrended normal Q-Q plot of the same data group. This situation has played a crucial role on determination of the scoring method. Existence of outliers in data sets resulted in usage of median values while scoring

the indicators.

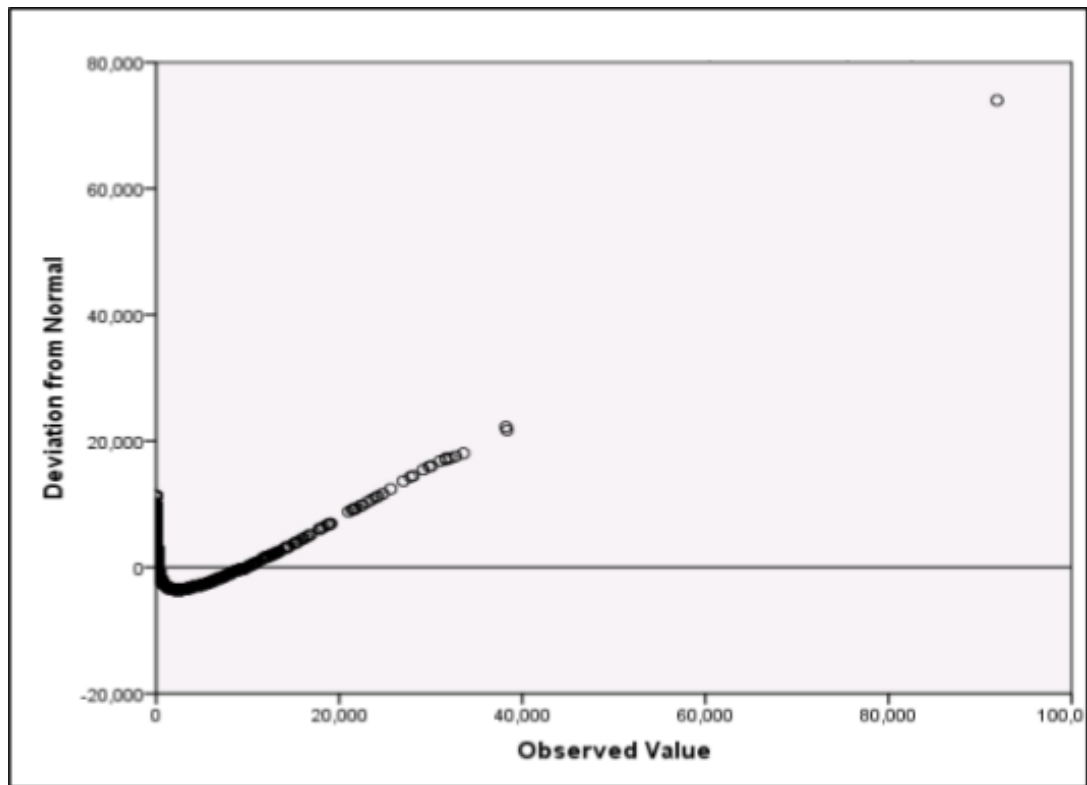


Figure 4.2: Detrended normal Q-Q plot of JIT raw indicator data.

According to Figure 4.2, Harvard University takes the first place with 91841.35 and University of California San Francisco follows it with 38332.04. Such differences make the usage of median values in scoring more meaningful.

Differences between fields in terms of highest indicator values can be seen clearly in Figures 4.3 to 4.12. In these figures, highest indicator values and ranking of universities according to that indicators are presented. It is obviously seen that MED has the highest indicator values except H-Index. From the point of AGE, it shows minimum performance in terms of quantitative values of the indicators. These findings claim that evaluation of universities according to the overall performance criteria gives missing information about the institutions.

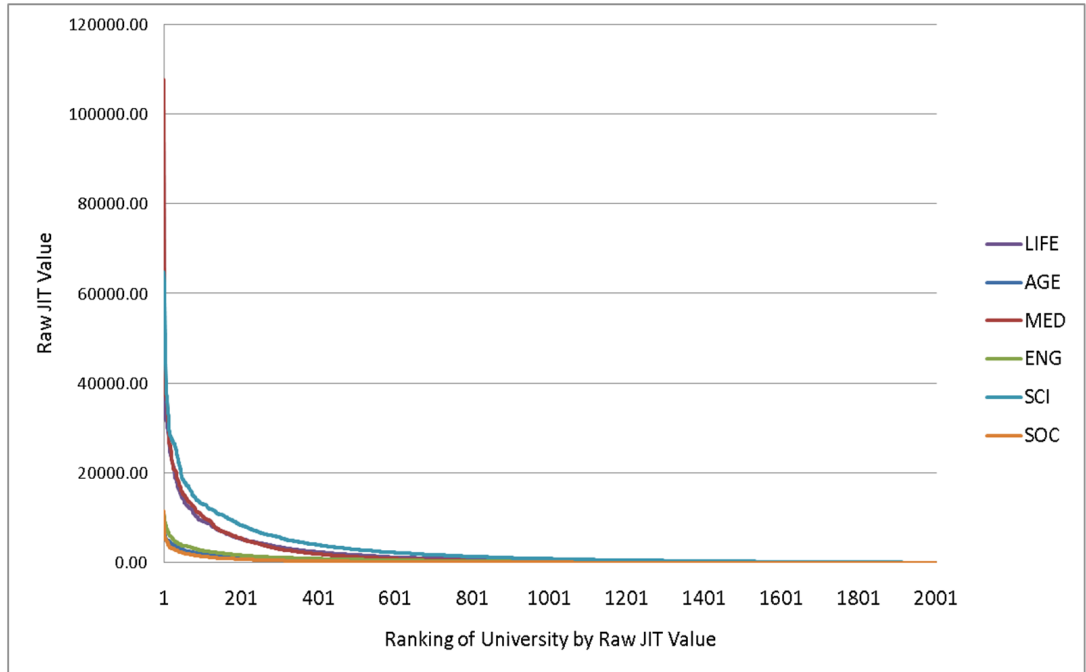


Figure 4.3: Distribution of raw JIT data with respect to fields.

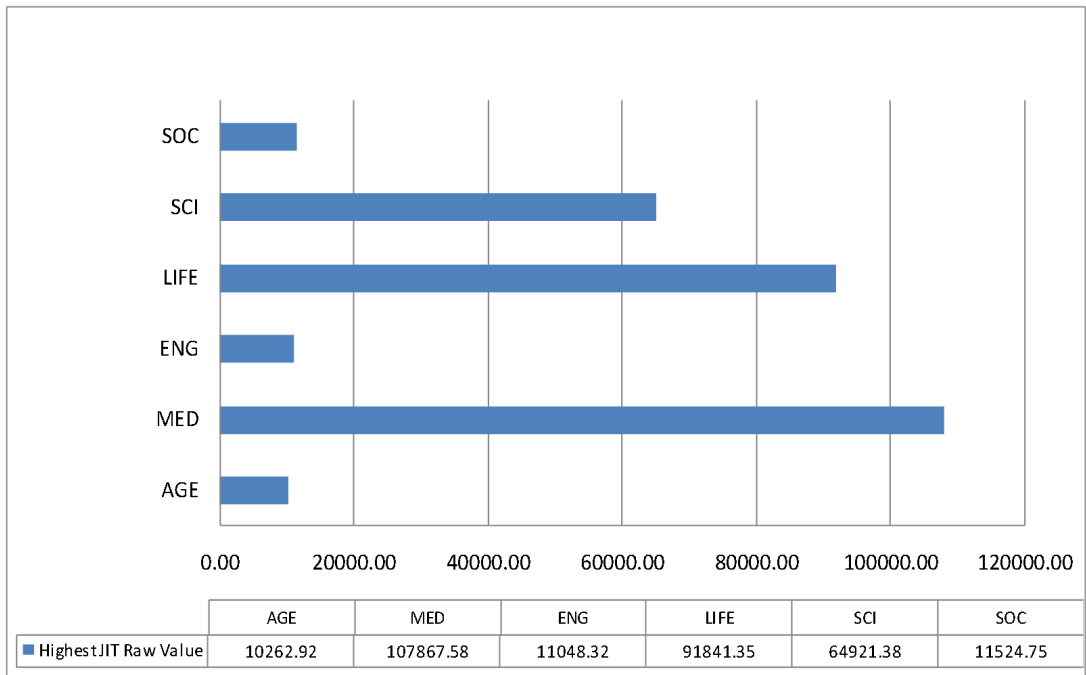


Figure 4.4: Highest JIT values in fields.

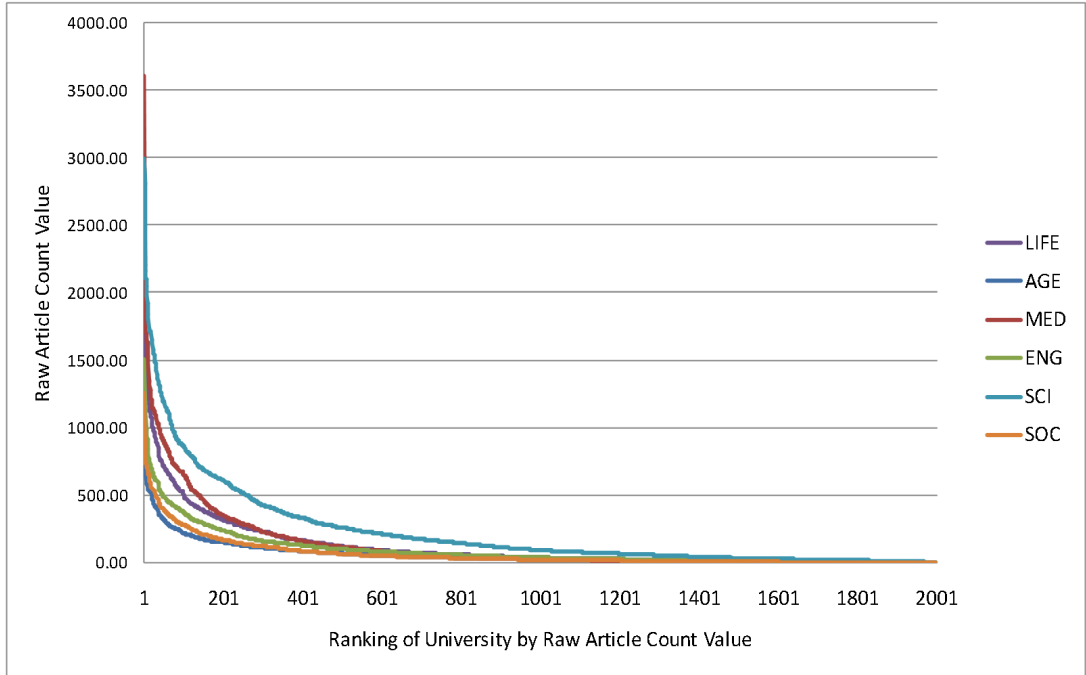


Figure 4.5: Distribution of raw Article Count data with respect to fields.

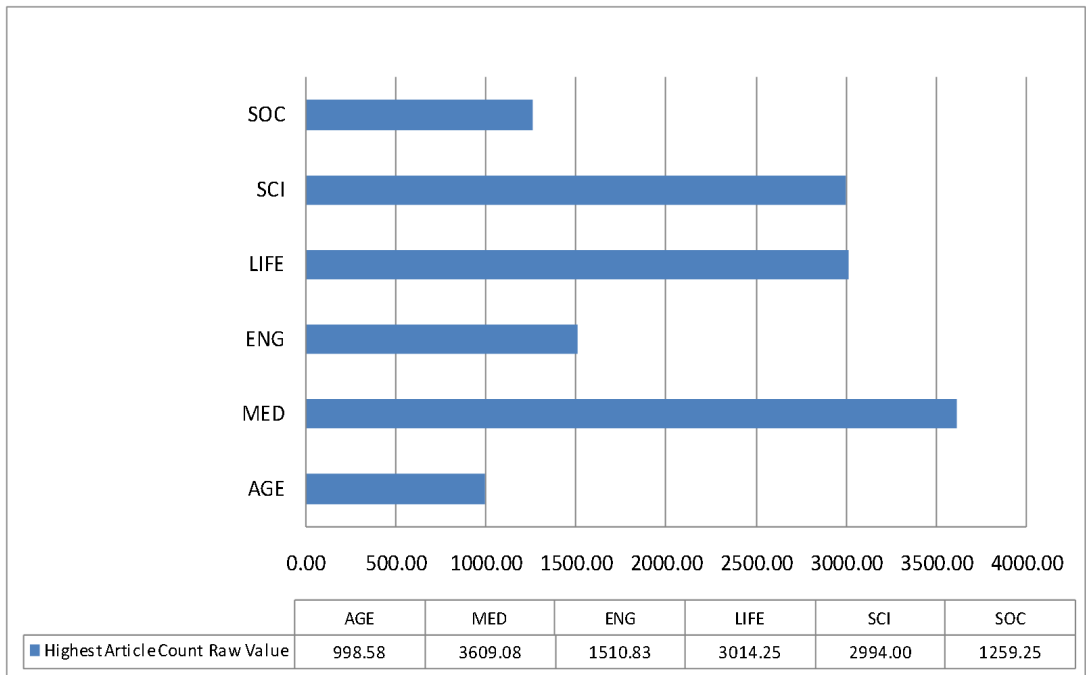


Figure 4.6: Highest Article Count values in fields.

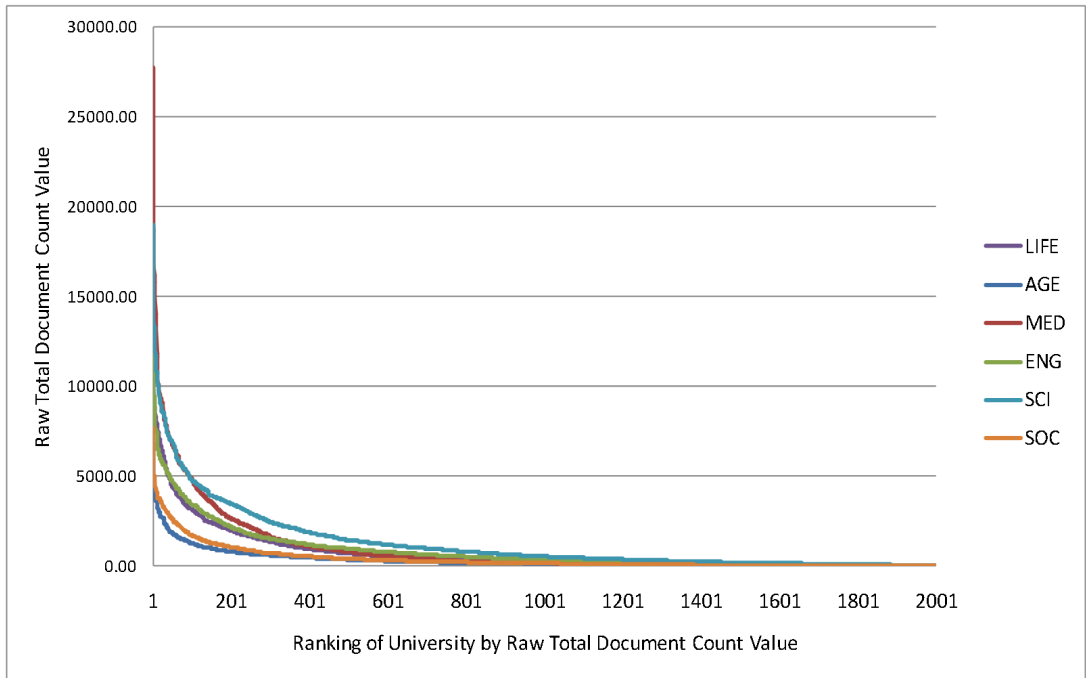


Figure 4.7: Distribution of raw Total Document Count data with respect to fields.

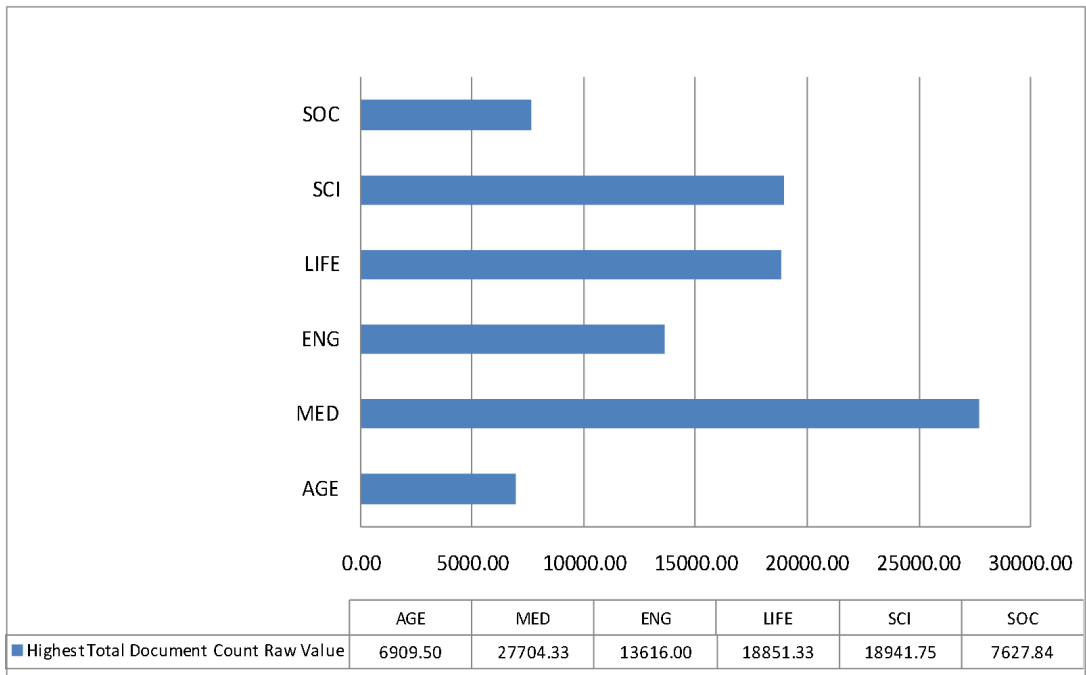


Figure 4.8: Highest Total Document Count values in fields.

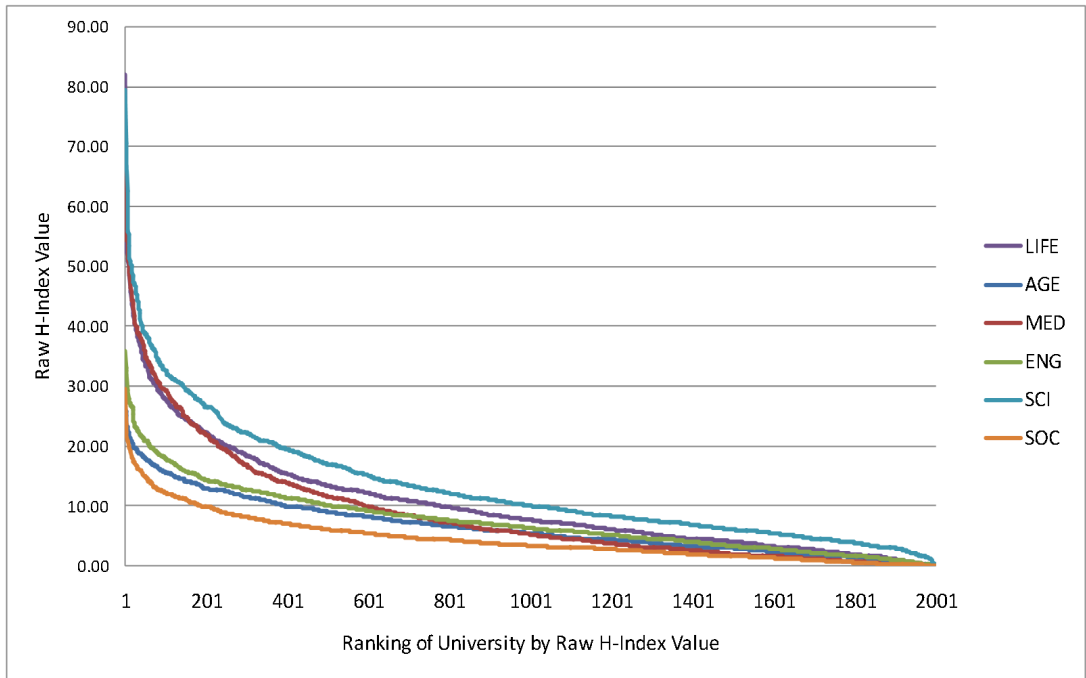


Figure 4.9: Distribution of raw H-Index data with respect to fields.

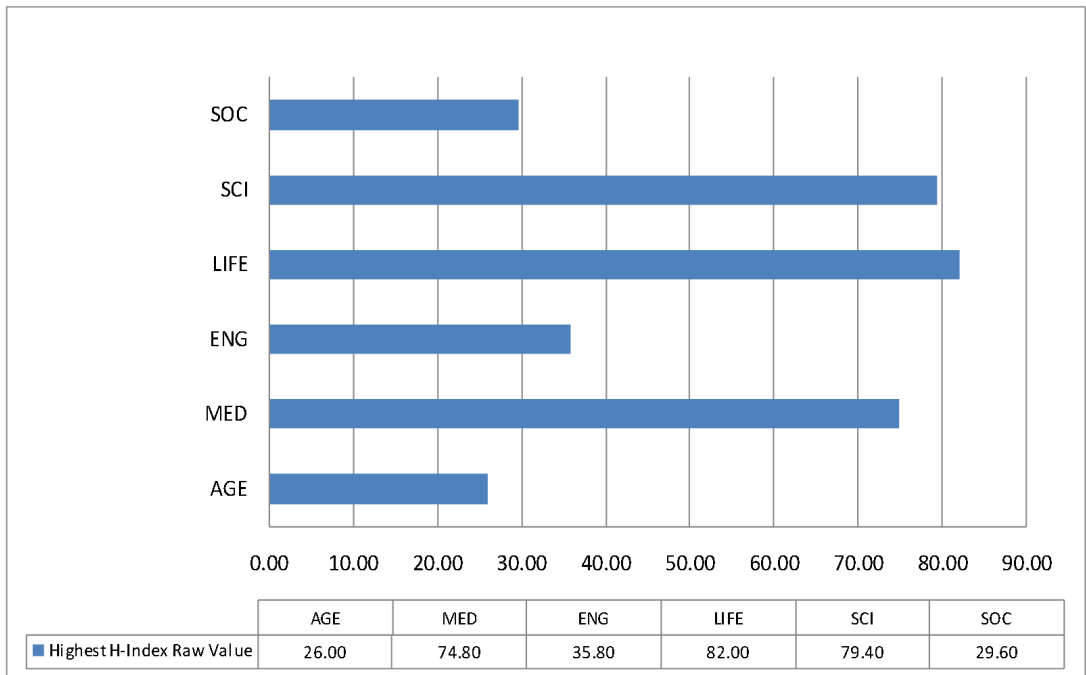


Figure 4.10: Highest H-Index values in fields.

