

# *Applying bibliometrics in research assessment and management ... It's complicated !*

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## Outline

- *CWTS and Bibliometrics*
- *Detail and accuracy in bibliometric applications*
- *Normalization in bibliometrics*
- *Coverage in bibliometric studies*
- *Infamous bibliometric indicators – What to avoid*
- *CWTS methodology – basic indicators*
- *Advantages and disadvantages in bibliometric analysis*

# CWTS and Bibliometrics

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## What is bibliometrics ?

- Quantitative analysis of science & technology, and the study of cognitive and organizational structures in science and technology.
- Scientific communication between scientists through (mainly) journal publications.
- Key concepts are **output** and **impact**, as measured through publications and citations.
- Important starting point in bibliometrics: scientists express, through citations in their scientific publications, a certain degree of influence of others on their own work.
- By large scale quantification, citations indicate (inter)national influence or (inter)national visibility of scientific activity, but should not be interpreted as synonym for 'quality'.

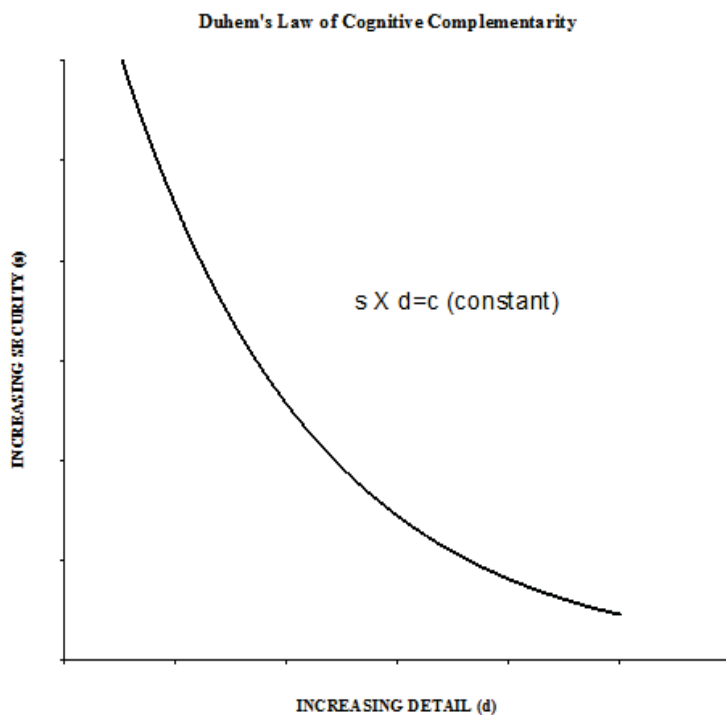
## CWTS data system

- CWTS has a full bibliometric license from Thomson Reuters to conduct evaluation studies using the Web of Science.
- Our database covers the period 1981-2014/5.
- Some characteristics:
  - Over 41.000.000 publications.
  - Over 600.000.000 citation relations between source papers.
  - Author disambiguation tools are applied, linked with acquired experience
  - Continuous address cleaning tools being developed, related to the *Leiden Ranking*.
  - Contains reference sets for journal and field citation data.



**Detail and accuracy  
in bibliometric  
applications**

## Tension between detail and accuracy: Duhem's 'Law of Cognitive Complementarity' \*



- An inverse relationship exists between the precision of our information, and its' substantiation
- Detail and security / accuracy stand in a competing relationship !

\* 'Epistemetrics' by Nicolas Rescher (2006)



- We estimate the size of the tree at *around* 8 mtr.
- We are *quite sure* that the tree is between 6-12 mtr. high.
- We are *virtually certain* that its height is between 3-18 mtr.
- But we can be *completely and absolutely sure* that its height is between 1 mtr and 56 mtr.

## Levels of aggregation in bibliometric analysis

- We distinguish various levels of analysis:
  - **Macro-level**, e.g. country and region comparison for the EU, Dutch Observatory of S&T.
  - **Meso-level**, e.g. research organizations, universities, institutes.
  - **Micro-level**, e.g. analysis of programs, groups, or even, increasingly, individual researchers.

