

### CWTS Leiden Ranking: An advanced bibliometric approach to university ranking

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## **Centre for Science and Technology Studies (CWTS)**

 Research center at Leiden University focusing on quantitative studies of science (bibliometrics and scientometrics)

- Bibliometric contract research
  - Monitoring & evaluation
  - Advanced analytics
  - Training & education





## **Short bio**

• MSc in computer science

 PhD research on bibliometric network visualization

- Researcher at CWTS (since 2009) focusing on:
  - Bibliometric network analysis
  - Bibliometric indicators of research performance





### VOSviewer



### www.leidenranking.com

Ranking       Methodology       Products       Links       Contact         CWTS Leiden Ranking 2014       Select field and region/country       Select field and region/country       Select indicators       Type of indicators:       Impact         Field:       All sciences       •       Indicator used for ranking:       Indicator used for ranking:       PP(top 10%)         Country:       All countries       •       PP(top 10%)       Indicator used for ranking:       PP(top 10%)         Calculate size-independent indicators ?       •       Show stability intervals ?       •         Calculate size-independent indicators ?       •       Show stability intervals ?       •         Rank University       Country       P PP(top 10%)       Stability intervals ?       •         1       Rockefeller Univ       1033       29.1%       •       •         2       MIT       1033       29.1%       •       •         3       Harvard Univ       1033       29.1%       •       •         4       Univ Calif - Berkeley       11384       22.5%       •       •         5       Stanford Univ       13399       22.3%       •       •         6       Calculate size-independent indicators       9990       22	Leiden University   CWTS   CWTS B.V.   Other CWTS sites 👻											
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## **CWTS Leiden Ranking**

- Provides bibliometric indicators of:
  - Scientific impact
  - Scientific collaboration
- Calculated based on Web of Science data
- Includes the 750 largest universities worldwide in terms of Web of Science publication output



# Differences with other university rankings

- No aggregation of different dimensions of university performance (research, teaching, etc.) into a single overall performance indicator
- Exclusive focus on measuring universities' scientific performance
- No dependence on survey data or data provided by universities
- Advanced bibliometric methodology



## **Advanced bibliometric methodology**

- Percentile-based indicators to properly deal with highly skewed citation distributions
- Exclusion of non-core publications
- Normalization for differences between fields in citation and collaboration practices:
  - Field definitions based on an algorithmically constructed publication-level classification system of science
  - Fractional counting of co-authored publications



## Average-based vs. percentile-based indicators





## Average-based vs. percentile-based indicators

#### A short history of SHELX

By: Sheldrick, GM (Sheldrick, George M.)[1]

ACTA CRYSTALLOGRAPHICA SECTION A Volume: 64 Pages: 112-122 Part: 1 DOI: 10.1107/S0108767307043930 Published: JAN 2008 View Journal Information

#### Abstract

An account is given of the development of the SHELX system of computer programs from SHELX-76 to the present day. In addition to identifying useful innovations that have come into general use through their implementation in SHELX, a critical analysis is presented of the less-successful features, missed opportunities and desirable improvements for future releases of the software. An attempt is made to understand how a program originally designed for photographic intensity data, punched cards and computers over 10000 times slower than an average modern personal computer has managed to survive for so long. SHELXL is the most widely used program for small-molecule refinement and SHELXS and SHELXD are often employed for structure solution despite the availability of objectively superior programs. SHELXL also finds a niche for the refinement of macromolecules against high-resolution or twinned data; SHELXPRO acts as an interface for macromolecular applications. SHELXC, SHELXD and SHELXE are proving useful for the experimental phasing of macromolecules, especially because they are fast and robust and so are often employed in pipelines for high-throughput phasing. This paper could serve as a general literature citation when one or more of the open-source SHELX programs (and the Bruker AXS version SHELXTL) are employed in the course of a crystal-structure determination.

#### Keywords

KeyWords Plus: LEAST-SQUARES REFINEMENT; CRYSTAL-STRUCTURE DETERMINATION; PROTEIN STRUCTURES; 1.7 ANGSTROM; RESOLUTION; CRYSTALLOGRAPHY; RESTRAINTS; COMPLEX

#### Author Information

#### **All Times Cited Counts**

37,230 in All Databases
37,188 in Web of Science Core Collection
2,103 in BIOSIS Citation Index
148 in Chinese Science Citation Database
0 in Data Citation Index
26 in SciELO Citation Index

#### Most Recent Citation

Caglar, Sema. Copper(II) 2-Benzoylbenzoate Complexes Containing 2-Pyridilmethanol and 2-Pyridilethanol: Synthesis, Crystal Structures, Spectroscopic, and Thermal Properties. SYNTHESIS AND

### **Exclusion of non-core publications**

Non-core publications are excluded:

- Non-English publications
- Publications in national scientific journals, trade journals, and popular magazines
- Publications in fields with a low citation density
- Retracted publications



### **Exclusion of non-core publications** and the effect on PP(top 10%)



## Publication-level classification system of science

- Fields are defined at the level of individual publications rather than journals
- Publications are clustered into ~800 fields based on citation relations
- Smart local moving community detection algorithm





### Full vs. fractional counting

Full counting is biased in favor of fields with a lot of collaboration and a strong citation advantage for collaborative publications



### **U-Multirank**

### **(((1))** multirank

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5	5 University comparison Your selection: 854 universities Show choices													
Change measures		Teaching & Learning +				Research +			Knowledge Transfer			+		
Show scores		Bachelor graduation	Masters graduation	Graduating on time	Graduating on time (masters)	Citation rate	Research publications	External research	Co- publications	Income from private	Patents awarded (size-	Publications cited in		
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### Some conclusions

- There is no such thing as 'overall university performance'; do not mix up different dimensions of university performance
- Use an appropriate bibliometric methodology:
  - Use percentile-based indicators, not average-based indicators
  - Do not blindly follow the selection of journals made by database producers; exclude non-scientific journals and journals with a national focus
  - Use fractional counting, not full counting