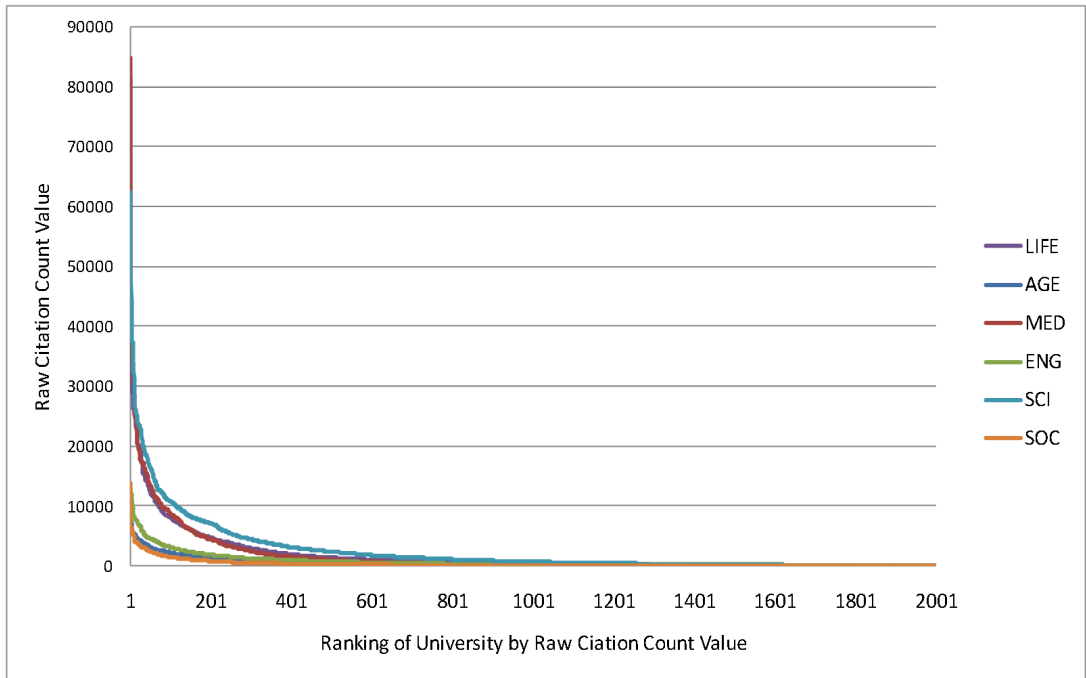


Figure 4.11: Distribution of raw Total Citation Count data with respect to fields.

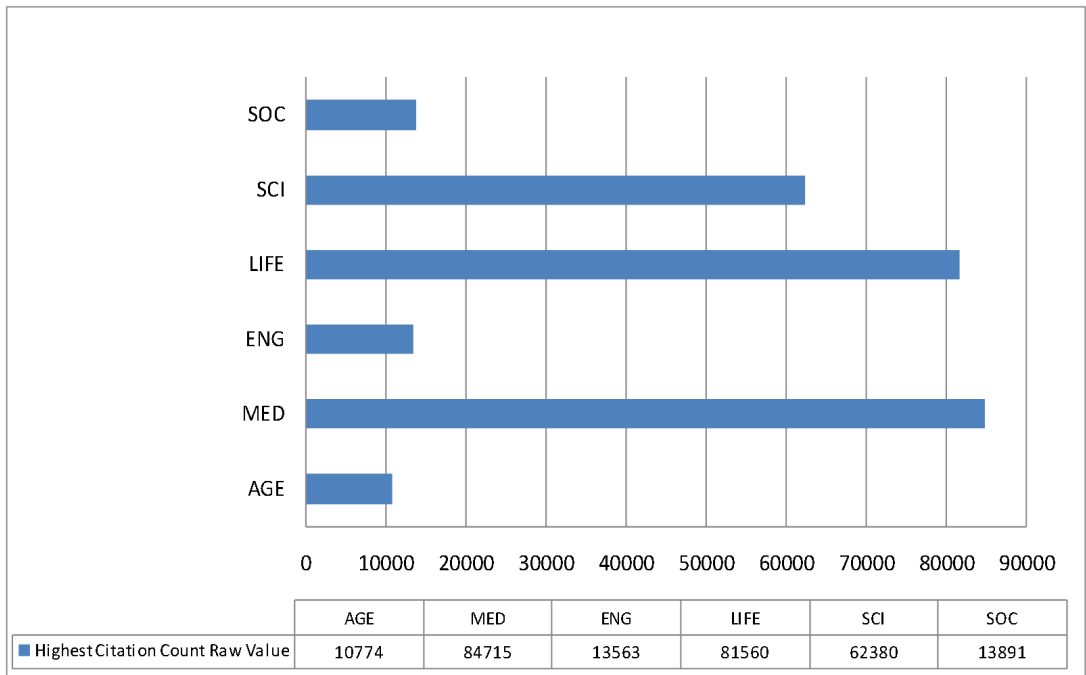


Figure 4.12: Highest Total Citation Count values in fields.

4.2 Comparison of the Results with URAP World 2010

In order to view benchmarking of the results, top 10 universities from each category are compared with their rankings in URAP World 2010. During the comparison, Spearman's rank order correlation coefficient (ρ) was used to indicate correlations between these two rankings. According to the definition of Spearman's coefficient, correlation of +1 or -1 occurs when each of the variables match others perfectly.

Table 4.7: List of Top 10 universities in AGE and their status in URAP World 2010.

University	AGE	URAP World
University of California Davis	1	29
University of Florida	2	34
Cornell University	3	21
University of Wisconsin Madison	4	23
University of California Berkeley	5	6
University of Georgia	6	170
Michigan State University	7	90
Universidade de Sao Paulo	8	37
Ghent University	9	95
University of Queensland	10	59

Table 4.7 presents the list of top 10 universities in AGE field based ranking and their status in URAP World 2010.

Table 4.8: Results of Spearman's rank order correlation for AGE ranking and URAP World 2010.

			AGE	URAP
Spearman's rho	AGE	Correlation Coefficient	1.000	.600
		Sig. (2-tailed)	.	.067
		N	10	10
URAP	URAP	Correlation Coefficient	.600	1.000
		Sig. (2-tailed)	.067	.
		N	10	10

According to Table 4.8, ρ of these two rankings is 0.60, so there is no significant correlation between them. University of Georgia is a good example for this result, its performance growth in AGE field is conspicuous.

The same situation is valid for ranking of universities in field of MED. Table 4.9 presents the

Table 4.9: List of Top 10 universities in MED and their status in URAP World 2010.

University	MED	URAP World
Harvard University	1	1
Johns Hopkins University	2	2
University of California San Francisco	3	18
University of Toronto	4	3
University of Pennsylvania	5	12
University of Pittsburgh	6	25
University of Washington Seattle	7	5
University of California Los Angeles	8	7
University of Michigan Ann Arbor	9	9
Duke University	10	19

Table 4.10: Results of Spearman's rank order correlation for MED ranking and URAP World 2010.

	MED	URAP
Spearman's rho	1.000	.552
Correlation Coefficient		
Sig. (2-tailed)	.	.098
N	10	10
URAP	.552	1.000
Correlation Coefficient		
Sig. (2-tailed)	.098	.
N	10	10

list of top 10 universities in MED field and their rankings in URAP. According to Table 4.10, ρ of these two rankings is 0.55, so there is no significant correlation between these two.

Table 4.11: List of Top 10 universities in ENG and their status in URAP World 2010.

University	ENG	URAP World
Tsinghua University China	1	81
National University of Singapore	2	49
University of California Berkeley	3	6
Massachusetts Institute of Technology	4	13
Nanyang Technological University	5	150
Georgia Institute of Technology	6	124
Zhejiang University	7	66
Shanghai Jiao Tong University	8	105
Harbin Institute of Technology	9	263
Stanford University	10	4

When the results are analyzed in terms of ENG vs URAP World 2010, its clearly seen that Tsinghua University China and National University of Singapore are dominant in the field

Table 4.12: Results of Spearman's rank order correlation for ENG ranking and URAP World 2010.

			ENG	URAP
Spearman's rho	ENG	Correlation Coefficient	1.000	.164
		Sig. (2-tailed)	.	.651
		N	10	10
	URAP	Correlation Coefficient	.164	1.000
		Sig. (2-tailed)	.651	.
		N	10	10

of engineering. Table 4.12 indicates that ρ of these two rankings is 0.164, so there is no significant correlation between two rankings.

Table 4.13: List of Top 10 universities in LIFE and their status in URAP World 2010.

University	LIFE	URAP World
Tsinghua University China	1	81
National University of Singapore	2	49
University of California Berkeley	3	6
Massachusetts Institute of Technology	4	13
Nanyang Technological University	5	150
Georgia Institute of Technology	6	124
Zhejiang University	7	66
Shanghai Jiao Tong University	8	105
Harbin Institute of Technology	9	263
Stanford University	10	4

Table 4.14: Results of Spearman's rank order correlation for LIFE ranking and URAP World 2010.

			LIFE	URAP
Spearman's rho	LIFE	Correlation Coefficient	1.000	.413
		Sig. (2-tailed)	.	.235
		N	10	10
	URAP	Correlation Coefficient	.413	1.000
		Sig. (2-tailed)	.235	.
		N	10	10

List of top 10 universities in LIFE field ranking and their status in URAP World 2010 is presented in Table 4.13. Table 4.14 shows that correlation of these two rankings is 0.41. It is not possible say that there is a match between two rankings.

Table 4.15: List of Top 10 universities in SCI and their status in URAP World 2010.

University	SCI	URAP World
University of California Berkeley	1	6
Harvard University	2	1
University of Tokyo	3	10
Massachusetts Institute of Technology	4	13
California Institute of Technology Caltech	5	41
Stanford University	6	4
University of Cambridge	7	11
University of Oxford	8	8
Kyoto University	9	26
University of California Los Angeles	10	7

Table 4.16: Results of Spearman's rank order correlation for SCI ranking and URAP World 2010.

			SCI	URAP
Spearman's rho	SCI	Correlation Coefficient	1.000	.297
		Sig. (2-tailed)	.	.405
		N	10	10
	URAP	Correlation Coefficient	.297	1.000
		Sig. (2-tailed)	.405	.
		N	10	10

Comparison of the same universities in terms of academic performance rankings in SCI and URAP World 2010 shows that correlation coefficient of two lists is 0.297. This result also shows the difference between field based and overall academic performances of the universities.

Table 4.17: List of Top 10 universities in SOC and their status in URAP World 2010.

University	SOC	URAP World
Harvard University	1	1
University of Michigan Ann Arbor	2	9
Columbia University New York	3	14
University of North Carolina Chapel Hill	4	31
University of Toronto	5	3
University of Washington Seattle	6	5
University of California Los Angeles	7	7
University of Pennsylvania	8	12
University of California Berkeley	9	6
Johns Hopkins University	10	2

Table 4.18: Results of Spearman's rank order correlation for SOC ranking and URAP World 2010.

			SOC	URAP
Spearman's rho	SOC	Correlation Coefficient	1.000	-.127
		Sig. (2-tailed)	.	.726
		N	10	10
	URAP	Correlation Coefficient	-.127	1.000
		Sig. (2-tailed)	.726	.
		N	10	10

The same difference is valid for ranking of universities in field of SOC. Table 4.17 presents the list of top 10 universities in SOC and their rankings in URAP World 2010. According to Table 4.18, ρ of these two rankings is -0.127.

Above tables and statistical tests show that academic performances of the universities show variations according to the fields.

Ranking lists of top 100 universities in each field are given in Appendix B. Full lists containing ranking of 2000 universities in each field are available as a pdf document separately in a compact disc media.

CHAPTER 5

CONCLUSIONS AND FUTURE WORK

This chapter of the study is composed of two sections. In the first section, results of implemented framework will be discussed. In the following part, future work of the study will be mentioned.

5.1 Conclusions of the Results

The main assertion of this study is to demonstrate that academic performances of the universities vary depending on research fields where the members of universities actively study on. In this sense, 2000 world universities all around the world has been evaluated according to 5 academic performance criteria in 6 research fields. The institutions within the scope of this study were ranked previously in 2010 by URAP research laboratory in terms of overall academic performance criteria.

If the results are analysed on the basis of indicator values, it's clearly seen that there are significant differences between fields. Especially, Journal Impact Total value of fields present this variation clearly. Additionally, the results indicate that citation culture of the fields differs conspicuously. Affect of different citation cultures of the fields is perceived on H-Index values.

Then again, in correlation with previous studies, it has been observed that some universities could be classified as an outlier with respect to their indicator values. This non-standard distribution can emanate from Kurtosis values, which are presented in previous chapter.

The ranking presented in this study is shown to be non-correlated with URAP 2010 results

when Spearman's rank correlation test is applied. This dissimilarity could be clearly seen in top 10 universities in each field respectively.

5.2 Future Work

Within the scope of this work, some methodological improvements are ought to be essential for further analysis to attain more robust and objective results. Some of these improvements will be elaborated below.

It should be kept in mind that focus of this piece of work is still broad. For instance, finer ranking methods could be devised to overlay a more detailed investigation. The proposed ranking methodology is to rank universities over subject areas rather than a field based ranking.

Moreover, the collection of the universities that are involved in this study should be increased. Such an increase in the number of ranked universities will be clearly helpful in increasing the reliability and comprehensiveness of the results. Notably, ranking would be publicly more informative as the number of universities involved increases. This improvement would extend the range of data that is going to be analysed. Therefore, a crucial need for development of novel non-correlated indicators would be essential. Specifically, correlation between the indicators must be specified explicitly and identified correlations would be separated and reduced down to independent indicators.

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APPENDIX A

List of Subjects, Subject Categories and Related Fields

Table A.1: List of Subjects, Subject Categories and Related Fields

SUBJECT	SUBJECT CATEGORY	FIELD
Agricultural Economics & Policy	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Agricultural Engineering	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Agriculture, Dairy & Animal Science	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Agriculture, Multidisciplinary	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Agronomy	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Food Science & Technology	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Horticulture	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Nutrition & Dietetics	Agricultural Sciences	Agriculture & Environmental Sciences (AGE)
Biodiversity Conservation	Environment/Ecology	Agriculture & Environmental Sciences (AGE)
Ecology	Environment/Ecology	Agriculture & Environmental Sciences (AGE)
Environmental Sciences	Environment/Ecology	Agriculture & Environmental Sciences (AGE)
Water Resources	Environment/Ecology	Agriculture & Environmental Sciences (AGE)

Entomology	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Fisheries	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Forestry	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Marine & Freshwater Biology	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Mycology	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Ornithology	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Plant Sciences	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Veterinary Sciences	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Zoology	Plant & Animal Science	Agriculture & Environmental Sciences (AGE)
Anthropology	Arts & Humanities	Arts & Humanities (AHCI)
Archaeology	Arts & Humanities	Arts & Humanities (AHCI)
Architecture	Arts & Humanities	Arts & Humanities (AHCI)
Art	Arts & Humanities	Arts & Humanities (AHCI)
Classics	Arts & Humanities	Arts & Humanities (AHCI)
Cultural Studies	Arts & Humanities	Arts & Humanities (AHCI)
Dance	Arts & Humanities	Arts & Humanities (AHCI)
History	Arts & Humanities	Arts & Humanities (AHCI)
History Of Social Sciences	Arts & Humanities	Arts & Humanities (AHCI)
Humanities, Multidisciplinary	Arts & Humanities	Arts & Humanities (AHCI)
Language & Linguistics	Arts & Humanities	Arts & Humanities (AHCI)
Linguistics	Arts & Humanities	Arts & Humanities (AHCI)
Literary Reviews	Arts & Humanities	Arts & Humanities (AHCI)
Literary Theory & Criticism	Arts & Humanities	Arts & Humanities (AHCI)
Literature	Arts & Humanities	Arts & Humanities (AHCI)
Literature, African, Australian, Canadian	Arts & Humanities	Arts & Humanities (AHCI)
Literature, American	Arts & Humanities	Arts & Humanities (AHCI)
Literature, British Isles	Arts & Humanities	Arts & Humanities (AHCI)
Literature, German, Dutch, Scandinavian	Arts & Humanities	Arts & Humanities (AHCI)
Literature, Romance	Arts & Humanities	Arts & Humanities (AHCI)
Literature, Slavic	Arts & Humanities	Arts & Humanities (AHCI)

Medieval & Renaissance Studies	Arts & Humanities	Arts & Humanities (AHCI)
Music	Arts & Humanities	Arts & Humanities (AHCI)
Philosophy	Arts & Humanities	Arts & Humanities (AHCI)
Poetry	Arts & Humanities	Arts & Humanities (AHCI)
Religion	Arts & Humanities	Arts & Humanities (AHCI)
Theater	Arts & Humanities	Arts & Humanities (AHCI)
Allergy	Clinical Medicine	Clinical Medicine (MED)
Andrology	Clinical Medicine	Clinical Medicine (MED)
Anesthesiology	Clinical Medicine	Clinical Medicine (MED)
Cardiac & Cardiovascular Systems	Clinical Medicine	Clinical Medicine (MED)
Clinical Neurology	Clinical Medicine	Clinical Medicine (MED)
Critical Care Medicine	Clinical Medicine	Clinical Medicine (MED)
Dentistry, Oral Surgery & Medicine	Clinical Medicine	Clinical Medicine (MED)
Dermatology	Clinical Medicine	Clinical Medicine (MED)
Emergency Medicine	Clinical Medicine	Clinical Medicine (MED)
Endocrinology & Metabolism	Clinical Medicine	Clinical Medicine (MED)
Gastroenterology & Hepatology	Clinical Medicine	Clinical Medicine (MED)
Geriatrics & Gerontology	Clinical Medicine	Clinical Medicine (MED)
Gerontology	Clinical Medicine	Clinical Medicine (MED)
Health Care Sciences & Services	Clinical Medicine	Clinical Medicine (MED)
Hematology	Clinical Medicine	Clinical Medicine (MED)
Imaging Science & Photographic Technology	Clinical Medicine	Clinical Medicine (MED)
Integrative & Complementary Medicine	Clinical Medicine	Clinical Medicine (MED)
Medical Ethics	Clinical Medicine	Clinical Medicine (MED)
Medical Informatics	Clinical Medicine	Clinical Medicine (MED)
Medical Laboratory Technology	Clinical Medicine	Clinical Medicine (MED)
Medicine, General & Internal	Clinical Medicine	Clinical Medicine (MED)
Medicine, Legal	Clinical Medicine	Clinical Medicine (MED)
Medicine, Research & Experimental	Clinical Medicine	Clinical Medicine (MED)
Nursing	Clinical Medicine	Clinical Medicine (MED)
Obstetrics & Gynecology	Clinical Medicine	Clinical Medicine (MED)
Oncology	Clinical Medicine	Clinical Medicine (MED)
Ophthalmology	Clinical Medicine	Clinical Medicine (MED)
Orthopedics	Clinical Medicine	Clinical Medicine (MED)
Otorhinolaryngology	Clinical Medicine	Clinical Medicine (MED)
Pediatrics	Clinical Medicine	Clinical Medicine (MED)
Peripheral Vascular Disease	Clinical Medicine	Clinical Medicine (MED)

Radiology, Nuclear Medicine & Medical Imaging	Clinical Medicine	Clinical Medicine (MED)
Rehabilitation	Clinical Medicine	Clinical Medicine (MED)
Respiratory System	Clinical Medicine	Clinical Medicine (MED)
Rheumatology	Clinical Medicine	Clinical Medicine (MED)
Surgery	Clinical Medicine	Clinical Medicine (MED)
Transplantation	Clinical Medicine	Clinical Medicine (MED)
Tropical Medicine	Clinical Medicine	Clinical Medicine (MED)
Urology & Nephrology	Clinical Medicine	Clinical Medicine (MED)
Psychiatry	Psychiatry	Clinical Medicine (MED)
Computer Science, Artificial Intelligence	Computer Science	Engineering, Computing & Technology (ENG)
Computer Science, Cybernetics	Computer Science	Engineering, Computing & Technology (ENG)
Computer Science, Hardware & Architecture	Computer Science	Engineering, Computing & Technology (ENG)
Computer Science, Information Systems	Computer Science	Engineering, Computing & Technology (ENG)
Computer Science, Interdisciplinary Applications	Computer Science	Engineering, Computing & Technology (ENG)
Computer Science, Software Engineering	Computer Science	Engineering, Computing & Technology (ENG)
Computer Science, Theory & Methods	Computer Science	Engineering, Computing & Technology (ENG)
Automation & Control Systems	Engineering	Engineering, Computing & Technology (ENG)
Construction & Building Technology	Engineering	Engineering, Computing & Technology (ENG)
Energy & Fuels	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Aerospace	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Biomedical	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Chemical	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Civil	Engineering	Engineering, Computing & Technology (ENG)

Engineering, Electrical & Electronic	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Environmental	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Geological	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Industrial	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Manufacturing	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Marine	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Mechanical	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Multidisciplinary	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Ocean	Engineering	Engineering, Computing & Technology (ENG)
Engineering, Petroleum	Engineering	Engineering, Computing & Technology (ENG)
Instruments & Instrumentation	Engineering	Engineering, Computing & Technology (ENG)
Mechanics	Engineering	Engineering, Computing & Technology (ENG)
Mining & Mineral Processing	Engineering	Engineering, Computing & Technology (ENG)
Robotics	Engineering	Engineering, Computing & Technology (ENG)
Telecommunications	Engineering	Engineering, Computing & Technology (ENG)
Thermodynamics	Engineering	Engineering, Computing & Technology (ENG)
Transportation	Engineering	Engineering, Computing & Technology (ENG)
Transportation Science & Technology	Engineering	Engineering, Computing & Technology (ENG)
Materials Science, Biomaterials	Materials Science	Engineering, Computing & Technology (ENG)