Bibliometrics can be applied on all three levels of analysis, however, **every level brings it's own requirements !!!**



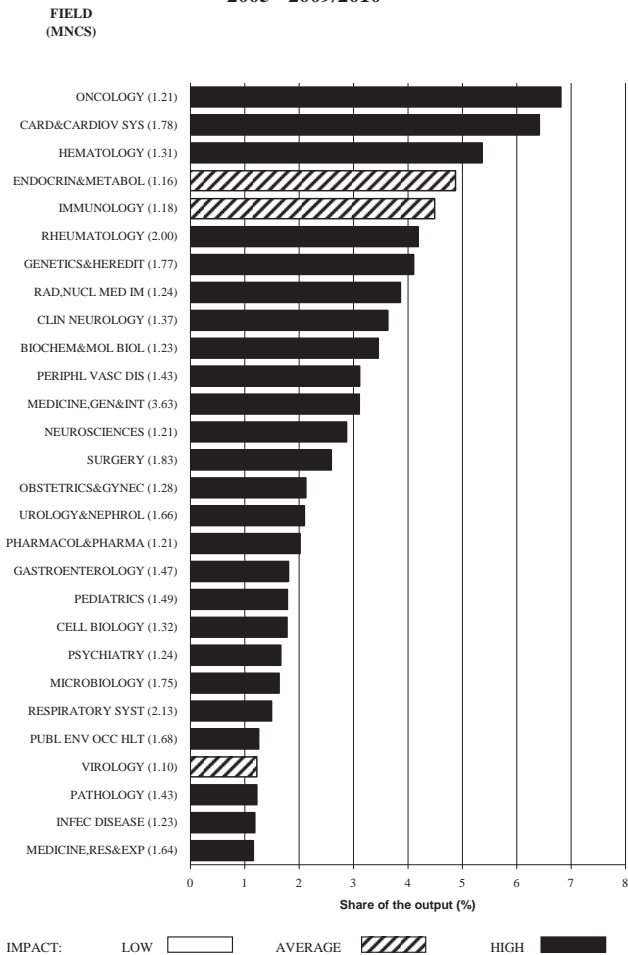
## Data collection in bibliometric analysis

- Roughly, we can distinguish three methods for the collection of a set of publications:
  - Based on a **list of names** of researchers  
*(verification through a website creates a valid dataset)*
  - Based on a **list of publications** of a unit  
*(the supplied lists form the authorized/verified dataset)*
  - Based on the **address** of an institute or unit  
*(this approach does not allow lower level insights and conclusions)*

We work with various methods, macro-level studies usually exclude the first two methods.



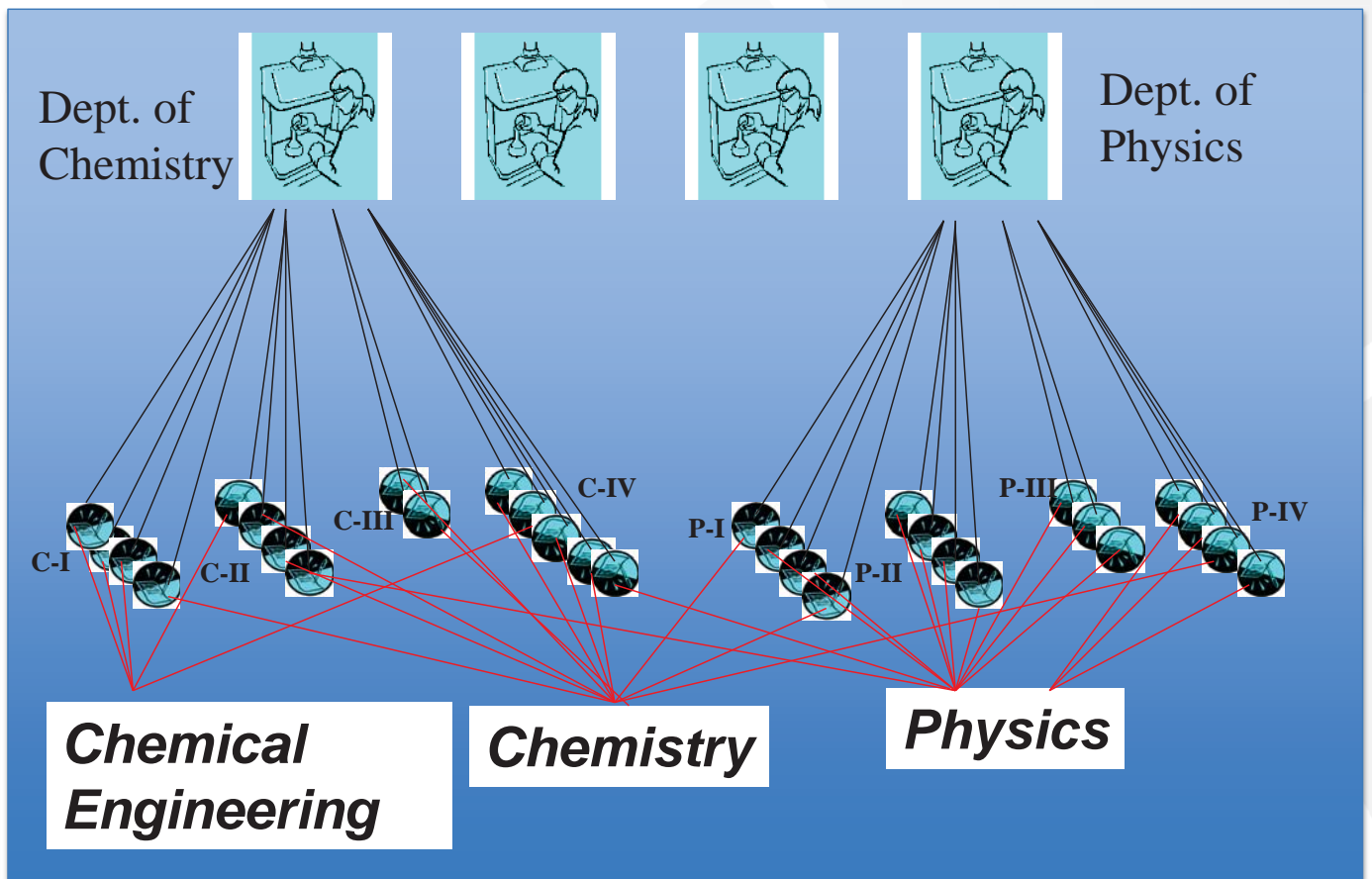
**RESEARCH PROFILE  
OUTPUT AND IMPACT PER FIELD  
2005 - 2009/2010**



## Example of a so-called *Research Profile*

- Profile of Leiden University Medical Center
- In *Immunology* they're not as strong as in other medical disciplines.
- However, this does not automatically mean that the Dept. of Immunology is performing at that level !