Materials Science, Ceramics	Materials Science	Engineering, Computing & Technology (ENG)
Materials Science, Characterization & Testing	Materials Science	Engineering, Computing & Technology (ENG)
Materials Science, Coatings & Films	Materials Science	Engineering, Computing & Technology (ENG)
Materials Science, Composites	Materials Science	Engineering, Computing & Technology (ENG)
Materials Science, Multidisciplinary	Materials Science	Engineering, Computing & Technology (ENG)
Materials Science, Paper & Wood	Materials Science	Engineering, Computing & Technology (ENG)
Materials Science, Textiles	Materials Science	Engineering, Computing & Technology (ENG)
Metallurgy & Metallurgical Engineering	Materials Science	Engineering, Computing & Technology (ENG)
Anatomy & Morphology	Biology & Biochemistry	Life Sciences (LIFE)
Biochemical Research Methods	Biology & Biochemistry	Life Sciences (LIFE)
Biology	Biology & Biochemistry	Life Sciences (LIFE)
Biophysics	Biology & Biochemistry	Life Sciences (LIFE)
Cell & Tissue Engineering	Biology & Biochemistry	Life Sciences (LIFE)
Evolutionary Biology	Biology & Biochemistry	Life Sciences (LIFE)
Mathematical & Computational Biology	Biology & Biochemistry	Life Sciences (LIFE)
Parasitology	Biology & Biochemistry	Life Sciences (LIFE)
Pathology	Biology & Biochemistry	Life Sciences (LIFE)
Physiology	Biology & Biochemistry	Life Sciences (LIFE)
Reproductive Biology	Biology & Biochemistry	Life Sciences (LIFE)
Immunology	Immunology	Life Sciences (LIFE)
Infectious Diseases	Immunology	Life Sciences (LIFE)
Virology	Immunology	Life Sciences (LIFE)
Biotechnology & Applied Microbiology	Microbiology	Life Sciences (LIFE)
Microbiology	Microbiology	Life Sciences (LIFE)
Microscopy	Microbiology	Life Sciences (LIFE)
Biochemistry & Molecular Biology	Molecular Biology & Genetics	Life Sciences (LIFE)
Cell Biology	Molecular Biology & Genetics	Life Sciences (LIFE)
Developmental Biology	Molecular Biology & Genetics	Life Sciences (LIFE)

Genetics & Heredity	Molecular Biology & Genetics	Life Sciences (LIFE)
Behavioral Sciences	Neuroscience & Behavior	Life Sciences (LIFE)
Neuroimaging	Neuroscience & Behavior	Life Sciences (LIFE)
Neurosciences	Neuroscience & Behavior	Life Sciences (LIFE)
Pharmacology & Pharmacy	Pharmacology & Toxicology	Life Sciences (LIFE)
Substance Abuse	Pharmacology & Toxicology	Life Sciences (LIFE)
Toxicology	Pharmacology & Toxicology	Life Sciences (LIFE)
Chemistry, Analytical	Chemistry	Natural Sciences (SCI)
Chemistry, Applied	Chemistry	Natural Sciences (SCI)
Chemistry, Inorganic & Nuclear	Chemistry	Natural Sciences (SCI)
Chemistry, Medicinal	Chemistry	Natural Sciences (SCI)
Chemistry, Multidisciplinary	Chemistry	Natural Sciences (SCI)
Chemistry, Organic	Chemistry	Natural Sciences (SCI)
Chemistry, Physical	Chemistry	Natural Sciences (SCI)
Crystallography	Chemistry	Natural Sciences (SCI)
Electrochemistry	Chemistry	Natural Sciences (SCI)
Polymer Science	Chemistry	Natural Sciences (SCI)
Spectroscopy	Chemistry	Natural Sciences (SCI)
Geochemistry & Geophysics	Geosciences	Natural Sciences (SCI)
Geography	Geosciences	Natural Sciences (SCI)
Geography, Physical	Geosciences	Natural Sciences (SCI)
Geology	Geosciences	Natural Sciences (SCI)
Geosciences, Multidisciplinary	Geosciences	Natural Sciences (SCI)
Limnology	Geosciences	Natural Sciences (SCI)
Meteorology & Atmospheric Sciences	Geosciences	Natural Sciences (SCI)
Mineralogy	Geosciences	Natural Sciences (SCI)
Oceanography	Geosciences	Natural Sciences (SCI)
Paleontology	Geosciences	Natural Sciences (SCI)
Remote Sensing	Geosciences	Natural Sciences (SCI)
Soil Science	Geosciences	Natural Sciences (SCI)
Mathematics	Mathematics	Natural Sciences (SCI)
Mathematics, Applied	Mathematics	Natural Sciences (SCI)
Mathematics, Interdisciplinary Applications	Mathematics	Natural Sciences (SCI)
Statistics & Probability	Mathematics	Natural Sciences (SCI)

Multidisciplinary Sciences	Natural Sciences, General	Natural Sciences (SCI)
Acoustics	Physics	Natural Sciences (SCI)
Nanoscience & Nanotechnology	Physics	Natural Sciences (SCI)
Nuclear Science & Technology	Physics	Natural Sciences (SCI)
Optics	Physics	Natural Sciences (SCI)
Physics, Applied	Physics	Natural Sciences (SCI)
Physics, Atomic, Molecular & Chemical	Physics	Natural Sciences (SCI)
Physics, Condensed Matter	Physics	Natural Sciences (SCI)
Physics, Fluids & Plasmas	Physics	Natural Sciences (SCI)
Physics, Mathematical	Physics	Natural Sciences (SCI)
Physics, Multidisciplinary	Physics	Natural Sciences (SCI)
Physics, Nuclear	Physics	Natural Sciences (SCI)
Physics, Particles & Fields	Physics	Natural Sciences (SCI)
Psychology	Psychology	Natural Sciences (SCI)
Psychology, Applied	Psychology	Natural Sciences (SCI)
Psychology, Biological	Psychology	Natural Sciences (SCI)
Psychology, Clinical	Psychology	Natural Sciences (SCI)
Psychology, Developmental	Psychology	Natural Sciences (SCI)
Psychology, Educational	Psychology	Natural Sciences (SCI)
Psychology, Experimental	Psychology	Natural Sciences (SCI)
Psychology, Mathematical	Psychology	Natural Sciences (SCI)
Psychology, Multidisciplinary	Psychology	Natural Sciences (SCI)
Psychology, Psychoanalysis	Psychology	Natural Sciences (SCI)
Psychology, Social	Psychology	Natural Sciences (SCI)
Astronomy & Astrophysics	Space Science	Natural Sciences (SCI)
Business	Economics & Business	Social Sciences (SOC)
Business, Finance	Economics & Business	Social Sciences (SOC)
Economics	Economics & Business	Social Sciences (SOC)
Industrial Relations & Labor	Economics & Business	Social Sciences (SOC)
Management	Economics & Business	Social Sciences (SOC)
Operations Research & Management Science	Economics & Business	Social Sciences (SOC)
Area Studies	Social Sciences, General	Social Sciences (SOC)
Asian Studies	Social Sciences, General	Social Sciences (SOC)
Communication	Social Sciences, General	Social Sciences (SOC)
Criminology & Penology	Social Sciences, General	Social Sciences (SOC)
Demography	Social Sciences, General	Social Sciences (SOC)
Education & Educational Research	Social Sciences, General	Social Sciences (SOC)

Education, Scientific Disciplines	Social Sciences, General	Social Sciences (SOC)
Education, Special	Social Sciences, General	Social Sciences (SOC)
Environmental Studies	Social Sciences, General	Social Sciences (SOC)
Ergonomics	Social Sciences, General	Social Sciences (SOC)
Ethics	Social Sciences, General	Social Sciences (SOC)
Ethnic Studies	Social Sciences, General	Social Sciences (SOC)
Family Studies	Social Sciences, General	Social Sciences (SOC)
Film, Radio, Television	Social Sciences, General	Social Sciences (SOC)
Folklore	Social Sciences, General	Social Sciences (SOC)
Health Policy & Services	Social Sciences, General	Social Sciences (SOC)
History & Philosophy Of Science	Social Sciences, General	Social Sciences (SOC)
Hospitality, Leisure, Sport & Tourism	Social Sciences, General	Social Sciences (SOC)
Information Science & Library Science	Social Sciences, General	Social Sciences (SOC)
International Relations	Social Sciences, General	Social Sciences (SOC)
Law	Social Sciences, General	Social Sciences (SOC)
Planning & Development	Social Sciences, General	Social Sciences (SOC)
Political Science	Social Sciences, General	Social Sciences (SOC)
Public Administration	Social Sciences, General	Social Sciences (SOC)
Public, Environmental & Occupational Health	Social Sciences, General	Social Sciences (SOC)
Social Issues	Social Sciences, General	Social Sciences (SOC)
Social Sciences, Biomedical	Social Sciences, General	Social Sciences (SOC)
Social Sciences, Interdisciplinary	Social Sciences, General	Social Sciences (SOC)
Social Sciences, Mathematical Methods	Social Sciences, General	Social Sciences (SOC)
Social Work	Social Sciences, General	Social Sciences (SOC)
Sociology	Social Sciences, General	Social Sciences (SOC)
Sport Sciences	Social Sciences, General	Social Sciences (SOC)
Urban Studies	Social Sciences, General	Social Sciences (SOC)
Women's Studies	Social Sciences, General	Social Sciences (SOC)

APPENDIX B

Ranking of Top 100 Universities in Fields

Table B.1: Agriculture & Environmental Sciences (*AGE*)

University	Rank	JIT ¹	Score ¹	Total Article Count ²	Score ²	Total Document Count ³	Score ³	H-Index ⁴	Score ⁴	Total Citation Count ⁵	Score ⁵	TOTAL SCORE
University of California Davis	1	10262.92	90.00	924.83	134.71	6909.50	65.00	25.80	89.56	10774.00	115.00	494.27
University of Florida	2	7971.26	79.79	998.58	140.00	6802.42	64.49	21.40	79.95	7504.00	97.25	461.47
Cornell University	3	7131.57	76.05	662.50	115.90	4842.58	55.10	23.20	83.88	7564.00	97.57	428.50
University of Wisconsin Madison	4	6056.22	71.25	514.83	105.31	3770.08	49.96	23.80	85.19	6937.00	94.17	405.89
University of California Berkeley	5	5443.04	68.52	435.25	99.60	2714.17	44.91	26.00	90.00	7152.00	95.33	398.36
University of Georgia	6	5539.26	68.95	588.75	110.61	4289.08	52.45	20.60	78.20	5605.00	86.93	397.15
Michigan State University	7	5324.93	68.00	540.83	107.17	3598.83	49.14	22.20	81.70	5636.00	87.10	393.11
Universidade de São Paulo	8	4525.04	64.43	816.33	126.93	4148.25	51.78	15.80	67.72	4421.00	80.51	391.36

Ghent University	9	4972.81	66.43	607.00	111.92	3159.50	47.04	19.40	75.58	5191.00	84.69	385.65
University of Queensland	10	4946.69	66.31	519.17	105.62	2846.83	45.54	22.20	81.70	5431.00	85.99	385.16
University of Tokyo	11	4902.00	66.11	517.17	105.48	3289.50	47.66	21.00	79.08	5272.00	85.13	383.45
Oregon State University	12	4870.20	65.97	452.75	100.86	3512.08	48.73	21.80	80.83	5541.00	86.59	382.96
University of Copenhagen	13	4855.38	65.90	577.00	109.77	2698.67	44.83	20.20	77.33	5071.00	84.03	381.87
University of British Columbia	14	4942.01	66.29	462.08	101.52	2729.67	44.98	22.20	81.70	5643.00	87.14	381.63
Harvard University	15	4731.79	65.35	333.33	92.29	2113.58	42.03	25.20	88.25	6176.00	90.03	377.96
University of Guelph	16	4524.64	64.43	542.00	107.26	3621.67	49.25	18.80	74.27	4681.00	81.92	377.13
North Carolina State University	17	4532.01	64.46	560.00	108.55	3856.08	50.38	17.20	70.78	4393.00	80.35	374.51
University of Helsinki	18	4839.65	65.83	430.00	99.22	2652.75	44.61	20.80	78.64	5282.00	85.18	373.49
Swedish University of Agricultural Sciences	19	4895.43	66.08	497.17	104.04	2678.00	44.73	19.00	74.71	4997.00	83.63	373.20
Texas A&M University	20	4104.48	62.56	528.25	106.27	3628.50	49.29	18.00	72.52	4213.00	79.38	370.01
Colorado State University	21	4070.98	62.41	414.75	98.13	3022.83	46.38	19.40	75.58	4542.00	81.16	363.67
University of Illinois Urbana Champaign	22	4212.87	63.04	402.58	97.26	2988.08	46.22	18.80	74.27	4701.00	82.03	362.81
Pennsylvania State University	23	4042.87	62.28	356.00	93.92	2545.75	44.10	21.60	80.39	4627.00	81.62	362.31
Iowa State University	24	4132.69	62.68	424.33	98.82	2974.58	46.15	17.80	72.09	4130.00	78.93	358.67
Purdue University	25	4140.77	62.72	411.17	97.87	2723.17	44.95	19.00	74.71	3893.00	77.64	357.89
Ohio State University	26	3958.12	61.90	408.00	97.65	3203.42	47.25	17.80	72.09	4024.00	78.35	357.24
University of Alberta	27	3959.09	61.91	419.00	98.44	2577.58	44.25	18.80	74.27	4027.00	78.37	357.23
Wageningen University & Research Centre	28	3634.68	60.46	547.33	107.64	2036.50	41.66	18.00	72.52	3280.00	74.31	356.60
Universidad Nacional Autónoma de México	29	3643.71	60.50	546.33	107.57	3038.08	46.46	15.20	66.41	3124.00	73.46	354.40
China Agricultural University	30	3693.41	60.72	510.75	105.01	2655.58	44.63	16.20	68.59	3475.00	75.37	354.33
Kyoto University	31	3990.27	62.05	438.33	99.82	2724.17	44.95	17.20	70.78	3702.00	76.60	354.20

Zhejiang University	32	3941.02	61.83	408.25	97.66	2289.58	42.87	17.60	71.65	4193.00	79.27	353.28
Swiss Federal Institute of Technology ETH Zürich	33	3551.24	60.09	317.17	91.13	1683.08	39.97	21.40	79.95	4453.00	80.68	351.82
Aarhus University	34	3539.11	60.04	417.33	98.32	1907.50	41.04	19.00	74.71	3891.00	77.63	351.73
University of Washington Seattle	35	3549.81	60.09	304.50	90.22	2210.33	42.49	20.20	77.33	4254.00	79.60	349.73
Utrecht University	36	3358.97	59.23	318.33	91.22	1894.83	40.98	19.80	76.46	3976.00	78.09	345.98
University of Toronto	37	3675.04	60.64	263.08	87.25	1748.58	40.28	20.40	77.77	4147.00	79.02	344.96
University of Arizona	38	3400.51	59.42	288.75	89.09	2122.00	42.07	19.60	76.02	4010.00	78.27	344.88
Universidade Estadual Paulista	39	2443.72	55.16	650.92	115.07	3275.83	47.60	11.20	57.67	2302.00	69.00	344.49
University of Oxford	40	3364.73	59.26	288.50	89.08	1504.33	39.11	20.60	78.20	3874.00	77.54	343.19
Duke University	41	3049.14	57.85	204.00	83.02	1492.00	39.05	22.80	83.01	4280.00	79.74	342.67
University of Melbourne	42	3293.26	58.94	352.75	93.68	1955.33	41.27	18.20	72.96	3479.00	75.39	342.25
University of Cambridge	43	3348.28	59.19	259.50	87.00	1754.67	40.31	19.60	76.02	3831.00	77.30	339.82
University of Sydney	44	3255.99	58.78	370.25	94.94	2150.75	42.21	16.60	69.47	3244.00	74.11	339.50
Universität Zürich	45	3034.58	57.79	338.58	92.67	1823.92	40.64	18.00	72.52	3254.00	74.17	337.79
Lund University	46	3013.99	57.70	223.25	84.40	1468.33	38.94	19.80	76.46	3773.00	76.99	334.48
University of Edinburgh	47	2897.54	57.18	268.00	87.61	1482.83	39.01	19.60	76.02	3233.00	74.06	333.87
Australian National University	48	2922.70	57.29	260.33	87.06	1444.83	38.83	19.00	74.71	3544.00	75.74	333.63
University of California Riverside	49	2928.98	57.32	244.17	85.90	1788.50	40.47	18.80	74.27	3526.00	75.65	333.61
Virginia Polytechnic Institute and State University	50	2891.84	57.15	326.83	91.83	2381.00	43.31	15.60	67.28	2896.00	72.23	331.80
National Taiwan University	51	3123.92	58.19	350.08	93.49	1746.75	40.27	15.20	66.41	3114.00	73.41	331.77
Seoul National University	52	2625.90	55.97	392.83	96.56	1833.75	40.69	15.00	65.97	2940.00	72.46	331.65
Kansas State University	53	2749.06	56.52	371.17	95.00	2345.83	43.14	14.60	65.10	2618.00	70.72	330.48
University of Western Australia	54	3118.36	58.16	301.75	90.03	1702.75	40.06	16.80	69.90	2906.00	72.28	330.43

McGill University	55	2823.26	56.85	251.75	86.44	1648.42	39.80	17.80	72.09	3265.00	74.23	329.41
University of Michigan Ann Arbor	56	2891.05	57.15	227.58	84.71	1391.42	38.57	18.60	73.83	3276.00	74.29	328.55
Louisiana State University	57	2754.19	56.54	325.67	91.74	2302.92	42.94	14.60	65.10	2745.00	71.41	327.72
Washington State University Pullman	58	2766.61	56.59	298.67	89.81	2038.67	41.67	16.00	68.16	2670.00	71.00	327.22
University of Tennessee Knoxville	59	2617.89	55.93	290.08	89.19	1907.58	41.04	16.60	69.47	2702.00	71.17	326.80
Universitat Autònoma de Barcelona	60	2615.94	55.92	284.17	88.77	1584.00	39.49	16.60	69.47	2849.00	71.97	325.62
Stanford University	61	2464.83	55.25	179.08	81.23	1091.92	37.14	19.80	76.46	3484.00	75.42	325.49
Universität Göttingen	62	2547.91	55.62	315.75	91.03	1596.17	39.55	16.20	68.59	2608.00	70.66	325.46
University of Missouri Columbia	63	2573.83	55.74	274.17	88.05	1882.00	40.92	16.80	69.90	2571.00	70.46	325.07
University of Bristol	64	2424.29	55.07	248.17	86.18	1531.17	39.24	17.60	71.65	2920.00	72.36	324.50
Université Laval	65	2613.47	55.91	253.75	86.58	1555.17	39.36	17.00	70.34	2879.00	72.13	324.32
Hokkaido University	66	2615.02	55.92	320.33	91.36	1881.33	40.92	14.60	65.10	2566.00	70.43	323.73
University of Saskatchewan	67	2516.81	55.48	315.00	90.98	1967.17	41.33	14.80	65.53	2465.00	69.89	323.21
University of Oslo	68	2476.19	55.30	211.00	83.52	1152.58	37.43	18.00	72.52	3073.00	73.19	321.96
Yale University	69	2277.54	54.42	193.17	82.24	1076.33	37.06	19.40	75.58	2944.00	72.49	321.79
Università degli Studi di Milano	70	2438.13	55.13	274.42	88.07	1631.75	39.72	15.80	67.72	2637.00	70.82	321.46
University of Adelaide	71	2476.61	55.30	236.33	85.34	1417.33	38.70	17.00	70.34	2701.00	71.17	320.84
Stockholm University	72	2317.83	54.60	182.92	81.50	1089.75	37.13	18.80	74.27	3099.00	73.33	320.83
Universidade Federal de Viçosa	73	1628.83	51.52	543.67	107.38	2327.67	43.06	9.60	54.17	1384.00	64.02	320.15
University of Aberdeen	74	2291.41	54.48	210.83	83.51	1267.00	37.98	18.20	72.96	2638.00	70.82	319.74
Uppsala University	75	2339.60	54.69	182.75	81.49	1083.42	37.10	18.80	74.27	2870.00	72.08	319.64
Universitat de Barcelona	76	2469.80	55.27	258.50	86.92	1331.17	38.28	15.80	67.72	2637.00	70.82	319.02
University of Sheffield	77	2386.49	54.90	165.50	80.26	1068.67	37.03	18.80	74.27	2864.00	72.05	318.51