## Disconnect between organizational units & fields



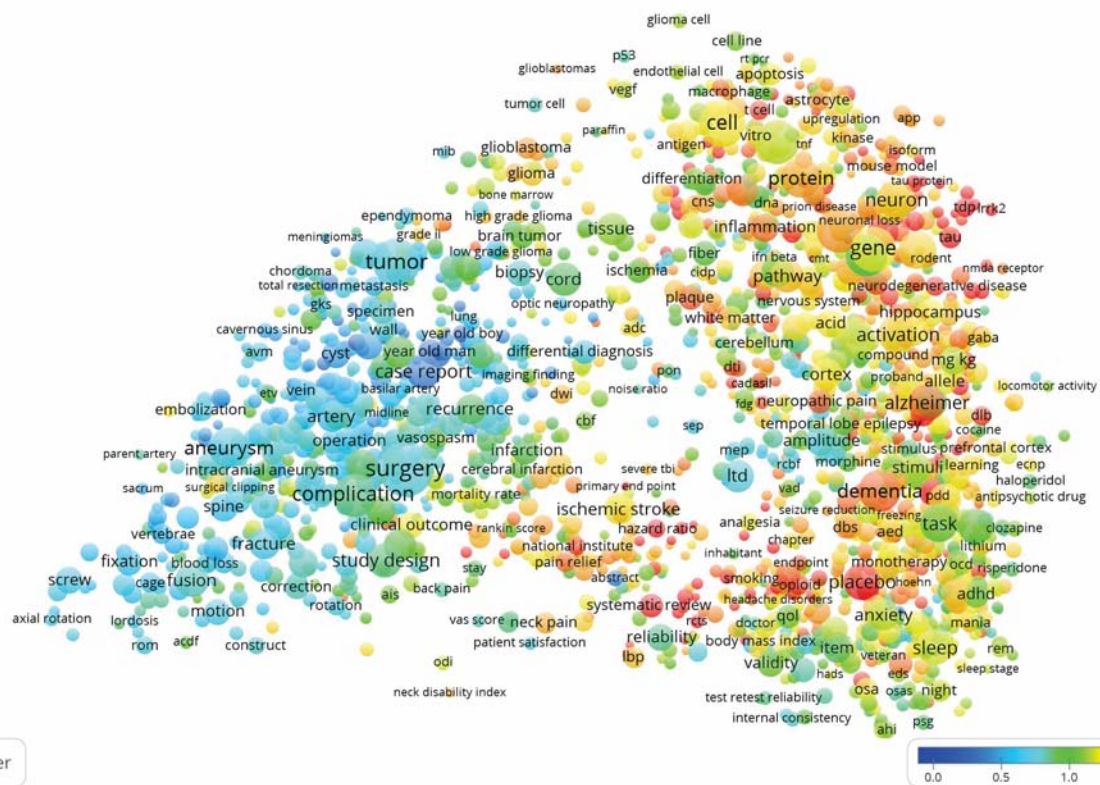
# Normalization in bibliometrics

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## On normalization in bibliometric analysis

- The use of normalization is *conditio sine qua non* in applying bibliometric techniques.
- The most used system is that Journal Subject Categories, which fits the multidisciplinary nature of the Web of Science.
- However, the most applied system, that of Journal Subject Categories, has serious drawbacks \*

# Journal Subject Category “Clinical Neurology”



## Some conclusions on normalization

- Therefore, CWTS has developed methods to normalize in a different way, avoiding these problems.
- However, normalization and level of aggregation remain in a complex relationship.
- We have to remain aware of the other meaning of the word normalization, and avoid that this becomes a straight jacket.



# Coverage in bibliometric studies

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## Introduction

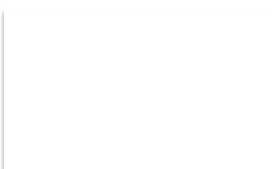
- The use of evaluative bibliometrics can only become meaningful when used in a the right context.
- Publication culture of the unit(s) under assessment are shaping that context.
- As such, any bibliometric study should start with an assessment of the adequacy of metrics in that particular context.
- Therefore, CWTS has developed methods to assess that fit of metrics in a certain context.

# How to define adequate coverage ?

- In order to determine whether metrics applied in an assessment context are meaningful, one needs to know what is represented through the metrics.
- We distinguish two types of coverage:
  - **Internal** (from inside the perspective of the WoS)
  - **External** (from the perspective of a total output set)

## Assessing the adequacy of WoS for bibliometrics: The *Internal* coverage method

- Look at publications in WoS across fields,
- Use the references given by the authors of the publications,
- Analyze the communication channels referred to,
- Usage of WoS journals as share of the total number of references is an indication of the relevance for the authors involved,
- Thereby constituting a basis for the usage of bibliometrics as evaluation tool !



# Assessing the adequacy of WoS for bibliometrics: The *External* coverage method

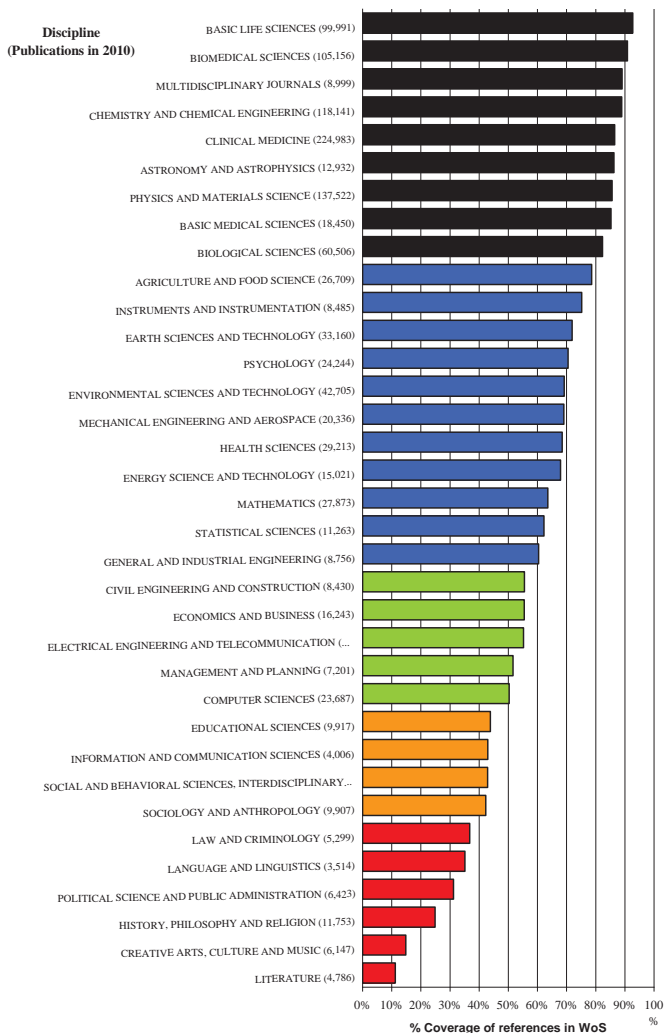
- Use the list of publications of an organization, subject of a bibliometric analysis.
- Match the submitted list with the WoS.
- Degrees of covered scientific outlets indicate the relevance of WoS journals.
- Thereby constituting a basis for the usage of bibliometrics as an evaluation tool !