University of Maryland	78	2107.22	53.66	209.33	83.40	1364.92	38.44	17.60	71.65	2690.00	71.11	318.26
Catholic University of Leuven	79	2388.92	54.91	246.42	86.06	1365.25	38.45	16.00	68.16	2570.00	70.46	318.03
University of Tehran	80	1451.41	50.73	482.58	102.99	1740.58	40.24	11.80	58.98	1565.00	65.00	317.95
Rutgers University	81	2168.63	53.93	192.92	82.22	1443.50	38.82	16.20	68.59	2820.00	71.81	315.38
University of Nebraska Lincoln	82	2210.81	54.12	252.83	86.52	1741.00	40.25	14.60	65.10	2340.00	69.21	315.19
University of Massachusetts Amherst	83	2018.52	53.26	186.17	81.74	1290.50	38.09	17.40	71.21	2634.00	70.80	315.10
Universität Bern	84	2032.99	53.33	245.92	86.02	1271.42	38.00	16.00	68.16	2413.00	69.60	315.10
James Cook University North Queensland	85	2127.44	53.75	221.50	84.27	1255.67	37.92	16.60	69.47	2227.00	68.59	314.00
Université Paris 6 Pierre and Marie Curie	86	2226.92	54.19	154.50	79.47	996.42	36.68	17.60	71.65	2771.00	71.55	313.53
University of California San Diego	87	1882.32	52.65	150.50	79.18	930.92	36.37	18.60	73.83	2542.00	70.30	312.34
Nanjing Agricultural University	88	2131.31	53.76	314.83	90.96	1347.17	38.36	13.00	61.60	1980.00	67.25	311.94
University of Kentucky	89	2143.77	53.82	231.50	84.99	1463.08	38.91	15.20	66.41	2077.00	67.78	311.91
University of North Carolina Chapel Hill	90	2259.95	54.34	151.00	79.22	1017.50	36.78	17.00	70.34	2707.00	71.20	311.87
Peking University	91	2138.38	53.80	203.67	82.99	914.08	36.29	16.40	69.03	2439.00	69.74	311.85
Aristotle University of Thessaloniki	92	1990.79	53.14	248.08	86.18	1580.17	39.48	14.00	63.79	2301.00	68.99	311.57
Technical University of Denmark	93	1920.84	52.83	213.17	83.67	1039.83	36.89	16.00	68.16	2406.00	69.56	311.11
Arizona State University	94	1863.23	52.57	205.67	83.14	1053.00	36.95	16.40	69.03	2310.00	69.04	310.73
Universidade Estadual de Campinas	95	1824.55	52.40	278.33	88.35	1487.00	39.03	14.00	63.79	1938.00	67.02	310.58
Università di Bologna	96	1945.46	52.94	249.25	86.26	1557.67	39.37	13.80	63.35	2191.00	68.40	310.31
University of Leeds	97	1952.57	52.97	161.67	79.98	949.92	36.46	17.40	71.21	2383.00	69.44	310.06
Università degli Studi di Napoli Federico II	98	1979.95	53.09	219.08	84.10	1405.33	38.64	14.80	65.53	2233.00	68.63	309.98
University of Colorado Boulder	99	1706.14	51.87	139.33	78.38	827.92	35.87	18.20	72.96	2605.00	70.65	309.73
University of Tasmania	100	2204.80	54.09	216.50	83.91	1263.17	37.96	14.60	65.10	2194.00	68.41	309.47

Table B.2: Clinical Medicine (*MED*)

University	Rank	JIT ¹	Score ¹	Total Article Count ²	Score ²	Total Document Count ³	Score ³	H-Index ⁴	Score ⁴	Total Citation Count ⁵	Score ⁵	TOTAL SCORE
Harvard University	1	107867.58	90.00	3609.08	140.00	27704.33	65.00	74.80	90.00	84715.00	115.00	500.00
Johns Hopkins University	2	49993.15	65.81	2159.25	111.71	18556.00	54.21	57.40	78.75	44797.00	87.85	398.33
University of California San Francisco	3	56028.51	68.33	1982.00	108.25	16201.67	51.43	58.00	79.14	40026.00	84.60	391.76
University of Toronto	4	41340.15	62.19	2201.17	112.53	16821.34	52.16	51.20	74.74	36390.00	82.13	383.76
University of Pennsylvania	5	38114.58	60.85	1697.50	102.70	14823.42	49.81	53.60	76.29	33780.00	80.35	370.00
University of Pittsburgh	6	37258.83	60.49	1714.08	103.02	15777.75	50.93	50.60	74.35	33955.00	80.47	369.27
University of Washington Seattle	7	37252.28	60.48	1636.17	101.50	13322.58	48.04	54.00	76.55	34597.00	80.91	367.49
University of California Los Angeles	8	36595.16	60.21	1648.33	101.74	15002.59	50.02	49.00	73.32	33483.00	80.15	365.44
University of Michigan Ann Arbor	9	35424.40	59.72	1630.92	101.40	14016.75	48.86	50.00	73.97	31843.00	79.04	362.98
Duke University	10	35899.46	59.92	1526.42	99.36	13012.50	47.67	54.40	76.81	30950.00	78.43	362.19
Columbia University New York	11	31424.02	58.05	1307.50	95.09	11825.17	46.27	49.40	73.58	28461.00	76.74	349.72
Karolinska Institute	12	31260.98	57.98	1460.92	98.08	11130.58	45.45	44.20	70.22	28291.00	76.62	348.35
Stanford University	13	28174.49	56.69	1347.17	95.86	11642.42	46.06	47.20	72.16	25386.00	74.64	345.41
University of California San Diego	14	26666.88	56.06	1207.83	93.15	9344.66	43.35	46.80	71.90	24203.00	73.84	338.29
University of North Carolina Chapel Hill	15	26112.73	55.83	1206.00	93.11	9471.67	43.50	46.40	71.64	24452.00	74.01	338.08
Washington University Saint Louis	16	26579.34	56.02	1189.33	92.78	10354.75	44.54	45.60	71.12	23719.00	73.51	337.98
Emory University	17	31487.43	58.08	1141.58	91.85	10000.41	44.12	43.00	69.44	20685.00	71.45	334.93
University College London	18	25429.57	55.54	1215.33	93.29	9337.00	43.34	43.80	69.96	21046.00	71.69	333.82
Yale University	19	26054.09	55.80	1093.00	90.91	10072.83	44.20	43.60	69.83	22828.00	72.90	333.65

Imperial College	20	24634.57	55.21	1114.75	91.33	9510.33	43.54	44.80	70.60	21229.00	71.82	332.50
Erasmus University	21	20783.29	53.60	1219.67	93.38	9073.42	43.03	40.60	67.89	19539.00	70.67	328.56
University of Minnesota	22	23189.05	54.61	1106.42	91.17	9128.75	43.09	40.00	67.50	20031.00	71.00	327.37
Northwestern University	23	22618.85	54.37	1084.17	90.73	9424.42	43.44	40.00	67.50	18980.00	70.29	326.33
University of Melbourne	24	20721.62	53.58	1279.17	94.54	8341.25	42.16	36.80	65.43	17697.00	69.41	325.12
King's College London	25	21022.75	53.70	1140.33	91.83	9136.00	43.10	38.40	66.47	17608.00	69.35	324.45
Ruprecht Karls Universität Heidelberg	26	20745.48	53.59	1127.33	91.58	8807.09	42.71	39.00	66.85	17788.00	69.48	324.20
University of Amsterdam	27	21782.30	54.02	1129.50	91.62	7705.66	41.41	40.00	67.50	17135.00	69.03	323.58
University of Oxford	28	21467.70	53.89	909.75	87.33	7034.17	40.62	44.40	70.34	19585.00	70.70	322.88
University of Alabama Birmingham	29	20870.16	53.64	996.17	89.02	8831.59	42.74	39.80	67.37	17561.00	69.32	322.09
Leiden University	30	22334.29	54.25	1024.00	89.56	7578.92	41.26	40.60	67.89	17267.00	69.12	322.08
McGill University	31	20427.78	53.45	981.92	88.74	8205.75	42.00	39.80	67.37	18795.00	70.16	321.73
University of British Columbia	32	18717.58	52.74	1068.75	90.43	7875.17	41.61	38.60	66.59	17066.00	68.99	320.36
Boston University	33	20146.00	53.33	940.75	87.93	6968.25	40.54	41.80	68.66	17343.00	69.17	319.65
University of Sydney	34	18430.28	52.62	1133.00	91.69	8183.08	41.98	34.40	63.88	16218.00	68.41	318.57
University of Southern California	35	19072.86	52.89	1030.75	89.69	7696.75	41.40	38.00	66.21	16069.00	68.31	318.49
Vanderbilt University	36	20452.44	53.46	949.42	88.10	7465.09	41.13	38.80	66.72	17054.00	68.98	318.40
University of Copenhagen	37	18534.81	52.66	1107.42	91.19	6701.58	40.23	36.60	65.30	16935.00	68.90	318.27
Ludwig Maximilians Universität München	38	16799.87	51.94	1024.42	89.57	7831.25	41.56	37.60	65.95	15642.00	68.02	317.03
New York University	39	17356.81	52.17	983.83	88.78	8098.92	41.88	38.00	66.21	15543.00	67.95	316.98
University of Chicago	40	18304.79	52.57	896.50	87.07	7983.83	41.74	39.80	67.37	15674.00	68.04	316.79
Utrecht University	41	20040.36	53.29	1027.33	89.62	6733.25	40.27	35.40	64.53	16432.00	68.55	316.26
Universidade de São Paulo	42	13010.94	50.35	1508.83	99.02	9803.66	43.89	25.80	58.32	10619.00	64.60	316.18

Ohio State University	43	17213.23	52.11	878.67	86.72	7117.75	40.72	39.00	66.85	14934.00	67.54	313.94
University of Wisconsin Madison	44	16793.82	51.93	869.33	86.54	7252.08	40.88	37.80	66.08	15595.00	67.99	313.42
Cornell University	45	17084.11	52.05	736.75	83.95	7078.25	40.67	38.80	66.72	15503.00	67.92	311.33
Universität Zürich	46	16033.77	51.62	866.75	86.49	6631.25	40.15	36.00	64.91	14864.00	67.49	310.65
Université Rene Descartes Paris 5	47	15929.25	51.57	1022.08	89.52	5739.83	39.09	34.80	64.14	12861.00	66.13	310.45
Seoul National University	48	14290.75	50.89	1336.33	95.65	7814.66	41.54	24.60	57.54	10375.00	64.43	310.06
Università degli Studi di Milano	49	15730.62	51.49	824.50	85.67	7388.16	41.04	35.80	64.78	13576.00	66.61	309.59
Lund University	50	16220.78	51.69	920.25	87.53	6165.08	39.60	34.20	63.75	13550.00	66.59	309.17
University of Helsinki	51	17666.86	52.30	839.42	85.96	6224.25	39.67	34.40	63.88	14292.00	67.10	308.90
McMaster University	52	15327.12	51.32	784.17	84.88	6514.33	40.01	37.40	65.82	13816.00	66.78	308.80
Oregon Health and Science University	53	15048.60	51.20	770.67	84.62	6582.74	40.09	37.20	65.69	13500.00	66.56	308.16
University of Florida	54	14994.32	51.18	845.50	86.08	7130.41	40.73	33.60	63.36	13326.00	66.44	307.80
University of Cincinnati	55	14746.62	51.08	711.67	83.46	6075.00	39.49	38.00	66.21	12933.00	66.17	306.41
University of Utah	56	14623.61	51.03	838.75	85.94	6672.50	40.19	33.60	63.36	12412.00	65.82	306.35
University of Tokyo	57	15412.33	51.36	906.58	87.27	6780.41	40.32	30.80	61.55	11808.00	65.41	305.91
University of Cambridge	58	15170.90	51.26	679.67	82.84	5287.17	38.56	38.20	66.34	13604.00	66.63	305.62
University of Alberta	59	13701.23	50.64	859.83	86.36	6446.42	39.93	33.00	62.97	11854.00	65.44	305.34
Medical University of Vienna	60	14418.86	50.94	771.50	84.63	6762.33	40.30	34.00	63.62	11905.00	65.48	304.97
University of Miami	61	13382.72	50.51	848.08	86.13	7030.17	40.62	31.20	61.81	11116.00	64.94	304.00
Case Western Reserve University	62	14944.78	51.16	710.50	83.44	6301.67	39.76	34.00	63.62	12519.00	65.89	303.87
University of Maryland, Baltimore	63	14255.87	50.87	763.83	84.48	6396.75	39.87	32.40	62.59	11635.00	65.29	303.10
University of Rochester	64	13529.88	50.57	674.08	82.73	6127.58	39.55	34.80	64.14	12124.00	65.62	302.61
Radboud University Nijmegen	65	13191.61	50.43	954.67	88.21	5508.59	38.82	29.20	60.52	10498.00	64.52	302.49

VU University of Amsterdam	66	13695.26	50.64	694.33	83.13	5073.84	38.31	34.20	63.75	12682.00	66.00	301.83
University of Manchester	67	13122.44	50.40	736.83	83.96	6374.00	39.84	32.60	62.72	11036.00	64.88	301.80
Aarhus University	68	13595.21	50.60	772.92	84.66	5365.50	38.65	32.20	62.46	11495.00	65.20	301.56
University of Colorado at Denver	69	15093.68	51.22	532.83	79.97	5628.74	38.96	35.80	64.78	13361.00	66.47	301.41
Université de Montreal	70	13524.37	50.57	716.83	83.57	5530.33	38.85	32.00	62.33	11523.00	65.22	300.52
Università degli Studi di Roma La Sapienza	71	12708.15	50.23	791.92	85.03	6537.67	40.04	29.20	60.52	10752.00	64.69	300.50
University of California Davis	72	12835.94	50.28	647.33	82.21	5516.25	38.83	33.60	63.36	11527.00	65.22	299.90
University of Oslo	73	12478.92	50.13	921.67	87.56	4961.92	38.18	28.20	59.87	9739.00	64.00	299.74
Tel Aviv University	74	12746.50	50.24	908.50	87.31	5950.25	39.34	26.60	58.84	9344.00	63.73	299.46
University of Iowa	75	13279.95	50.46	668.67	82.63	5548.59	38.87	31.80	62.20	11408.00	65.14	299.29
Technische Universität München	76	11718.26	49.81	683.67	82.92	5304.33	38.58	33.40	63.23	10630.00	64.61	299.15
University of Groningen	77	13814.71	50.69	680.17	82.85	5123.58	38.37	30.80	61.55	10656.00	64.63	298.08
Uppsala University	78	12358.38	50.08	723.25	83.69	4893.83	38.10	30.40	61.29	11006.00	64.86	298.02
Universität Bern	79	13512.01	50.56	731.00	83.84	5524.67	38.84	29.00	60.39	9881.00	64.10	297.73
Wake Forest University	80	12819.28	50.27	544.17	80.20	5331.67	38.61	33.80	63.49	11144.00	64.96	297.53
Università degli Studi di Napoli Federico II	81	12336.20	50.07	678.08	82.81	6067.58	39.48	29.60	60.78	9828.00	64.06	297.20
Universität Tübingen	82	11376.34	49.67	677.25	82.79	5536.17	38.85	31.00	61.68	9939.00	64.14	297.14
National and Kapodistrian University of Athens	83	10954.90	49.49	814.00	85.46	7057.25	40.65	25.60	58.19	8573.00	63.21	297.00
University of Calgary	84	11141.53	49.57	683.50	82.91	5336.00	38.62	31.20	61.81	9747.00	64.01	296.92
Monash University	85	11125.42	49.56	738.17	83.98	5052.17	38.28	29.80	60.91	9589.00	63.90	296.63
Université Paris 6 Pierre and Marie Curie	86	12594.75	50.18	674.83	82.75	4299.92	37.40	30.60	61.42	10339.00	64.41	296.15
University of Queensland	87	10653.13	49.37	792.33	85.04	5094.17	38.33	27.40	59.35	9805.00	64.05	296.14
Yonsei University	88	9566.03	48.91	1041.33	89.90	6181.83	39.62	20.80	55.09	6937.00	62.10	295.61

National Taiwan University	89	11730.06	49.82	879.17	86.73	5707.75	39.06	23.20	56.64	8574.00	63.21	295.45
Wayne State University	90	11110.23	49.56	603.67	81.36	5613.17	38.94	30.80	61.55	9636.00	63.93	295.34
University of Illinois Chicago	91	11229.30	49.61	686.17	82.97	5371.00	38.66	28.80	60.26	9357.00	63.74	295.23
Università degli Studi di Padova	92	11105.89	49.56	640.17	82.07	5744.84	39.10	29.60	60.78	9035.00	63.52	295.02
University of Maastricht	93	11441.20	49.70	705.33	83.34	4798.75	37.98	29.00	60.39	9108.00	63.57	294.98
Osaka University	94	11447.67	49.70	689.58	83.03	5301.17	38.58	27.00	59.09	8894.00	63.43	293.83
University of California Irvine	95	10150.54	49.16	534.67	80.01	4956.41	38.17	32.00	62.33	9460.00	63.81	293.48
The University of Texas Southwestern Medical Center at Dallas	96	11990.99	49.93	864.08	86.44	4840.00	38.03	21.80	55.73	8538.00	63.19	293.32
University of New South Wales	97	10203.16	49.18	707.67	83.39	4607.17	37.76	27.80	59.61	8677.00	63.28	293.22
The University of Texas Health Science Center at San Antonio	98	10405.11	49.26	495.58	79.25	4458.41	37.58	32.20	62.46	10140.00	64.27	292.83
Kyoto University	99	11442.30	49.70	655.42	82.37	5244.75	38.51	26.40	58.71	8975.00	63.48	292.76
Universität Basel	100	10603.10	49.35	584.08	80.97	4335.50	37.44	30.40	61.29	9029.00	63.52	292.57

Table B.3: Engineering, Computing Technology (ENG)

University	Rank	JIT ¹	Score ¹	Total Article Count ²	Score ²	Total Document Count ³	Score ³	H-Index ⁴	Score ⁴	Total Citation Count ⁵	Score ⁵	TOTAL SCORE
Tsinghua University China	1	11048.32	90.00	1510.83	140.00	13616.00	65.00	27.80	77.76	12068.00	108.54	481.29
National University of Singapore	2	10057.98	85.88	992.33	115.38	7723.67	50.57	31.80	83.88	12284.00	109.47	445.17
University of California Berkeley	3	8602.05	79.81	745.83	103.67	6191.84	46.82	35.80	90.00	13563.00	115.00	435.30
Massachusetts Institute of Technology	4	8875.86	80.95	796.50	106.08	7522.66	50.08	33.00	85.71	12581.00	110.76	433.58
Nanyang Technological University	5	9077.52	81.79	1114.33	121.17	9076.33	53.88	26.80	76.22	9595.00	97.85	430.92
Georgia Institute of Technology	6	8277.18	78.46	842.83	108.28	8393.83	52.21	29.40	80.20	10762.00	102.89	422.05
Zhejiang University	7	7760.93	76.31	1164.67	123.56	9569.50	55.09	22.40	69.49	8836.00	94.57	419.02
Shanghai Jiao Tong University	8	8272.30	78.44	1189.33	124.73	9448.17	54.79	22.00	68.88	8235.00	91.97	418.82
Harbin Institute of Technology	9	6425.36	70.75	1153.00	123.01	11728.16	60.38	21.40	67.96	6498.00	84.47	406.56
Stanford University	10	6647.48	71.67	618.00	97.60	6044.66	46.46	32.60	85.10	11135.00	104.51	405.34
National Taiwan University	11	7555.76	75.46	918.83	111.89	7336.83	49.62	23.00	70.41	7751.00	89.88	397.25
Seoul National University	12	7613.52	75.70	915.33	111.72	6737.33	48.15	22.60	69.80	7507.00	88.83	394.19
University of Illinois Urbana Champaign	13	6687.34	71.84	707.33	101.84	6499.83	47.57	26.40	75.61	8165.00	91.67	388.54
University of Michigan Ann Arbor	14	6720.22	71.98	614.50	97.44	5609.83	45.39	27.20	76.84	8557.00	93.36	385.00
National Cheng Kung University	15	6963.54	72.99	930.33	112.43	6506.17	47.59	19.80	65.51	6830.00	85.90	384.42
Pennsylvania State University	16	5883.04	68.49	632.00	98.27	5261.00	44.54	28.80	79.29	8117.00	91.46	382.04
Swiss Federal Institute of Technology ETH Zürich	17	5949.64	68.77	631.17	98.23	5421.17	44.93	27.20	76.84	7746.00	89.86	378.62
University of Tokyo	18	6044.50	69.16	723.00	102.59	7589.00	50.24	23.20	70.71	6571.00	84.78	377.49
Imperial College	19	5874.82	68.46	700.00	101.50	5620.50	45.42	24.00	71.94	7540.00	88.97	376.28

Tohoku University	20	5692.21	67.70	791.67	105.85	7415.50	49.81	20.80	67.04	5907.00	81.91	372.31
University of Cambridge	21	5806.11	68.17	539.67	93.88	4739.67	43.26	26.80	76.22	7800.00	90.09	371.63
Delft University of Technology	22	5318.12	66.14	773.67	104.99	6493.50	47.56	21.40	67.96	6031.00	82.45	369.09
University of Toronto	23	5332.84	66.20	584.50	96.01	5117.17	44.18	25.40	74.08	6770.00	85.64	366.12
Purdue University	24	5485.66	66.84	687.67	100.91	5931.84	46.18	22.20	69.18	5794.00	81.42	364.53
University of California Los Angeles	25	4712.30	63.61	460.17	90.11	4633.17	43.00	26.80	76.22	7683.00	89.59	362.53
University of Texas Austin	26	4563.16	62.99	534.17	93.62	5034.16	43.98	26.00	75.00	6873.00	86.09	361.68
école Polytechnique Fédérale de Lausanne	27	4693.13	63.54	452.83	89.76	4761.84	43.31	26.60	75.92	7258.00	87.75	360.28
Northwestern University	28	4842.31	64.16	394.17	86.97	2873.50	38.69	28.80	79.29	7584.00	89.16	358.26
Peking University	29	4548.01	62.93	615.50	97.48	4731.33	43.24	23.80	71.63	5815.00	81.51	356.80
Hong Kong Polytechnic University	30	4961.09	64.65	717.67	102.33	5355.00	44.77	19.20	64.59	5207.00	78.89	355.23
Harvard University	31	4959.59	64.64	389.00	86.73	2687.50	38.23	27.80	77.76	6808.00	85.81	353.17
Texas A&M University	32	4399.00	62.31	686.67	100.86	5145.00	44.25	21.00	67.35	5019.00	78.07	352.85
National Chiao Tung University	33	5269.77	65.94	640.17	98.65	5990.17	46.32	19.20	64.59	4766.00	76.98	352.49
City University of Hong Kong	34	5063.31	65.08	615.33	97.48	4836.00	43.50	20.60	66.73	5230.00	78.99	351.77
University of Manchester	35	4561.03	62.99	485.92	91.33	4529.25	42.74	21.00	67.35	6773.00	85.65	350.06
University of Washington Seattle	36	4252.01	61.70	373.17	85.98	3610.50	40.49	27.80	77.76	6229.00	83.30	349.23
Dalian University of Technology	37	3840.14	59.98	744.83	103.62	5695.75	45.60	18.40	63.37	4256.00	74.78	347.35
Kyoto University	38	4604.95	63.17	533.17	93.57	5650.17	45.49	20.00	65.82	4894.00	77.53	345.58
University of Science and Technology of China	39	4220.81	61.57	467.83	90.47	4296.17	42.17	22.80	70.10	5644.00	80.78	345.09
Yonsei University	40	4428.55	62.43	669.33	100.04	5272.16	44.56	18.40	63.37	4211.00	74.58	344.99
University of Waterloo	41	4206.69	61.51	595.83	96.55	5405.83	44.89	19.20	64.59	4672.00	76.57	344.12
Osaka University	42	4132.64	61.20	536.50	93.73	6173.17	46.77	20.20	66.12	4592.00	76.23	344.05

Carnegie Mellon University	43	3727.86	59.52	441.67	89.23	5890.67	46.08	22.60	69.80	4625.00	76.37	340.99
University of Florida	44	4212.62	61.53	498.67	91.94	4177.50	41.88	21.00	67.35	4853.00	77.36	340.06
Huazhong University of Science and Technology	45	3452.96	58.37	665.00	99.83	7556.58	50.16	16.20	60.00	3403.00	71.09	339.45
National Tsing Hua University Taiwan	46	4650.89	63.36	469.33	90.54	4363.50	42.34	20.80	67.04	4513.00	75.89	339.17
California Institute of Technology Caltech	47	3824.72	59.92	316.50	83.28	4303.66	42.19	24.20	72.24	5762.00	81.29	338.93
University of Maryland	48	4080.68	60.98	487.17	91.39	4770.67	43.34	19.80	65.51	4884.00	77.49	338.71
University of California San Diego	49	3995.25	60.63	449.83	89.62	4589.50	42.89	21.80	68.57	4753.00	76.92	338.63
Tokyo Institute of Technology	50	4172.05	61.37	512.17	92.58	5768.67	45.78	18.60	63.67	3934.00	73.38	336.78
Korea University	51	3689.27	59.35	610.50	97.25	4691.67	43.14	18.40	63.37	3678.00	72.28	335.39
Eindhoven University of Technology	52	3744.70	59.59	412.33	87.84	4503.50	42.68	21.60	68.27	4625.00	76.37	334.74
University of British Columbia	53	3847.19	60.01	518.83	92.89	4405.33	42.44	18.60	63.67	4079.00	74.01	333.03
University of Wisconsin Madison	54	3714.22	59.46	423.83	88.38	3520.33	40.27	21.40	67.96	4698.00	76.69	332.76
University of Minnesota	55	3704.19	59.42	407.25	87.59	3746.17	40.83	21.80	68.57	4563.00	76.10	332.51
Hong Kong University of Science & Technology	56	3834.11	59.96	404.00	87.44	4032.84	41.53	21.60	68.27	4379.00	75.31	332.50
University of Alberta	57	3915.42	60.30	513.50	92.64	4191.34	41.92	18.80	63.98	3909.00	73.28	332.11
Jilin University	58	3590.93	58.95	416.67	88.04	3943.17	41.31	20.40	66.43	4823.00	77.23	331.95
Tianjin University	59	3708.46	59.43	479.00	91.00	5192.00	44.37	17.80	62.45	4070.00	73.97	331.23
Cornell University	60	3737.64	59.56	335.83	84.20	3173.83	39.42	22.60	69.80	4929.00	77.69	330.66
Catholic University of Leuven	61	3573.69	58.87	444.50	89.36	4291.67	42.16	19.60	65.20	4303.00	74.98	330.58
University of New South Wales	62	3559.17	58.81	491.00	91.57	4205.67	41.95	19.40	64.90	3818.00	72.88	330.12
Southeast University China	63	3121.17	56.99	616.50	97.53	5192.67	44.37	17.20	61.53	3023.00	69.45	329.87
University of Oxford	64	3781.63	59.74	383.33	86.46	3217.17	39.53	21.00	67.35	4704.00	76.71	329.79
University of California Santa Barbara	65	3714.09	59.46	258.67	80.54	2944.00	38.86	23.20	70.71	5469.00	80.02	329.59

Fudan University (Shanghai Medical University)	66	3322.43	57.83	364.67	85.57	3182.00	39.44	23.00	70.41	4470.00	75.70	328.95
University of California Davis	67	3647.35	59.18	407.75	87.62	3395.92	39.97	20.40	66.43	4453.00	75.63	328.82
Ohio State University	68	3707.80	59.43	448.83	89.57	3874.34	41.14	19.00	64.29	4008.00	73.70	328.13
University of Queensland	69	3472.34	58.45	357.83	85.25	2967.00	38.92	22.00	68.88	4609.00	76.30	327.80
Hanyang University	70	3590.82	58.94	513.50	92.64	4531.00	42.75	17.00	61.22	3601.00	71.95	327.50
Arizona State University	71	3466.75	58.43	359.33	85.32	3872.67	41.14	21.00	67.35	4357.00	75.21	327.44
University of Southern California	72	3283.48	57.67	341.33	84.46	4287.00	42.15	21.60	68.27	4006.00	73.70	326.24
Pohang University of Science and Technology	73	3589.41	58.94	414.00	87.91	3137.66	39.34	20.00	65.82	4120.00	74.19	326.19
Nanjing University	74	3372.95	58.04	375.75	86.10	2510.50	37.80	21.60	68.27	4507.00	75.86	326.06
Virginia Polytechnic Institute and State University	75	3241.34	57.49	436.67	88.99	4599.83	42.92	18.20	63.06	3839.00	72.97	325.43
South China University of Technology	76	2790.89	55.61	475.00	90.81	5652.67	45.50	17.60	62.14	3122.00	69.88	323.94
Rice University	77	2786.20	55.59	237.00	79.51	1729.50	35.89	26.80	76.22	4600.00	76.26	323.48
Technical University of Denmark	78	3303.82	57.75	382.92	86.44	3230.09	39.56	19.20	64.59	4273.00	74.85	323.19
Princeton University	79	3057.41	56.72	299.83	82.49	2573.50	37.95	23.20	70.71	4304.00	74.98	322.87
Central South University China	80	2679.89	55.15	604.50	96.96	5071.92	44.07	14.80	57.86	2877.00	68.82	322.86
Shandong University	81	3174.55	57.21	447.83	89.52	4030.33	41.52	17.60	62.14	3377.00	70.98	321.38
Indian Institute of Technology Kharagpur	82	3305.40	57.76	489.83	91.52	3380.33	39.93	16.40	60.31	3503.00	71.52	321.03
North Carolina State University	83	3259.11	57.56	419.00	88.15	3593.25	40.45	18.00	62.76	3508.00	71.54	320.47
Technion Israel Institute of Technology	84	3498.12	58.56	397.67	87.14	3967.50	41.37	17.20	61.53	3438.00	71.24	319.84
Sharif University of Technology	85	2495.41	54.38	605.17	96.99	3975.67	41.39	14.60	57.55	2419.00	66.84	317.15
Politecnico di Milano	86	2867.30	55.93	432.83	88.81	4467.42	42.59	16.40	60.31	2973.00	69.23	316.87
University of Hong Kong	87	2930.66	56.20	344.33	84.61	3375.84	39.92	19.20	64.59	3456.00	71.32	316.63
Royal Institute of Technology	88	3042.26	56.66	397.00	87.11	3396.66	39.97	17.40	61.84	3349.00	70.86	316.43

University of Melbourne	89	2840.79	55.82	294.33	82.23	2801.00	38.51	21.60	68.27	3498.00	71.50	316.33
Université Paris 6 Pierre and Marie Curie	90	3127.46	57.02	300.83	82.54	2782.66	38.47	19.00	64.29	4024.00	73.77	316.08
Technische Universität München	91	2609.77	54.86	354.75	85.10	4313.25	42.22	18.80	63.98	3107.00	69.81	315.97
University of Southampton	92	2775.04	55.55	372.33	85.94	3790.17	40.93	18.40	63.37	3168.00	70.07	315.86
Ghent University	93	2767.17	55.51	422.00	88.29	3397.09	39.97	17.20	61.53	3175.00	70.10	315.42
Universidade de São Paulo	94	3099.76	56.90	433.33	88.83	3804.50	40.97	15.40	58.78	3126.00	69.89	315.37
University College London	95	3210.36	57.36	326.92	83.78	2840.00	38.61	18.00	62.76	3527.00	71.63	314.13
University of Tehran	96	1897.42	51.89	584.83	96.03	3706.92	40.73	15.40	58.78	2378.00	66.66	314.09
Beihang University	97	2180.12	53.07	599.33	96.72	5924.00	46.16	12.40	54.18	1707.00	63.76	313.89
Johns Hopkins University	98	2660.13	55.07	287.17	81.89	2663.17	38.17	20.80	67.04	3538.00	71.67	313.85
University of Sydney	99	2955.73	56.30	355.00	85.11	3355.17	39.87	17.40	61.84	3301.00	70.65	313.77
Columbia University New York	100	2877.64	55.97	274.50	81.29	2722.66	38.32	20.00	65.82	3678.00	72.28	313.68

Table B.4: Life Sciences (*LIFE*)

University	Rank	JIT¹	Score¹	Total Article Count²	Score²	Total Document Count³	Score³	H-Index⁴	Score⁴	Total Citation Count⁵	Score⁵	TOTAL SCORE
Harvard University	1	91841.35	90.00	3014.25	140.00	18851.33	65.00	82.00	90.00	81560.00	115.00	500.00
Johns Hopkins University	2	38204.87	63.60	1606.08	106.88	10853.66	51.06	52.40	72.05	34353.00	81.57	375.16
University of California San Francisco	3	38332.04	63.66	1383.33	101.65	8789.58	47.46	54.60	73.38	33185.00	80.74	366.89
University of Washington Seattle	4	33560.04	61.31	1437.00	102.91	8668.75	47.25	50.80	71.08	29847.00	78.38	360.93
University of California San Diego	5	32121.27	60.60	1434.33	102.84	8322.00	46.65	50.00	70.59	28686.00	77.56	358.24
University of Pennsylvania	6	32711.98	60.89	1244.67	98.38	8803.59	47.49	51.00	71.20	30613.00	78.92	356.88
University of Oxford	7	31021.41	60.06	1352.33	100.92	7872.58	45.86	49.20	70.11	27932.00	77.02	353.97
University of Tokyo	8	31674.36	60.38	1400.08	102.04	9800.08	49.22	41.00	65.13	25245.00	75.12	351.90
Stanford University	9	31659.03	60.37	1120.67	95.47	7492.41	45.20	51.80	71.68	29216.00	77.93	350.66
University of Toronto	10	30068.54	59.59	1337.67	100.57	8524.17	47.00	43.80	66.83	25908.00	75.59	349.58
University of Michigan Ann Arbor	11	28087.34	58.62	1229.17	98.02	7907.17	45.92	48.80	69.87	25978.00	75.64	348.06
University of California Los Angeles	12	29184.27	59.16	1218.83	97.78	8034.08	46.15	46.00	68.17	27514.00	76.73	347.97
Yale University	13	29811.92	59.47	1099.83	94.98	7524.50	45.26	46.40	68.41	26192.00	75.79	343.90
University of Cambridge	14	27775.37	58.46	1125.58	95.58	6769.08	43.94	48.40	69.62	24231.00	74.40	342.01
University College London	15	25618.63	57.40	1170.33	96.64	7425.66	45.08	43.60	66.71	22316.00	73.05	338.88
Washington University Saint Louis	16	26996.13	58.08	1027.50	93.28	7069.00	44.46	45.80	68.05	23628.00	73.97	337.84
University of Pittsburgh	17	22494.51	55.86	1128.00	95.64	8091.83	46.25	41.80	65.62	21920.00	72.77	336.14
Duke University	18	24259.54	56.73	1074.83	94.39	6859.17	44.10	44.40	67.20	21908.00	72.76	335.17
Karolinska Institute	19	24004.04	56.61	1181.67	96.90	7208.00	44.71	39.40	64.16	20523.00	71.78	334.16

Imperial College	20	21789.61	55.52	990.42	92.41	6401.83	43.30	42.60	66.11	19695.00	71.19	328.52
University of North Carolina Chapel Hill	21	22371.38	55.80	995.17	92.52	6666.25	43.76	40.40	64.77	20255.00	71.59	328.44
Cornell University	22	23562.08	56.39	959.58	91.68	6666.00	43.76	40.40	64.77	20082.00	71.46	328.06
Massachusetts Institute of Technology	23	23047.29	56.14	675.67	85.00	3920.08	38.97	53.80	72.90	23248.00	73.71	326.72
University of California Berkeley	24	24767.95	56.98	894.25	90.14	5314.67	41.41	42.20	65.86	19575.00	71.10	325.50
McGill University	25	21772.25	55.51	971.58	91.96	6206.50	42.96	38.80	63.80	19090.00	70.76	324.99
Columbia University New York	26	21529.14	55.39	871.50	89.61	5936.59	42.49	42.60	66.11	19705.00	71.20	324.79
Kyoto University	27	21022.22	55.14	937.50	91.16	7121.67	44.55	38.00	63.32	18715.00	70.50	324.67
University of Wisconsin Madison	28	21426.07	55.34	930.00	90.98	6345.17	43.20	38.80	63.80	18911.00	70.63	323.96
University of British Columbia	29	19077.21	54.18	964.25	91.79	5913.59	42.45	36.80	62.59	17303.00	69.50	320.50
University of California Davis	30	18899.33	54.09	915.33	90.64	5906.08	42.44	37.80	63.19	17728.00	69.80	320.16
Emory University	31	18298.81	53.80	848.42	89.07	6120.16	42.81	39.60	64.29	16832.00	69.16	319.12
Osaka University	32	18990.97	54.14	886.67	89.97	6424.25	43.34	35.60	61.86	15482.00	68.21	317.51
University of Copenhagen	33	16487.36	52.91	1026.75	93.26	5191.75	41.19	34.80	61.37	15521.00	68.23	316.97
Vanderbilt University	34	18683.74	53.99	875.42	89.70	5499.50	41.73	35.60	61.86	14778.00	67.71	314.98
New York University	35	18003.20	53.65	715.75	85.95	5118.67	41.06	40.00	64.53	15935.00	68.53	313.72
University of Melbourne	36	16742.97	53.03	915.67	90.65	5270.00	41.33	33.80	60.77	14411.00	67.45	313.22
Universität Zürich	37	17919.47	53.61	760.92	87.01	4825.58	40.55	37.60	63.07	15223.00	68.02	312.27
Utrecht University	38	17799.33	53.55	837.42	88.81	4987.25	40.83	33.40	60.53	15482.00	68.21	311.93
University of Chicago	39	16861.46	53.09	722.33	86.10	4528.75	40.04	38.60	63.68	14775.00	67.71	310.61
Seoul National University	40	14317.93	51.84	1007.67	92.81	5800.67	42.25	27.40	56.89	12320.00	65.97	309.76
Ohio State University	41	15488.07	52.41	770.08	87.22	5460.75	41.66	34.40	61.13	14100.00	67.23	309.66
Universidade de São Paulo	42	12985.60	51.18	1083.50	94.59	7015.50	44.37	23.40	54.46	10682.00	64.81	309.41

University of Helsinki	43	16173.94	52.75	794.25	87.79	4882.00	40.65	34.20	61.01	14002.00	67.16	309.36
University of Minnesota	44	15812.64	52.57	769.17	87.20	5186.92	41.18	34.40	61.13	14035.00	67.18	309.27
Northwestern University	45	16065.86	52.70	693.50	85.42	4919.83	40.72	35.80	61.98	13972.00	67.14	307.96
Ludwig Maximilians Universität München	46	15219.87	52.28	682.67	85.17	4829.41	40.56	36.40	62.35	14397.00	67.44	307.79
University of Florida	47	13930.81	51.65	822.17	88.45	5434.08	41.61	31.00	59.07	13107.00	66.52	307.30
University of Edinburgh	48	15292.26	52.32	711.17	85.84	4311.17	39.66	36.80	62.59	13213.00	66.60	307.00
Boston University	49	14539.91	51.95	650.92	84.42	4312.83	39.66	37.00	62.71	13483.00	66.79	305.53
King's College London	50	14151.11	51.76	665.58	84.77	4641.59	40.23	35.80	61.98	13248.00	66.62	305.36
Ruprecht Karls Universität Heidelberg	51	14390.36	51.87	718.25	86.00	4389.59	39.79	33.00	60.28	12178.00	65.87	303.82
University of Manchester	52	14230.64	51.80	656.58	84.55	4759.00	40.44	33.20	60.40	12615.00	66.18	303.37
University of Queensland	53	13506.69	51.44	756.33	86.90	4402.58	39.82	30.40	58.71	11627.00	65.48	302.34
Université Paris 6 Pierre and Marie Curie	54	15082.49	52.21	692.33	85.39	4139.25	39.36	31.20	59.19	11779.00	65.58	301.74
University of Alabama Birmingham	55	13284.11	51.33	598.33	83.18	4454.42	39.91	34.00	60.89	11709.00	65.53	300.84
Uppsala University	56	14457.29	51.91	685.33	85.23	4029.16	39.16	30.40	58.71	11547.00	65.42	300.43
Pennsylvania State University	57	12117.16	50.76	617.58	83.64	3985.09	39.09	31.40	59.31	14480.00	67.50	300.29
University of California Irvine	58	12701.44	51.04	612.25	83.51	3809.75	38.78	34.40	61.13	11819.00	65.61	300.08
University of Utah	59	13274.70	51.33	608.33	83.42	4193.75	39.45	33.20	60.40	11537.00	65.41	300.01
University of Sydney	60	12004.12	50.70	761.50	87.02	4346.34	39.72	28.40	57.49	10649.00	64.78	299.72
Université de Montreal	61	12977.65	51.18	680.83	85.12	4183.58	39.43	31.20	59.19	10620.00	64.76	299.69
University of Southern California	62	12770.80	51.08	586.42	82.90	3765.00	38.70	33.40	60.53	11942.00	65.70	298.91
Leiden University	63	12595.81	50.99	613.50	83.54	3873.25	38.89	32.60	60.04	11416.00	65.33	298.79
Case Western Reserve University	64	12789.93	51.09	591.67	83.03	4312.67	39.66	31.60	59.43	11193.00	65.17	298.38
Université Rene Descartes Paris 5	65	13263.82	51.32	717.08	85.98	3665.09	38.53	29.80	58.34	9706.00	64.12	298.28

University of Maryland, Baltimore	66	12573.57	50.98	637.67	84.11	4234.08	39.52	30.40	58.71	10863.00	64.94	298.25
Università degli Studi di Milano	67	11920.61	50.66	654.25	84.50	4445.42	39.89	30.00	58.46	10365.00	64.58	298.09
University of Amsterdam	68	12129.49	50.76	656.83	84.56	3809.66	38.78	30.80	58.95	10751.00	64.86	297.91
Universität Tübingen	69	12301.97	50.85	618.25	83.65	3907.25	38.95	31.40	59.31	10691.00	64.81	297.58
National University of Singapore	70	12246.47	50.82	698.25	85.53	3860.17	38.87	29.00	57.86	9291.00	63.82	296.90
Lund University	71	12525.52	50.96	556.83	82.21	3804.50	38.77	31.40	59.31	11466.00	65.36	296.61
Erasmus University	72	11620.85	50.51	543.83	81.90	3197.33	37.71	34.20	61.01	9811.00	64.19	295.33
Radboud University Nijmegen	73	11761.62	50.58	617.50	83.64	3120.58	37.58	31.20	59.19	9588.00	64.03	295.02
University of Iowa	74	12142.04	50.77	525.58	81.47	3868.84	38.89	30.40	58.71	10310.00	64.54	294.38
University of Alberta	75	11059.31	50.23	622.17	83.74	3948.33	39.02	27.80	57.13	9572.00	64.02	294.15
Yeshiva University	76	12166.68	50.78	495.42	80.76	3337.25	37.96	32.00	59.68	9902.00	64.25	293.43
Technische Universität München	77	10258.03	49.84	528.92	81.55	2943.83	37.27	32.80	60.16	9828.00	64.20	293.03
Ghent University	78	9462.02	49.45	669.42	84.86	3415.34	38.09	26.20	56.16	9016.00	63.63	292.18
Oregon Health and Science University	79	10450.59	49.93	469.33	80.15	3458.16	38.17	31.00	59.07	9287.00	63.82	291.14
Tel Aviv University	80	10977.01	50.19	567.50	82.46	3513.25	38.27	27.20	56.77	8429.00	63.21	290.90
Aarhus University	81	9606.32	49.52	586.08	82.90	3205.33	37.73	27.80	57.13	8541.00	63.29	290.56
University of Illinois Urbana Champaign	82	10472.72	49.95	538.58	81.78	3284.00	37.87	28.60	57.61	8485.00	63.25	290.46
Rockefeller University	83	11699.57	50.55	314.83	76.52	2138.67	35.87	38.20	63.44	9635.00	64.07	290.44
Università degli Studi di Roma La Sapienza	84	10715.28	50.07	543.17	81.89	3718.42	38.62	26.60	56.40	8641.00	63.36	290.34
Monash University	85	9592.12	49.51	552.67	82.11	3475.33	38.20	28.20	57.37	8213.00	63.06	290.25
Université Paris XI Sud	86	10736.54	50.08	529.00	81.55	3061.33	37.48	28.80	57.74	8404.00	63.19	290.04
University of Virginia	87	10611.74	50.01	410.50	78.77	3092.17	37.53	32.00	59.68	9329.00	63.85	289.84
University of Rochester	88	10427.47	49.92	485.83	80.54	3330.00	37.95	29.00	57.86	8656.00	63.37	289.64

Tohoku University	89	10078.40	49.75	547.67	81.99	4167.25	39.41	24.80	55.31	8063.00	62.95	289.41
Kyushu University	90	9812.38	49.62	526.17	81.49	3794.75	38.76	26.80	56.52	7793.00	62.76	289.15
University of New South Wales	91	8747.61	49.10	568.67	82.49	3215.17	37.75	27.00	56.64	7604.00	62.63	288.60
National Taiwan University	92	9408.25	49.42	654.00	84.49	3197.42	37.71	23.20	54.34	7449.00	62.52	288.49
University of Cincinnati	93	9387.72	49.41	471.83	80.21	3253.17	37.81	28.80	57.74	8546.00	63.29	288.46
Universitat de Barcelona	94	9095.15	49.27	575.50	82.65	3367.50	38.01	24.80	55.31	7992.00	62.90	288.14
The University of Texas Southwestern Medical Center at Dallas	95	10990.95	50.20	559.08	82.26	2647.34	36.76	25.20	55.55	8518.00	63.27	288.05
Swiss Federal Institute of Technology ETH Zürich	96	10077.08	49.75	441.83	79.50	2568.34	36.62	30.20	58.58	8849.00	63.51	287.97
University of Groningen	97	9492.99	49.46	510.83	81.13	3102.92	37.55	27.00	56.64	8309.00	63.13	287.91
Universität Basel	98	9202.95	49.32	477.42	80.34	2800.50	37.02	29.20	57.98	8196.00	63.05	287.71
Zhejiang University	99	7807.59	48.63	756.42	86.90	3370.25	38.02	20.00	52.40	6350.00	61.74	287.69
University of Illinois Chicago	100	9455.53	49.45	473.08	80.24	3619.08	38.45	26.60	56.40	8189.00	63.04	287.58

Table B.5: Natural Sciences (*SCI*)

University	Rank	JIT¹	Score¹	Total Article Count²	Score²	Total Document Count³	Score³	H-Index⁴	Score⁴	Total Citation Count⁵	Score⁵	TOTAL SCORE
University of California Berkeley	1	62335.08	88.18	2802.83	135.39	16169.92	60.11	70.40	84.15	57846.00	110.77	478.59
Harvard University	2	64921.38	90.00	2263.25	122.36	11080.42	51.12	79.40	90.00	62380.00	115.00	468.48
University of Tokyo	3	57776.88	84.98	2994.00	140.00	18941.75	65.00	53.40	73.09	40461.00	94.56	457.64
Massachusetts Institute of Technology	4	50745.67	80.04	2096.25	118.33	13036.91	54.57	66.80	81.81	48664.00	102.21	436.96
California Institute of Technology Caltech	5	49565.25	79.21	2161.33	119.90	13648.75	55.65	62.60	79.08	37311.00	91.63	425.47
Stanford University	6	44249.29	75.48	1838.17	112.10	10804.59	50.63	66.60	81.68	44081.00	97.94	417.83
University of Cambridge	7	40281.87	72.69	1922.08	114.13	10892.33	50.79	55.40	74.39	37614.00	91.91	403.91
University of Oxford	8	37727.16	70.89	1980.08	115.53	9803.75	48.86	51.40	71.79	31214.00	85.94	393.02
Kyoto University	9	37029.63	70.40	2107.92	118.61	13297.50	55.03	44.00	66.98	26700.00	81.73	392.76
University of California Los Angeles	10	35921.94	69.62	1711.17	109.04	9650.08	48.59	55.80	74.65	34673.00	89.17	391.08
University of Michigan Ann Arbor	11	34399.11	68.55	1736.25	109.64	10196.92	49.56	50.20	71.01	32488.00	87.13	385.90
University of Washington Seattle	12	32738.47	67.39	1621.50	106.87	8621.92	46.78	56.00	74.78	32741.00	87.36	383.19
University of California San Diego	13	33370.83	67.83	1619.83	106.83	8945.83	47.35	49.00	70.23	28152.00	83.09	375.33
Pennsylvania State University	14	28278.94	64.25	1549.33	105.13	9260.08	47.90	50.40	71.14	25817.00	80.91	369.34
Université Paris 6 Pierre and Marie Curie	15	29876.80	65.38	1719.83	109.25	9327.67	48.02	45.40	67.89	23531.00	78.78	369.32
Tohoku University	16	26431.64	62.96	1739.33	109.72	12202.83	53.10	39.20	63.86	20014.00	75.50	365.13
University of Wisconsin Madison	17	29555.99	65.15	1497.50	103.88	8631.75	46.79	45.20	67.76	25018.00	80.16	363.75
University of Maryland	18	27856.25	63.96	1540.25	104.91	8513.09	46.59	45.80	68.15	23375.00	78.63	362.24
Imperial College	19	27076.91	63.41	1494.75	103.82	8244.50	46.11	47.20	69.06	24283.00	79.48	361.88

Johns Hopkins University	20	29274.13	64.95	1343.08	100.16	7146.92	44.17	50.80	71.40	25595.00	80.70	361.39
Osaka University	21	28187.29	64.19	1573.42	105.71	11660.42	52.14	39.20	63.86	19807.00	75.31	361.21
Peking University	22	22382.82	60.11	1921.50	114.12	10015.58	49.24	38.00	63.08	18767.00	74.34	360.88
University of Toronto	23	27445.05	63.67	1481.75	103.50	7671.50	45.10	45.20	67.76	24571.00	79.75	359.78
Swiss Federal Institute of Technology ETH Zürich	24	26751.56	63.18	1575.33	105.76	8503.50	46.57	42.60	66.07	22738.00	78.04	359.62
Columbia University New York	25	26917.53	63.30	1240.50	97.68	6864.67	43.67	51.40	71.79	26035.00	81.11	357.56
University of Texas Austin	26	25871.43	62.56	1427.50	102.19	8438.08	46.45	44.20	67.11	22910.00	78.20	356.52
Princeton University	27	26437.13	62.96	1256.67	98.07	7391.34	44.60	49.80	70.75	23516.00	78.76	355.15
University of Illinois Urbana Champaign	28	27578.64	63.76	1324.08	99.70	8515.41	46.59	44.00	66.98	22786.00	78.08	355.11
Université Paris XI Sud	29	25251.67	62.13	1637.92	107.27	8516.33	46.59	40.40	64.64	18639.00	74.22	354.84
Yale University	30	28562.05	64.45	1186.67	96.38	6444.75	42.93	50.80	71.40	23278.00	78.54	353.71
Cornell University	31	27100.06	63.43	1209.58	96.93	7336.75	44.51	48.20	69.71	23621.00	78.86	353.44
University of Arizona	32	26512.38	63.01	1301.67	99.16	8275.92	46.17	46.80	68.80	20874.00	76.30	353.44
Tsinghua University China	33	19431.12	58.04	1702.83	108.84	10308.25	49.76	36.80	62.30	18280.00	73.88	352.81
University of California Santa Barbara	34	25802.99	62.51	1151.50	95.53	7042.67	43.99	48.40	69.84	24169.00	79.37	351.25
University of Colorado Boulder	35	23509.68	60.90	1365.50	100.70	7639.42	45.04	46.60	68.67	20468.00	75.92	351.23
Zhejiang University	36	18470.62	57.36	1810.42	111.43	10686.92	50.42	31.60	58.92	16746.00	72.45	350.59
University of Science and Technology of China	37	21006.83	59.14	1654.33	107.67	9292.25	47.96	36.80	62.30	16497.00	72.22	349.29
Northwestern University	38	25053.94	61.99	1156.67	95.66	6869.33	43.68	47.20	69.06	22195.00	77.53	347.92
Lomonosov Moscow State University	39	15158.54	55.04	2046.83	117.14	12017.66	52.77	26.60	55.66	9223.00	65.44	346.05
University College London	40	24203.36	61.39	1440.08	102.50	6985.50	43.89	38.80	63.60	18511.00	74.10	345.47
Ohio State University	41	23073.18	60.60	1268.58	98.36	7040.17	43.98	44.60	67.37	19620.00	75.13	345.44
Seoul National University	42	20859.24	59.04	1472.83	103.29	8199.75	46.03	36.40	62.04	16792.00	72.49	342.89

University of Pennsylvania	43	24181.75	61.38	1025.50	92.49	5687.67	41.60	48.60	69.97	21719.00	77.09	342.52
Nanjing University	44	18280.54	57.23	1712.08	109.06	8909.17	47.28	31.40	58.79	14264.00	70.14	342.50
Tokyo Institute of Technology	45	21507.61	59.50	1328.33	99.80	9052.67	47.54	36.80	62.30	15738.00	71.51	340.64
University of Chicago	46	24017.75	61.26	987.17	91.57	5897.00	41.97	47.40	69.19	20069.00	75.55	339.53
University of Manchester	47	21751.05	59.67	1219.42	97.17	6970.25	43.86	38.20	63.21	18471.00	74.06	337.97
University of California Davis	48	22339.59	60.08	1124.75	94.89	6409.25	42.87	40.00	64.38	18652.00	74.23	336.44
National University of Singapore	49	18156.21	57.14	1367.25	100.74	7208.67	44.28	35.20	61.26	17007.00	72.69	336.11
University of British Columbia	50	20618.33	58.87	1210.58	96.96	6301.17	42.68	39.20	63.86	17936.00	73.56	335.93
Texas A&M University	51	18523.64	57.40	1236.42	97.58	7040.59	43.99	38.00	63.08	16243.00	71.98	334.03
University of Minnesota	52	19843.55	58.33	1118.42	94.73	6656.50	43.31	37.20	62.56	17312.00	72.98	331.90
University of Florida	53	18825.29	57.61	1104.50	94.40	6830.92	43.61	38.20	63.21	16579.00	72.30	331.13
National Taiwan University	54	17817.57	56.90	1337.25	100.01	7486.75	44.77	32.00	59.18	14268.00	70.14	331.01
Purdue University	55	18068.58	57.08	1059.17	93.30	6691.25	43.37	38.60	63.47	16069.00	71.82	329.04
University of Paris Diderot (Paris 7)	56	17953.73	57.00	1194.75	96.58	5436.50	41.15	39.00	63.73	13837.00	69.74	328.19
Georgia Institute of Technology	57	15122.58	55.01	986.42	91.55	7000.91	43.92	39.80	64.25	17607.00	73.25	327.98
Duke University	58	17911.67	56.97	899.67	89.45	5260.17	40.84	42.80	66.20	18307.00	73.91	327.37
Universidade de São Paulo	59	15887.06	55.55	1311.83	99.40	7841.00	45.40	31.20	58.66	12275.00	68.28	327.29
University of Edinburgh	60	19017.37	57.75	976.17	91.30	5437.00	41.15	40.60	64.77	16077.00	71.83	326.80
Università degli Studi di Padova	61	17335.57	56.57	1143.67	95.34	5933.34	42.03	37.00	62.43	12786.00	68.76	325.12
Fudan University (Shanghai Medical University)	62	14993.31	54.92	1192.33	96.52	6366.59	42.79	33.40	60.09	13354.00	69.29	323.61
école Polytechnique Fédérale de Lausanne	63	16699.30	56.12	884.17	89.08	5906.17	41.98	40.20	64.51	16104.00	71.85	323.54
Nagoya University	64	17225.41	56.49	1069.42	93.55	7274.00	44.40	33.60	60.22	12879.00	68.85	323.50
Università degli Studi di Roma La Sapienza	65	17666.53	56.80	1084.92	93.92	6726.33	43.43	34.80	61.00	12064.00	68.09	323.24

University of California Irvine	66	17227.61	56.49	966.50	91.07	5399.75	41.09	38.60	63.47	14922.00	70.75	322.86
Rutgers University	67	17081.91	56.39	971.50	91.19	5623.83	41.48	37.20	62.56	14216.00	70.09	321.71
Utrecht University	68	16195.74	55.76	1014.17	92.22	5386.00	41.06	35.60	61.52	15301.00	71.10	321.67
Ludwig Maximilians Universität München	69	17207.96	56.48	917.25	89.88	5210.84	40.75	38.80	63.60	14844.00	70.68	321.38
Jilin University	70	12330.27	53.05	1389.92	101.29	6801.00	43.56	26.60	55.66	10333.00	66.47	320.03
McGill University	71	17340.11	56.57	937.08	90.36	5356.08	41.01	36.20	61.91	13239.00	69.18	319.02
Universitat de Barcelona	72	16761.13	56.16	1048.33	93.04	5717.50	41.65	32.20	59.31	12642.00	68.62	318.78
University of Bristol	73	16642.29	56.08	937.67	90.37	5689.83	41.60	34.00	60.48	12806.00	68.78	317.30
Technische Universität München	74	14800.35	54.78	1033.42	92.68	5530.58	41.32	32.60	59.57	11910.00	67.94	316.29
Ruprecht Karls Universität Heidelberg	75	16489.07	55.97	921.42	89.98	4802.25	40.03	36.20	61.91	12309.00	68.31	316.20
Michigan State University	76	15028.09	54.94	895.67	89.36	5436.00	41.15	36.40	62.04	12387.00	68.39	315.88
Nanyang Technological University	77	12248.06	52.99	1128.33	94.97	5896.08	41.96	30.40	58.14	11310.00	67.38	315.45
Universidad Nacional Autónoma de México	78	14006.37	54.23	1157.67	95.68	7333.75	44.50	26.60	55.66	8870.00	65.11	315.18
Shanghai Jiao Tong University	79	11622.41	52.55	1155.00	95.62	6638.75	43.28	28.00	56.58	11049.00	67.14	315.16
Nankai University	80	11778.70	52.66	1115.33	94.66	5839.51	41.86	31.60	58.92	10473.00	66.60	314.70
Washington University Saint Louis	81	15926.70	55.58	700.33	84.64	4013.42	38.64	40.60	64.77	15141.00	70.95	314.58
Australian National University	82	16047.48	55.66	886.00	89.12	6031.75	42.20	32.20	59.31	11857.00	67.89	314.19
Iowa State University	83	14674.33	54.70	807.67	87.23	5138.83	40.63	37.00	62.43	12362.00	68.36	313.35
University of California Santa Cruz	84	15695.01	55.41	665.00	83.79	3927.16	38.49	42.20	65.81	13433.00	69.36	312.86
University of Hawaii at Manoa	85	15176.86	55.05	767.00	86.25	4433.67	39.38	38.40	63.34	12451.00	68.45	312.47
New York University	86	14404.86	54.51	794.67	86.92	3949.42	38.53	38.20	63.21	12745.00	68.72	311.88
University of North Carolina Chapel Hill	87	14500.10	54.57	772.67	86.39	4226.17	39.02	36.20	61.91	14113.00	70.00	311.88
Arizona State University	88	14007.20	54.23	825.83	87.67	5019.75	40.42	34.60	60.87	12150.00	68.17	311.35

University of Sydney	89	13955.28	54.19	851.58	88.29	5318.42	40.94	32.80	59.70	11582.00	67.64	310.76
Boston University	90	13834.30	54.11	779.58	86.56	4374.34	39.28	36.00	61.78	12443.00	68.44	310.15
Università di Bologna	91	14381.43	54.49	918.08	89.90	5396.75	41.08	30.20	58.01	10275.00	66.42	309.89
Durham University	92	13610.27	53.95	784.17	86.67	4885.75	40.18	35.80	61.65	11253.00	67.33	309.77
Catholic University of Leuven	93	13067.35	53.57	984.92	91.51	5307.58	40.92	28.60	56.97	10558.00	66.68	309.65
University of Pittsburgh	94	14804.68	54.79	780.83	86.59	4340.83	39.22	34.00	60.48	12100.00	68.12	309.19
Uppsala University	95	14215.73	54.37	884.08	89.08	4693.67	39.84	31.00	58.53	11060.00	67.15	308.97
University of Southampton	96	13711.03	54.02	874.92	88.86	5187.50	40.71	31.20	58.66	10598.00	66.72	308.96
University of Melbourne	97	12991.73	53.51	815.58	87.42	4539.92	39.57	33.60	60.22	11542.00	67.60	308.32
University of Copenhagen	98	12925.99	53.47	908.00	89.65	3821.17	38.30	32.60	59.57	11203.00	67.28	308.27
University of Alberta	99	13465.28	53.85	930.33	90.19	5222.25	40.77	28.20	56.71	10472.00	66.60	308.12
Université Joseph Fourier Grenoble 1	100	13348.69	53.76	846.33	88.17	4303.41	39.15	32.60	59.57	10501.00	66.63	307.28

Table B.6: Social Sciences (SOC)

University	Rank	JIT ¹	Score ¹	Total Article Count ²	Score ²	Total Document Count ³	Score ³	H-Index ⁴	Score ⁴	Total Citation Count ⁵	Score ⁵	TOTAL SCORE
Harvard University	1	11524.75	90.00	1259.25	140.00	7627.84	65.00	29.60	90.00	13891.00	115.00	500.00
University of Michigan Ann Arbor	2	6436.48	69.99	832.92	115.87	5030.16	53.71	23.60	79.69	7829.00	89.77	409.04
Columbia University New York	3	5571.35	66.59	731.17	110.11	4977.50	53.48	21.60	76.26	6480.00	84.15	390.60
University of North Carolina Chapel Hill	4	5747.60	67.29	722.50	109.62	4449.08	51.19	20.80	74.89	6643.00	84.83	387.81
University of Toronto	5	4758.87	63.40	836.25	116.06	5084.08	53.95	19.00	71.79	5611.00	80.53	385.73
University of Washington Seattle	6	5157.15	64.96	653.83	105.73	4056.42	49.48	22.40	77.63	6309.00	83.44	381.25
University of California Los Angeles	7	5252.67	65.34	756.00	111.52	4614.75	51.91	19.20	72.14	5517.00	80.14	381.04
University of Pennsylvania	8	4868.00	63.83	679.50	107.19	4232.75	50.25	20.80	74.89	5684.00	80.84	376.98
University of California Berkeley	9	4537.16	62.53	735.33	110.35	4532.92	51.55	20.00	73.51	5152.00	78.62	376.56
Johns Hopkins University	10	5285.08	65.47	550.92	99.91	3539.50	47.23	20.80	74.89	5303.00	79.25	366.75
University of Minnesota	11	4569.03	62.65	583.92	101.78	3734.00	48.08	19.80	73.17	5028.00	78.11	363.78
Stanford University	12	3949.62	60.22	654.92	105.79	3731.67	48.07	19.60	72.82	4719.00	76.82	363.72
Yale University	13	3880.85	59.95	650.67	105.55	4056.50	49.48	19.20	72.14	4103.00	74.26	361.37
New York University	14	3734.96	59.37	689.50	107.75	4342.25	50.72	17.20	68.70	4106.00	74.27	360.82
University of Oxford	15	3185.12	57.21	701.50	108.43	4215.00	50.17	17.40	69.05	3745.00	72.76	357.62
University of Chicago	16	3441.80	58.22	542.67	99.44	4042.33	49.42	19.80	73.17	3873.00	73.30	353.55
University of Wisconsin Madison	17	3081.12	56.80	551.33	99.93	3644.17	47.69	17.80	69.73	4049.00	74.03	348.19
Northwestern University	18	3456.55	58.28	545.17	99.58	3265.25	46.04	18.00	70.08	4000.00	73.83	347.81
Pennsylvania State University	19	3304.87	57.68	606.25	103.04	3791.17	48.33	15.60	65.95	3676.00	72.48	347.48

University of British Columbia	20	3396.06	58.04	549.83	99.85	3586.16	47.44	17.20	68.70	3687.00	72.52	346.55
Duke University	21	3671.61	59.12	497.00	96.86	3175.83	45.65	17.80	69.73	3995.00	73.81	345.17
University College London	22	3158.43	57.11	527.42	98.58	3761.50	48.20	16.80	68.02	3279.00	70.82	342.72
University of Texas Austin	23	2814.22	55.75	587.17	101.96	3573.91	47.38	16.00	66.64	3100.00	70.08	341.82
University of Sydney	24	2697.62	55.30	613.42	103.45	3679.50	47.84	15.00	64.92	3074.00	69.97	341.48
Ohio State University	25	3164.88	57.13	520.75	98.20	3389.16	46.58	16.00	66.64	3526.00	71.85	340.41
University of Southern California	26	3250.84	57.47	478.25	95.80	3001.17	44.89	18.00	70.08	3592.00	72.13	340.36
University of Pittsburgh	27	3247.63	57.46	413.92	92.15	2978.92	44.80	18.20	70.42	3868.00	73.28	338.11
University of Cambridge	28	2324.71	53.83	560.58	100.46	3732.00	48.07	16.20	66.98	2766.00	68.69	338.03
University of Melbourne	29	2769.75	55.58	544.25	99.53	3192.83	45.73	15.80	66.30	3079.00	69.99	337.13
University of Queensland	30	2692.48	55.27	546.50	99.66	2990.41	44.85	16.00	66.64	3153.00	70.30	336.72
University of Maryland	31	3052.12	56.69	459.25	94.72	3152.58	45.55	16.40	67.33	3420.00	71.41	335.70
Cornell University	32	2670.05	55.19	481.58	95.98	3255.25	46.00	16.20	66.98	3226.00	70.60	334.76
Michigan State University	33	2755.43	55.52	463.42	94.96	2982.42	44.81	15.40	65.61	3015.00	69.73	330.63
University of Manchester	34	2346.68	53.92	483.67	96.10	3729.00	48.06	14.20	63.55	2753.00	68.64	330.26
University of California San Francisco	35	3548.25	58.64	371.50	89.75	1764.50	39.52	17.80	69.73	3595.00	72.14	329.79
Boston University	36	2896.21	56.08	401.42	91.45	2787.17	43.96	16.60	67.67	3165.00	70.35	329.51
University of Amsterdam	37	2568.48	54.79	522.00	98.27	2805.83	44.05	14.00	63.21	2705.00	68.44	328.75
Erasmus University	38	2805.10	55.72	471.08	95.39	2010.75	40.59	16.00	66.64	3047.00	69.86	328.20
Emory University	39	3181.48	57.20	371.17	89.73	2434.33	42.43	16.40	67.33	3184.00	70.43	327.12
Indiana University	40	2235.17	53.48	492.67	96.61	3410.00	46.67	14.00	63.21	2357.00	66.99	326.95
University of Nottingham	41	2065.47	52.81	480.50	95.92	3240.75	45.94	14.60	64.24	2381.00	67.09	325.99
Arizona State University	42	2345.09	53.91	431.83	93.17	3007.08	44.92	14.40	63.89	2534.00	67.72	323.61

University of California Davis	43	2355.61	53.95	357.67	88.97	2372.17	42.16	16.80	68.02	2973.00	69.55	322.65
McGill University	44	2512.97	54.57	408.33	91.84	2497.41	42.71	15.00	64.92	2475.00	67.48	321.51
University of Florida	45	2388.00	54.08	400.58	91.40	2628.67	43.28	14.20	63.55	2562.00	67.84	320.14
Utrecht University	46	2287.33	53.68	409.25	91.89	2175.83	41.31	15.00	64.92	2657.00	68.24	320.04
London School of Economics and Political Science	47	1990.27	52.51	437.50	93.49	2994.33	44.86	13.80	62.86	2126.00	66.03	319.76
VU University of Amsterdam	48	2338.98	53.88	407.00	91.76	1878.00	40.01	14.80	64.58	2892.00	69.21	319.46
Karolinska Institute	49	2936.63	56.23	299.67	85.69	1496.25	38.35	17.40	69.05	3035.00	69.81	319.13
Monash University	50	1774.16	51.66	526.92	98.55	2687.66	43.53	12.20	60.11	1885.00	65.02	318.88
University of Illinois Chicago	51	2189.69	53.30	383.42	90.43	2620.17	43.24	14.80	64.58	2428.00	67.28	318.83
Texas A&M University	52	2141.43	53.11	387.25	90.64	2425.25	42.39	14.80	64.58	2425.00	67.27	318.00
Rutgers University	53	1917.16	52.23	407.08	91.77	3116.00	45.39	13.20	61.83	2037.00	65.65	316.87
University of California San Diego	54	2319.94	53.81	313.17	86.45	2087.25	40.92	16.20	66.98	2731.00	68.54	316.71
Princeton University	55	1533.56	50.72	347.17	88.38	2808.00	44.06	16.20	66.98	2185.00	66.27	316.41
Vanderbilt University	56	2081.16	52.87	352.92	88.70	2197.00	41.40	15.80	66.30	2269.00	66.62	315.89
University of Copenhagen	57	2193.18	53.31	371.08	89.73	1821.91	39.77	15.20	65.27	2436.00	67.32	315.39
Massachusetts Institute of Technology	58	2137.14	53.09	297.42	85.56	1996.67	40.53	15.80	66.30	2848.00	69.03	314.51
University of Arizona	59	2049.48	52.75	354.50	88.79	2441.67	42.46	14.20	63.55	2336.00	66.90	314.45
University of Iowa	60	2031.26	52.68	345.33	88.27	2261.59	41.68	14.80	64.58	2218.00	66.41	313.62
University of Alberta	61	2352.09	53.94	374.50	89.92	2447.42	42.49	12.20	60.11	2076.00	65.82	312.28
University of Georgia	62	1949.47	52.35	381.58	90.32	2370.91	42.16	13.00	61.49	2045.00	65.69	312.01
Washington University Saint Louis	63	2138.49	53.10	341.33	88.05	2006.59	40.57	14.20	63.55	2294.00	66.72	311.99
University of California Irvine	64	1890.62	52.12	318.83	86.77	2247.58	41.62	15.00	64.92	2248.00	66.53	311.97
Florida State University	65	1724.04	51.47	383.00	90.40	2340.83	42.02	13.00	61.49	2087.00	65.86	311.25

University of Bristol	66	1862.31	52.01	294.00	85.37	2462.67	42.55	15.00	64.92	2113.00	65.97	310.83
University of Edinburgh	67	1610.72	51.02	334.50	87.66	3298.67	46.19	12.60	60.80	1900.00	65.08	310.75
University of New South Wales	68	1764.84	51.63	397.00	91.20	2167.66	41.27	13.00	61.49	1865.00	64.94	310.52
University of Virginia	69	1809.51	51.80	341.08	88.03	2714.42	43.65	13.40	62.18	1820.00	64.75	310.41
Australian National University	70	1481.31	50.51	432.00	93.18	2642.58	43.34	11.80	59.43	1559.00	63.67	310.12
University of Oslo	71	1907.55	52.19	368.33	89.57	1770.00	39.54	13.20	61.83	1919.00	65.16	308.30
University of Illinois Urbana Champaign	72	1714.07	51.43	343.83	88.19	2664.75	43.43	12.00	59.77	1875.00	64.98	307.80
University of Leeds	73	1469.84	50.47	357.00	88.93	2662.08	43.42	12.20	60.11	1759.00	64.50	307.43
Ghent University	74	1440.40	50.35	409.58	91.91	1667.66	39.10	12.80	61.15	1819.00	64.75	307.25
University of Birmingham	75	1659.20	51.21	326.67	87.22	2935.34	44.61	11.80	59.43	1722.00	64.34	306.81
University of Groningen	76	1732.91	51.50	361.50	89.19	1848.58	39.89	12.60	60.80	1873.00	64.97	306.35
National University of Singapore	77	1879.23	52.08	343.25	88.15	2040.91	40.72	12.40	60.46	1795.00	64.65	306.06
University of South Carolina	78	1879.29	52.08	283.25	84.76	1891.91	40.07	13.80	62.86	2119.00	66.00	305.77
University of Maastricht	79	2041.60	52.72	325.67	87.16	1506.50	38.40	13.00	61.49	2069.00	65.79	305.55
McMaster University	80	1893.38	52.13	265.33	83.74	1701.25	39.25	14.60	64.24	2130.00	66.04	305.40
King's College London	81	1507.66	50.62	319.08	86.79	2780.58	43.94	12.00	59.77	1601.00	63.84	304.95
Imperial College	82	1869.97	52.04	216.25	80.97	1148.84	36.85	16.80	68.02	2343.00	66.93	304.80
Purdue University	83	1615.72	51.04	331.33	87.48	2055.09	40.78	12.40	60.46	1818.00	64.74	304.51
University of Hong Kong	84	1594.68	50.96	344.58	88.23	1585.33	38.74	13.20	61.83	1749.00	64.46	304.22
Brown University	85	1682.47	51.30	264.75	83.71	1939.16	40.28	14.20	63.55	1766.00	64.53	303.37
George Washington University	86	1717.48	51.44	325.33	87.14	2002.58	40.56	11.80	59.43	1549.00	63.62	302.19
Catholic University of Leuven	87	1404.07	50.21	341.33	88.05	1635.00	38.96	12.60	60.80	1657.00	64.07	302.09
University of Western Ontario	88	1506.29	50.61	304.42	85.96	1923.92	40.21	12.40	60.46	1764.00	64.52	301.76

University of Miami	89	1718.63	51.45	288.67	85.07	2054.75	40.78	12.00	59.77	1728.00	64.37	301.43
Georgetown University	90	1723.94	51.47	268.75	83.94	2413.50	42.34	12.40	60.46	1417.00	63.07	301.28
University of Warwick	91	1352.93	50.01	310.50	86.30	2495.17	42.70	11.40	58.74	1518.00	63.49	301.24
University of Sheffield	92	1412.73	50.24	294.25	85.38	2266.25	41.70	11.80	59.43	1547.00	63.62	300.37
Université de Montreal	93	1684.42	51.31	304.33	85.95	1867.84	39.97	11.60	59.08	1533.00	63.56	299.87
University of Connecticut Storrs	94	1550.42	50.78	284.67	84.84	1748.08	39.45	12.40	60.46	1675.00	64.15	299.68
University of Colorado Boulder	95	1356.44	50.02	275.17	84.30	2111.33	41.03	12.00	59.77	1538.00	63.58	298.70
Aarhus University	96	1481.11	50.51	287.75	85.01	1287.50	37.45	13.20	61.83	1527.00	63.53	298.34
York University	97	1308.06	49.83	292.50	85.28	2122.75	41.08	11.60	59.08	1337.00	62.74	298.02
University of Utah	98	1460.61	50.43	220.08	81.18	1508.00	38.41	14.20	63.55	1708.00	64.29	297.86
University of Helsinki	99	1544.34	50.76	272.58	84.15	1606.58	38.83	12.40	60.46	1472.00	63.30	297.51
Université d'Ottawa University of Ottawa	100	1503.18	50.60	269.67	83.99	1899.58	40.11	11.60	59.08	1512.00	63.47	297.25

APPENDIX C

Field Based Ranking of Turkish Universities

Table C.1: Agriculture & Env. Sciences (AGE)

No	University	Score	Rank
1	ANKARA ÜNİVERSİTESİ	289.92	199
2	EGE ÜNİVERSİTESİ	284.64	245
3	ERCIYES ÜNİVERSİTESİ	283.17	257
4	ATATÜRK ÜNİVERSİTESİ	282.82	262
5	SELÇUK ÜNİVERSİTESİ	279.50	304
6	İSTANBUL ÜNİVERSİTESİ	275.89	346
7	ÇUKUROVA ÜNİVERSİTESİ	274.53	363
8	HACETTEPE ÜNİVERSİTESİ	269.75	441
9	ORTA DOĞU TEKNİK ÜNİVERSİTESİ	269.40	448
10	ONDOKUZ MAYIS ÜNİVERSİTESİ	267.99	473
11	SÜLEYMAN DEMİREL ÜNİVERSİTESİ	267.83	477
12	İSTANBUL TEKNİK ÜNİVERSİTESİ	267.80	478
13	ULUDAĞ ÜNİVERSİTESİ	267.48	486
14	GAZİOSMAN PAŞA ÜNİVERSİTESİ	265.73	519
15	GAZİ ÜNİVERSİTESİ	265.39	525
16	KARADENİZ TEKNİK ÜNİVERSİTESİ	264.72	534
17	AKDENİZ ÜNİVERSİTESİ	264.52	536
18	FIRAT ÜNİVERSİTESİ	263.17	570
19	MUSTAFA KEMAL ÜNİVERSİTESİ	262.81	578
20	DOKUZ EYLÜL ÜNİVERSİTESİ	262.38	586
21	ADNAN MENDERES ÜNİVERSİTESİ	260.37	637
22	YÜZÜNCÜ YIL ÜNİVERSİTESİ	260.29	639
23	ANADOLU ÜNİVERSİTESİ	259.83	648
24	HARRAN ÜNİVERSİTESİ	257.81	695
25	ÇANAKKALE ONSEKİZ MART ÜNİVERSİTESİ	257.17	717

26	YILDIZ TEKNİK ÜNİVERSİTESİ	256.83	728
27	ESKİŞEHİR OSMANGAZİ ÜNİVERSİTESİ	256.00	753
28	PAMUKKALE ÜNİVERSİTESİ	254.67	794
29	MERSİN ÜNİVERSİTESİ	254.64	796
30	İNÖNÜ ÜNİVERSİTESİ	253.32	837
31	DİCLE ÜNİVERSİTESİ	252.73	846
32	MUĞLA ÜNİVERSİTESİ	247.96	910
33	KAFKAS ÜNİVERSİTESİ	244.70	934
34	AFYON KOCATEPE ÜNİVERSİTESİ	244.18	940
35	BALIKESİR ÜNİVERSİTESİ	234.07	977
36	GAZİANTEP ÜNİVERSİTESİ	232.69	987
37	BOĞAZIÇI ÜNİVERSİTESİ	222.96	1028
38	CUMHURİYET ÜNİVERSİTESİ	222.27	1032
39	MARMARA ÜNİVERSİTESİ	221.26	1036
40	CELAL BAYAR ÜNİVERSİTESİ	220.81	1037
41	GEBZE YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	218.96	1042
42	KIRIKKALE ÜNİVERSİTESİ	216.99	1049
43	NİĞDE ÜNİVERSİTESİ	214.72	1058
44	TRAKYA ÜNİVERSİTESİ	212.06	1062
45	ABANT İZZET BAYSAL ÜNİVERSİTESİ	209.36	1075
46	SAKARYA ÜNİVERSİTESİ	205.52	1092
47	KAHRAMANMARAŞ SÜTÇÜ İMAM ÜNİVERSİTESİ	204.08	1098
48	İZMİR YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	203.09	1104
49	KOCAELİ ÜNİVERSİTESİ	196.28	1119
50	NAMIK KEMAL ÜNİVERSİTESİ	173.79	1195
51	ZONGULDAK KARAEMLAS ÜNİVERSİTESİ	161.10	1223
52	AKSARAY ÜNİVERSİTESİ	152.94	1250
53	YEDİTEPE ÜNİVERSİTESİ	151.58	1252
54	RİZE ÜNİVERSİTESİ	151.19	1254
55	SABANCI ÜNİVERSİTESİ	140.55	1288
56	MEHMET AKİF ERSOY ÜNİVERSİTESİ	139.88	1294
57	GİRESUN ÜNİVERSİTESİ	139.63	1295
58	DÜZCE ÜNİVERSİTESİ	127.91	1345
59	BOZOK ÜNİVERSİTESİ	116.24	1392
60	ADİYAMAN ÜNİVERSİTESİ	115.14	1400
61	AHI EVRAN ÜNİVERSİTESİ	112.31	1405
62	DUMLUPINAR ÜNİVERSİTESİ	97.64	1485
63	BİNGÖL ÜNİVERSİTESİ	94.30	1504

64	SINOP ÜNİVERSİTESİ	93.55	1510
65	FATİH ÜNİVERSİTESİ	92.21	1523
66	BAŞKENT ÜNİVERSİTESİ	68.23	1627
67	GÜLHANE ASKERİ TIP AKADEMİSİ	63.42	1655
68	ERZİNCAN ÜNİVERSİTESİ	58.58	1685
69	ÇANKIRI KARATEKİN ÜNİVERSİTESİ	54.13	1709
70	BİLKENT ÜNİVERSİTESİ	35.04	1818
71	BAHÇEŞEHİR ÜNİVERSİTESİ	31.20	1841
72	ÇANKAYA ÜNİVERSİTESİ	15.73	1924
73	ATILIM ÜNİVERSİTESİ	14.75	1932
74	KARABÜK ÜNİVERSİTESİ	13.79	1935
75	KOÇ ÜNİVERSİTESİ	11.91	1947
76	İSTANBUL BİLİM ÜNİVERSİTESİ	6.97	1967
77	TOBB EKONOMİ VE TEKNOLOJİ ÜNİVERSİTESİ	6.82	1969
78	İZMİR EKONOMİ ÜNİVERSİTESİ	4.88	1975
79	DOĞUŞ ÜNİVERSİTESİ	2.84	1985
80	UFUK ÜNİVERSİTESİ	0.00	1999

Table C.2: Clinical Medicine (MED)

No	University	Score	Rank
1	İSTANBUL ÜNİVERSİTESİ	278.97	169
2	HACETTEPE ÜNİVERSİTESİ	274.14	215
3	ANKARA ÜNİVERSİTESİ	266.09	294
4	EGE ÜNİVERSİTESİ	264.39	325
5	GAZİ ÜNİVERSİTESİ	263.80	342
6	BAŞKENT ÜNİVERSİTESİ	262.86	362
7	GÜLHANE ASKERİ TIP AKADEMİSİ	260.99	400
8	MARMARA ÜNİVERSİTESİ	260.22	426
9	DOKUZ EYLÜL ÜNİVERSİTESİ	259.03	460
10	ERCIYES ÜNİVERSİTESİ	257.70	508
11	SELÇUK ÜNİVERSİTESİ	256.87	535
12	AKDENİZ ÜNİVERSİTESİ	256.77	540
13	ULUDAĞ ÜNİVERSİTESİ	256.59	550
14	ONDOKUZ MAYIS ÜNİVERSİTESİ	256.07	574
15	ATATÜRK ÜNİVERSİTESİ	255.89	581
16	ÇUKUROVA ÜNİVERSİTESİ	255.06	626
17	KOCAELİ ÜNİVERSİTESİ	254.85	637
18	YEDİTEPE ÜNİVERSİTESİ	254.78	644
19	KARADENİZ TEKNİK ÜNİVERSİTESİ	254.66	648
20	GAZİANTEP ÜNİVERSİTESİ	254.58	654
21	İNÖNÜ ÜNİVERSİTESİ	254.12	675
22	DİCLE ÜNİVERSİTESİ	254.05	678
23	TRAKYA ÜNİVERSİTESİ	253.98	679
24	SÜLEYMAN DEMİREL ÜNİVERSİTESİ	253.58	698
25	PAMUKKALE ÜNİVERSİTESİ	253.04	739
26	FIRAT ÜNİVERSİTESİ	253.00	743
27	CELAL BAYAR ÜNİVERSİTESİ	252.82	753
28	HARRAN ÜNİVERSİTESİ	252.71	761
29	ESKİŞEHİR OSMANGAZİ ÜNİVERSİTESİ	252.52	777
30	CUMHURİYET ÜNİVERSİTESİ	252.36	790
31	MERSİN ÜNİVERSİTESİ	252.34	792
32	YÜZÜNCÜ YIL ÜNİVERSİTESİ	252.08	807
33	KIRIKKALE ÜNİVERSİTESİ	252.07	809
34	AFYON KOCATEPE ÜNİVERSİTESİ	251.89	819
35	ADNAN MENDERES ÜNİVERSİTESİ	251.87	820
36	FATİH ÜNİVERSİTESİ	251.49	838

37	ZONGULDAK KARAEMLAS ÜNİVERSİTESİ	251.40	841
38	ABANT İZZET BAYSAL ÜNİVERSİTESİ	250.95	863
39	GAZİOSMAN PAŞA ÜNİVERSİTESİ	250.88	871
40	MUSTAFA KEMAL ÜNİVERSİTESİ	247.40	922
41	DÜZCE ÜNİVERSİTESİ	235.23	978
42	ORTA DOĞU TEKNİK ÜNİVERSİTESİ	228.07	1001
43	UFUK ÜNİVERSİTESİ	213.52	1048
44	BOĞAZIÇI ÜNİVERSİTESİ	205.14	1063
45	İSTANBUL BİLİM ÜNİVERSİTESİ	201.59	1072
46	KAHRAMANMARAŞ SÜTÇÜ İMAM ÜNİVERSİTESİ	197.56	1083
47	BİLKENT ÜNİVERSİTESİ	171.62	1137
48	DUMLUPINAR ÜNİVERSİTESİ	160.26	1160
49	ÇANAKKALE ONSEKİZ MART ÜNİVERSİTESİ	126.17	1248
50	YILDIZ TEKNİK ÜNİVERSİTESİ	117.95	1274
51	KAFKAS ÜNİVERSİTESİ	105.27	1326
52	NAMIK KEMAL ÜNİVERSİTESİ	96.25	1358
53	İSTANBUL TEKNİK ÜNİVERSİTESİ	86.43	1389
54	KOÇ ÜNİVERSİTESİ	75.92	1436
55	SAKARYA ÜNİVERSİTESİ	73.29	1451
56	MUĞLA ÜNİVERSİTESİ	70.49	1469
57	SABANCI ÜNİVERSİTESİ	69.46	1473
58	ANADOLU ÜNİVERSİTESİ	67.92	1482
59	BALIKESİR ÜNİVERSİTESİ	67.43	1485
60	RİZE ÜNİVERSİTESİ	63.49	1506
61	İZMİR YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	51.92	1561
62	TOBB EKONOMİ VE TEKNOLOJİ ÜNİVERSİTESİ	36.99	1665
63	ADIYAMAN ÜNİVERSİTESİ	33.86	1693
64	BOZOK ÜNİVERSİTESİ	32.93	1704
65	NİĞDE ÜNİVERSİTESİ	24.10	1778
66	MEHMET AKİF ERSOY ÜNİVERSİTESİ	23.76	1781
67	AHI EVRAN ÜNİVERSİTESİ	19.65	1809
68	GİRESUN ÜNİVERSİTESİ	19.06	1817
69	ATILIM ÜNİVERSİTESİ	18.58	1823
70	DOĞUŞ ÜNİVERSİTESİ	16.86	1841
71	BAHÇEŞEHİR ÜNİVERSİTESİ	13.29	1867
72	ERZİNCAN ÜNİVERSİTESİ	11.66	1885
73	ÇANKIRI KARATEKİN ÜNİVERSİTESİ	10.89	1898
74	İZMİR EKONOMİ ÜNİVERSİTESİ	9.14	1911

75	GEBZE YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	8.63	1919
76	AKSARAY ÜNİVERSİTESİ	5.08	1954
77	SİNOP ÜNİVERSİTESİ	4.61	1956
78	ÇANKAYA ÜNİVERSİTESİ	4.00	1960
79	BİNGÖL ÜNİVERSİTESİ	2.79	1974
80	KARABÜK ÜNİVERSİTESİ	2.15	1978

Table C.3: Engineering, Computing Technology (ENG)

No	University	Score	Rank
1	ORTA DOĞU TEKNİK ÜNİVERSİTESİ	290.38	190
2	İSTANBUL TEKNİK ÜNİVERSİTESİ	288.55	202
3	GAZİ ÜNİVERSİTESİ	276.20	301
4	EGE ÜNİVERSİTESİ	269.70	400
5	ERCIYES ÜNİVERSİTESİ	268.98	415
6	YILDIZ TEKNİK ÜNİVERSİTESİ	268.04	428
7	SELÇUK ÜNİVERSİTESİ	267.86	434
8	FIRAT ÜNİVERSİTESİ	267.24	448
9	DOKUZ EYLÜL ÜNİVERSİTESİ	265.81	481
10	ATATÜRK ÜNİVERSİTESİ	265.10	495
11	HACETTEPE ÜNİVERSİTESİ	263.62	528
12	BOĞAZIÇI ÜNİVERSİTESİ	262.84	546
13	KARADENİZ TEKNİK ÜNİVERSİTESİ	262.50	552
14	ANADOLU ÜNİVERSİTESİ	261.61	570
15	KOCAELİ ÜNİVERSİTESİ	260.92	591
16	BİLKENT ÜNİVERSİTESİ	260.61	602
17	ÇUKUROVA ÜNİVERSİTESİ	258.83	637
18	GEBZE YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	258.78	638
19	ESKİŞEHİR OSMANGAZİ ÜNİVERSİTESİ	257.75	672
20	SÜLEYMAN DEMİREL ÜNİVERSİTESİ	257.27	686
21	İSTANBUL ÜNİVERSİTESİ	257.25	687
22	ANKARA ÜNİVERSİTESİ	257.07	695
23	SAKARYA ÜNİVERSİTESİ	256.35	719
24	PAMUKKALE ÜNİVERSİTESİ	254.76	771
25	MARMARA ÜNİVERSİTESİ	254.37	782
26	SABANCI ÜNİVERSİTESİ	253.04	819
27	KOÇ ÜNİVERSİTESİ	252.03	839
28	GAZİANTEP ÜNİVERSİTESİ	250.55	857
29	İZMİR YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	250.03	863
30	NİĞDE ÜNİVERSİTESİ	246.56	892
31	ULUDAĞ ÜNİVERSİTESİ	246.37	895
32	TOBB EKONOMİ VE TEKNOLOJİ ÜNİVERSİTESİ	245.77	901
33	MERSİN ÜNİVERSİTESİ	234.55	963
34	AKDENİZ ÜNİVERSİTESİ	232.84	975
35	İNÖNÜ ÜNİVERSİTESİ	218.94	1038
36	DİCLE ÜNİVERSİTESİ	214.52	1053

37	ZONGULDAK KARAEMLAS ÜNİVERSİTESİ	209.64	1071
38	GAZİOSMAN PAŞA ÜNİVERSİTESİ	207.30	1081
39	DUMLUPINAR ÜNİVERSİTESİ	205.50	1090
40	ONDOKUZ MAYIS ÜNİVERSİTESİ	197.72	1126
41	BALIKESİR ÜNİVERSİTESİ	196.41	1130
42	FATİH ÜNİVERSİTESİ	192.28	1145
43	KIRIKKALE ÜNİVERSİTESİ	191.19	1154
44	YEDİTEPE ÜNİVERSİTESİ	184.49	1175
45	CELAL BAYAR ÜNİVERSİTESİ	184.09	1178
46	AFYON KOCATEPE ÜNİVERSİTESİ	181.12	1186
47	CUMHURİYET ÜNİVERSİTESİ	177.79	1197
48	ATILIM ÜNİVERSİTESİ	175.19	1208
49	DOĞUŞ ÜNİVERSİTESİ	165.05	1242
50	MUĞLA ÜNİVERSİTESİ	153.61	1281
51	TRAKYA ÜNİVERSİTESİ	133.88	1352
52	ÇANKAYA ÜNİVERSİTESİ	129.34	1369
53	KAHRAMANMARAŞ SÜTÇÜ İMAM ÜNİVERSİTESİ	127.12	1375
54	AKSARAY ÜNİVERSİTESİ	120.55	1399
55	ABANT İZZET BAYSAL ÜNİVERSİTESİ	115.95	1413
56	KARABÜK ÜNİVERSİTESİ	115.24	1417
57	BAHÇEŞEHİR ÜNİVERSİTESİ	113.10	1422
58	HARRAN ÜNİVERSİTESİ	108.13	1439
59	MUSTAFA KEMAL ÜNİVERSİTESİ	104.72	1453
60	YÜZÜNCÜ YIL ÜNİVERSİTESİ	101.73	1463
61	ÇANAKKALE ONSEKİZ MART ÜNİVERSİTESİ	100.61	1469
62	DÜZCE ÜNİVERSİTESİ	99.99	1474
63	BAŞKENT ÜNİVERSİTESİ	95.91	1489
64	İZMİR EKONOMİ ÜNİVERSİTESİ	94.97	1491
65	AHI EVRAN ÜNİVERSİTESİ	81.77	1549
66	KAFKAS ÜNİVERSİTESİ	76.57	1575
67	BOZOK ÜNİVERSİTESİ	57.83	1660
68	RİZE ÜNİVERSİTESİ	54.80	1673
69	ADNAN MENDERES ÜNİVERSİTESİ	53.02	1684
70	NAMIK KEMAL ÜNİVERSİTESİ	46.20	1721
71	ADİYAMAN ÜNİVERSİTESİ	37.22	1785
72	GÜLHANE ASKERİ TIP AKADEMİSİ	35.10	1792
73	ERZİNCAN ÜNİVERSİTESİ	32.02	1811
74	GİRESUN ÜNİVERSİTESİ	28.35	1845

75	BİNGÖL ÜNİVERSİTESİ	22.79	1867
76	MEHMET AKİF ERSOY ÜNİVERSİTESİ	20.65	1888
77	SİNOP ÜNİVERSİTESİ	17.18	1910
78	ÇANKIRI KARATEKİN ÜNİVERSİTESİ	12.94	1938
79	İSTANBUL BİLİM ÜNİVERSİTESİ	4.14	1990
80	UFUK ÜNİVERSİTESİ	0.00	2000

Table C.4: Life Sciences (*LIFE*)

No	University	Score	Rank
1	HACETTEPE ÜNİVERSİTESİ	260.20	422
2	İSTANBUL ÜNİVERSİTESİ	259.86	429
3	ANKARA ÜNİVERSİTESİ	257.58	511
4	EGE ÜNİVERSİTESİ	254.94	629
5	GAZİ ÜNİVERSİTESİ	254.94	630
6	ATATÜRK ÜNİVERSİTESİ	253.57	707
7	MARMARA ÜNİVERSİTESİ	253.03	746
8	DOKUZ EYLÜL ÜNİVERSİTESİ	251.81	834
9	ULUDAĞ ÜNİVERSİTESİ	251.03	878
10	AKDENİZ ÜNİVERSİTESİ	251.01	879
11	ONDOKUZ MAYIS ÜNİVERSİTESİ	250.74	894
12	ÇUKUROVA ÜNİVERSİTESİ	247.53	925
13	FIRAT ÜNİVERSİTESİ	246.90	931
14	GÜLHANE ASKERİ TIP AKADEMİSİ	242.21	956
15	SÜLEYMAN DEMİREL ÜNİVERSİTESİ	240.60	967
16	ERCIYES ÜNİVERSİTESİ	235.79	985
17	ORTA DOĞU TEKNİK ÜNİVERSİTESİ	232.97	999
18	SELÇUK ÜNİVERSİTESİ	228.38	1014
19	BOĞAZIÇI ÜNİVERSİTESİ	220.06	1035
20	KARADENİZ TEKNİK ÜNİVERSİTESİ	216.34	1054
21	BAŞKENT ÜNİVERSİTESİ	206.46	1083
22	DİCLE ÜNİVERSİTESİ	199.39	1100
23	PAMUKKALE ÜNİVERSİTESİ	196.50	1109
24	YEDİTEPE ÜNİVERSİTESİ	195.98	1111
25	İNÖNÜ ÜNİVERSİTESİ	194.31	1115
26	ADNAN MENDERES ÜNİVERSİTESİ	191.40	1122
27	AFYON KOCATEPE ÜNİVERSİTESİ	190.24	1126
28	MERSİN ÜNİVERSİTESİ	183.86	1142
29	YÜZÜNCÜ YIL ÜNİVERSİTESİ	181.35	1149
30	MUSTAFA KEMAL ÜNİVERSİTESİ	179.89	1158
31	CELAL BAYAR ÜNİVERSİTESİ	171.15	1181
32	TRAKYA ÜNİVERSİTESİ	168.17	1189
33	KOCAELİ ÜNİVERSİTESİ	165.71	1203
34	ESKİŞEHİR OSMANGAZİ ÜNİVERSİTESİ	162.72	1211
35	CUMHURİYET ÜNİVERSİTESİ	162.24	1213
36	ANADOLU ÜNİVERSİTESİ	160.13	1219

37	GAZİANTEP ÜNİVERSİTESİ	159.46	1222
38	HARRAN ÜNİVERSİTESİ	151.32	1241
39	ZONGULDAK KARAEMLAS ÜNİVERSİTESİ	147.64	1249
40	GAZİOSMAN PAŞA ÜNİVERSİTESİ	135.63	1288
41	İSTANBUL TEKNİK ÜNİVERSİTESİ	134.60	1293
42	KIRIKKALE ÜNİVERSİTESİ	125.40	1325
43	ABANT İZZET BAYSAL ÜNİVERSİTESİ	115.19	1354
44	BİLKENT ÜNİVERSİTESİ	108.43	1377
45	SABANCI ÜNİVERSİTESİ	105.23	1392
46	DÜZCE ÜNİVERSİTESİ	99.74	1415
47	KOÇ ÜNİVERSİTESİ	96.73	1425
48	MUĞLA ÜNİVERSİTESİ	92.65	1442
49	İZMİR YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	90.99	1452
50	KAHRAMANMARAŞ SÜTÇÜ İMAM ÜNİVERSİTESİ	89.17	1464
51	KAFKAS ÜNİVERSİTESİ	83.60	1492
52	ÇANAKKALE ONSEKİZ MART ÜNİVERSİTESİ	79.69	1516
53	FATİH ÜNİVERSİTESİ	72.69	1565
54	GEBZE YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	67.86	1597
55	YILDIZ TEKNİK ÜNİVERSİTESİ	66.61	1607
56	BALIKESİR ÜNİVERSİTESİ	52.54	1685
57	RİZE ÜNİVERSİTESİ	47.56	1709
58	SAKARYA ÜNİVERSİTESİ	45.15	1727
59	DUMLUPINAR ÜNİVERSİTESİ	43.31	1744
60	ADİYAMAN ÜNİVERSİTESİ	40.85	1763
61	NİĞDE ÜNİVERSİTESİ	37.74	1784
62	UFUK ÜNİVERSİTESİ	36.33	1796
63	BOZOK ÜNİVERSİTESİ	34.28	1801
64	BİNGÖL ÜNİVERSİTESİ	31.03	1818
65	İSTANBUL BİLİM ÜNİVERSİTESİ	29.39	1833
66	AKSARAY ÜNİVERSİTESİ	28.95	1837
67	NAMIK KEMAL ÜNİVERSİTESİ	28.66	1838
68	ERZİNCAN ÜNİVERSİTESİ	25.64	1857
69	AHI EVRAN ÜNİVERSİTESİ	25.21	1859
70	GİRESUN ÜNİVERSİTESİ	24.79	1865
71	MEHMET AKİF ERSOY ÜNİVERSİTESİ	21.57	1887
72	TOBB EKONOMİ VE TEKNOLOJİ ÜNİVERSİTESİ	17.13	1909
73	ÇANKAYA ÜNİVERSİTESİ	17.02	1910
74	ÇANKIRI KARATEKİN ÜNİVERSİTESİ	12.35	1932

75	KARABÜK ÜNİVERSİTESİ	9.05	1953
76	İZMİR EKONOMİ ÜNİVERSİTESİ	8.44	1958
77	BAHÇEŞEHİR ÜNİVERSİTESİ	8.19	1960
78	SİNOP ÜNİVERSİTESİ	6.43	1968
79	DOĞUŞ ÜNİVERSİTESİ	4.28	1977
80	ATILIM ÜNİVERSİTESİ	3.98	1981

Table C.5: Natural Sciences (SCI)

No	University	Score	Rank
1	ORTA DOĐU TEKNİK ÜNİVERSİTESİ	267.53	417
2	İSTANBUL TEKNİK ÜNİVERSİTESİ	261.75	535
3	HACETTEPE ÜNİVERSİTESİ	257.92	645
4	GAZİ ÜNİVERSİTESİ	257.49	664
5	EGE ÜNİVERSİTESİ	256.61	684
6	ANKARA ÜNİVERSİTESİ	256.30	693
7	BİLKENT ÜNİVERSİTESİ	255.51	724
8	İSTANBUL ÜNİVERSİTESİ	254.87	742
9	ATATÜRK ÜNİVERSİTESİ	254.05	776
10	ERCIYES ÜNİVERSİTESİ	250.94	868
11	BOĞAZİÇİ ÜNİVERSİTESİ	245.99	911
12	ONDOKUZ MAYIS ÜNİVERSİTESİ	241.01	938
13	DOKUZ EYLÜL ÜNİVERSİTESİ	240.43	940
14	ANADOLU ÜNİVERSİTESİ	240.06	944
15	KOÇ ÜNİVERSİTESİ	239.87	947
16	SELÇUK ÜNİVERSİTESİ	238.77	953
17	KARADENİZ TEKNİK ÜNİVERSİTESİ	234.62	970
18	FIRAT ÜNİVERSİTESİ	220.65	1032
19	ÇUKUROVA ÜNİVERSİTESİ	216.75	1048
20	GEBZE YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	209.50	1086
21	ÇANAKKALE ONSEKİZ MART ÜNİVERSİTESİ	206.04	1100
22	YILDIZ TEKNİK ÜNİVERSİTESİ	204.95	1107
23	SÜLEYMAN DEMİREL ÜNİVERSİTESİ	198.57	1130
24	ESKİŞEHİR OSMANGAZİ ÜNİVERSİTESİ	187.03	1172
25	MARMARA ÜNİVERSİTESİ	180.86	1196
26	SABANCI ÜNİVERSİTESİ	172.08	1232
27	İZMİR YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	161.58	1264
28	SAKARYA ÜNİVERSİTESİ	161.00	1267
29	İNÖNÜ ÜNİVERSİTESİ	159.95	1269
30	ÇANKAYA ÜNİVERSİTESİ	159.03	1272
31	KOCAELİ ÜNİVERSİTESİ	158.27	1276
32	ULUDAĞ ÜNİVERSİTESİ	154.03	1288
33	AKDENİZ ÜNİVERSİTESİ	150.82	1297
34	DİCLE ÜNİVERSİTESİ	149.01	1304
35	PAMUKKALE ÜNİVERSİTESİ	141.54	1323
36	CUMHURİYET ÜNİVERSİTESİ	141.41	1324

37	KIRIKKALE ÜNİVERSİTESİ	135.66	1345
38	GAZİOSMAN PAŞA ÜNİVERSİTESİ	135.48	1347
39	FATİH ÜNİVERSİTESİ	133.11	1360
40	YÜZÜNCÜ YIL ÜNİVERSİTESİ	131.53	1368
41	DUMLUPINAR ÜNİVERSİTESİ	125.35	1395
42	BALIKESİR ÜNİVERSİTESİ	123.94	1398
43	MERSİN ÜNİVERSİTESİ	116.90	1428
44	ATILIM ÜNİVERSİTESİ	112.78	1446
45	MUĞLA ÜNİVERSİTESİ	106.55	1474
46	NİĞDE ÜNİVERSİTESİ	104.33	1486
47	HARRAN ÜNİVERSİTESİ	103.69	1492
48	GAZİANTEP ÜNİVERSİTESİ	99.42	1519
49	TOBB EKONOMİ VE TEKNOLOJİ ÜNİVERSİTESİ	97.37	1531
50	AFYON KOCATEPE ÜNİVERSİTESİ	93.43	1551
51	YEDİTEPE ÜNİVERSİTESİ	93.34	1553
52	ZONGULDAK KARAEMLAS ÜNİVERSİTESİ	90.61	1567
53	CELAL BAYAR ÜNİVERSİTESİ	88.07	1577
54	ABANT İZZET BAYSAL ÜNİVERSİTESİ	83.83	1601
55	AHI EVRAN ÜNİVERSİTESİ	79.68	1625
56	KAFKAS ÜNİVERSİTESİ	74.87	1657
57	TRAKYA ÜNİVERSİTESİ	73.08	1667
58	KAHRAMANMARAŞ SÜTÇÜ İMAM ÜNİVERSİTESİ	70.95	1681
59	ADNAN MENDERES ÜNİVERSİTESİ	70.62	1684
60	MUSTAFA KEMAL ÜNİVERSİTESİ	70.39	1686
61	ADIYAMAN ÜNİVERSİTESİ	65.55	1713
62	KARABÜK ÜNİVERSİTESİ	63.59	1731
63	RİZE ÜNİVERSİTESİ	58.50	1764
64	BOZOK ÜNİVERSİTESİ	57.67	1770
65	AKSARAY ÜNİVERSİTESİ	57.41	1772
66	DOĞUŞ ÜNİVERSİTESİ	56.08	1783
67	BAŞKENT ÜNİVERSİTESİ	55.54	1787
68	BAHÇEŞEHİR ÜNİVERSİTESİ	44.08	1852
69	SİNOP ÜNİVERSİTESİ	43.90	1853
70	İZMİR EKONOMİ ÜNİVERSİTESİ	43.72	1855
71	GÜLHANE ASKERİ TIP AKADEMİSİ	31.86	1924
72	ERZİNCAN ÜNİVERSİTESİ	31.26	1929
73	GİRESUN ÜNİVERSİTESİ	30.24	1930
74	DÜZCE ÜNİVERSİTESİ	28.32	1940

75	NAMIK KEMAL ÜNİVERSİTESİ	27.21	1943
76	BİNGÖL ÜNİVERSİTESİ	24.79	1951
77	MEHMET AKİF ERSOY ÜNİVERSİTESİ	19.49	1966
78	ÇANKIRI KARATEKİN ÜNİVERSİTESİ	17.62	1970
79	İSTANBUL BİLİM ÜNİVERSİTESİ	1.30	1999
80	UFUK ÜNİVERSİTESİ	1.12	2000

Table C.6: Social Sciences (SOC)

No	University	Score	Rank
1	ORTA DOĞU TEKNİK ÜNİVERSİTESİ	267.70	330
2	BİLKENT ÜNİVERSİTESİ	264.06	390
3	HACETTEPE ÜNİVERSİTESİ	261.89	442
4	GAZİ ÜNİVERSİTESİ	259.60	502
5	ANKARA ÜNİVERSİTESİ	257.02	565
6	KOÇ ÜNİVERSİTESİ	256.17	599
7	İSTANBUL TEKNİK ÜNİVERSİTESİ	255.79	612
8	SELÇUK ÜNİVERSİTESİ	255.57	620
9	BOĞAZIÇI ÜNİVERSİTESİ	255.46	635
10	DOKUZ EYLÜL ÜNİVERSİTESİ	254.72	671
11	İSTANBUL ÜNİVERSİTESİ	253.20	759
12	SABANCI ÜNİVERSİTESİ	251.42	819
13	BAŞKENT ÜNİVERSİTESİ	251.26	822
14	EGE ÜNİVERSİTESİ	250.06	838
15	MARMARA ÜNİVERSİTESİ	249.83	840
16	FIRAT ÜNİVERSİTESİ	248.66	856
17	ULUDAĞ ÜNİVERSİTESİ	247.87	863
18	YILDIZ TEKNİK ÜNİVERSİTESİ	243.72	887
19	ERCIYES ÜNİVERSİTESİ	240.44	915
20	KARADENİZ TEKNİK ÜNİVERSİTESİ	239.95	922
21	ATATÜRK ÜNİVERSİTESİ	234.71	946
22	AKDENİZ ÜNİVERSİTESİ	215.12	1024
23	İZMİR EKONOMİ ÜNİVERSİTESİ	214.73	1028
24	PAMUKKALE ÜNİVERSİTESİ	214.55	1031
25	ÇUKUROVA ÜNİVERSİTESİ	212.94	1039
26	ANADOLU ÜNİVERSİTESİ	212.78	1040
27	ESKİŞEHİR OSMANGAZİ ÜNİVERSİTESİ	191.48	1135
28	ABANT İZZET BAYSAL ÜNİVERSİTESİ	183.77	1168
29	SAKARYA ÜNİVERSİTESİ	180.08	1178
30	FATİH ÜNİVERSİTESİ	179.28	1182
31	TOBB EKONOMİ VE TEKNOLOJİ ÜNİVERSİTESİ	172.83	1198
32	SÜLEYMAN DEMİREL ÜNİVERSİTESİ	171.64	1203
33	GAZİANTEP ÜNİVERSİTESİ	161.73	1235
34	GEBZE YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	152.80	1264
35	KOCAELİ ÜNİVERSİTESİ	151.95	1266
36	MUĞLA ÜNİVERSİTESİ	150.23	1271

37	ONDOKUZ MAYIS ÜNİVERSİTESİ	148.25	1274
38	BAHÇEŞEHİR ÜNİVERSİTESİ	144.14	1284
39	DİCLE ÜNİVERSİTESİ	141.14	1290
40	MERSİN ÜNİVERSİTESİ	134.15	1317
41	YEDİTEPE ÜNİVERSİTESİ	133.77	1322
42	ZONGULDAK KARAEMLAS ÜNİVERSİTESİ	126.66	1353
43	NİĞDE ÜNİVERSİTESİ	119.89	1368
44	DUMLUPINAR ÜNİVERSİTESİ	111.74	1391
45	MUSTAFA KEMAL ÜNİVERSİTESİ	110.82	1396
46	KIRIKKALE ÜNİVERSİTESİ	105.68	1414
47	CUMHURİYET ÜNİVERSİTESİ	104.45	1420
48	ÇANKAYA ÜNİVERSİTESİ	102.71	1426
49	İNÖNÜ ÜNİVERSİTESİ	101.51	1434
50	AFYON KOCATEPE ÜNİVERSİTESİ	100.64	1439
51	TRAKYA ÜNİVERSİTESİ	99.95	1441
52	ADNAN MENDERES ÜNİVERSİTESİ	99.88	1443
53	ATILIM ÜNİVERSİTESİ	97.82	1450
54	GAZİOSMAN PAŞA ÜNİVERSİTESİ	93.78	1462
55	CELAL BAYAR ÜNİVERSİTESİ	92.88	1467
56	DOĞUŞ ÜNİVERSİTESİ	91.69	1474
57	HARRAN ÜNİVERSİTESİ	87.81	1496
58	BALIKESİR ÜNİVERSİTESİ	83.81	1512
59	GÜLHANE ASKERİ TIP AKADEMİSİ	82.18	1515
60	KAHRAMANMARAŞ SÜTÇÜ İMAM ÜNİVERSİTESİ	77.75	1540
61	YÜZÜNCÜ YIL ÜNİVERSİTESİ	65.61	1594
62	ÇANAKKALE ONSEKİZ MART ÜNİVERSİTESİ	64.95	1597
63	DÜZCE ÜNİVERSİTESİ	48.98	1680
64	RİZE ÜNİVERSİTESİ	36.54	1758
65	İZMİR YÜKSEK TEKNOLOJİ ENSTİTÜSÜ	35.52	1764
66	KAFKAS ÜNİVERSİTESİ	34.43	1770
67	ADIYAMAN ÜNİVERSİTESİ	29.21	1821
68	MEHMET AKİF ERSOY ÜNİVERSİTESİ	24.22	1860
69	KARABÜK ÜNİVERSİTESİ	21.75	1874
70	GİRESUN ÜNİVERSİTESİ	21.06	1879
71	AHI EVRAN ÜNİVERSİTESİ	20.71	1882
72	İSTANBUL BİLİM ÜNİVERSİTESİ	20.13	1884
73	NAMIK KEMAL ÜNİVERSİTESİ	15.49	1912
74	BOZOK ÜNİVERSİTESİ	13.40	1927

75	AKSARAY ÜNİVERSİTESİ	12.95	1931
76	ERZİNCAN ÜNİVERSİTESİ	12.65	1936
77	ÇANKIRI KARATEKİN ÜNİVERSİTESİ	10.37	1952
78	UFUK ÜNİVERSİTESİ	6.18	1979
79	BİNGÖL ÜNİVERSİTESİ	0.32	1993
80	SİNOP ÜNİVERSİTESİ	0.00	1998