## Internal coverage in bibliometric studies

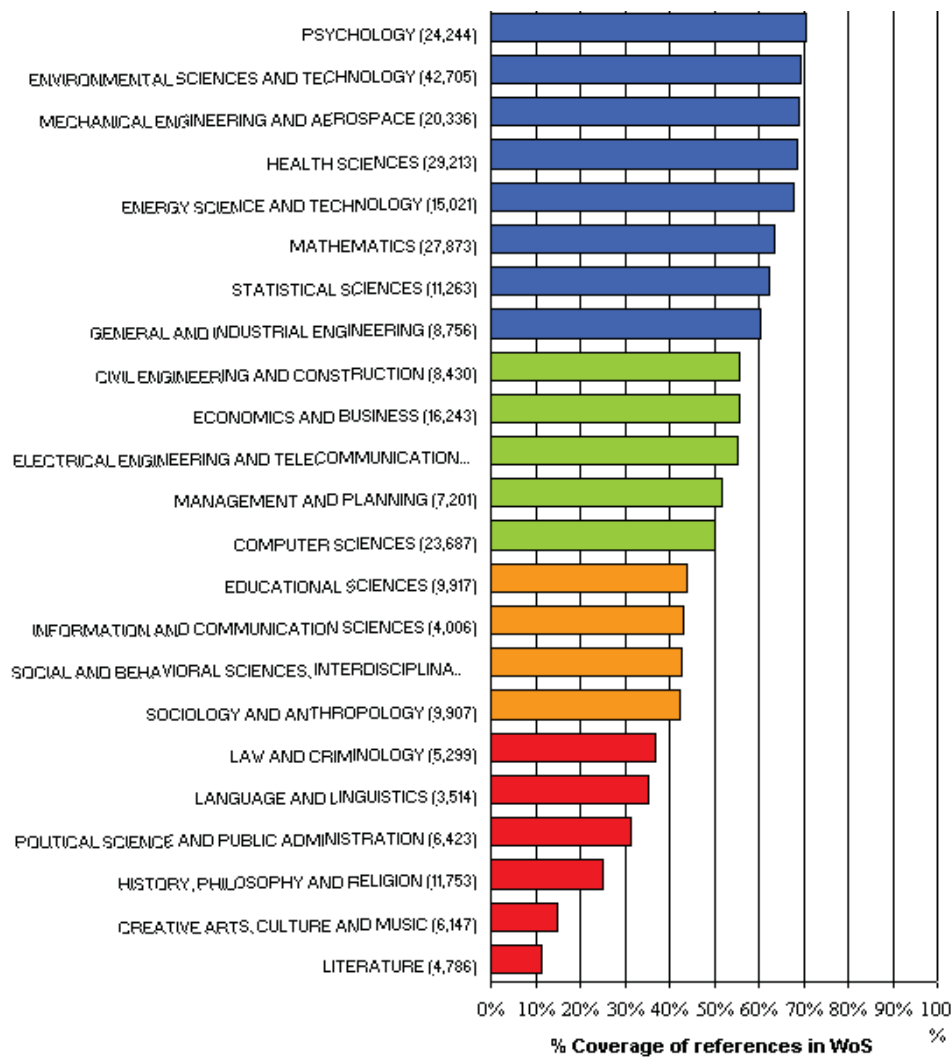
<b>AU</b>	<b>Moed, HF; Garfield, E.</b>	<b>in</b>
<b>TI</b>	<b>In basic science the percentage of 'authoritative' references decreases as bibliographies become shorter</b>	<b>WO</b>
<b>SO</b>	<b>SCIENTOMETRICS 60 (3): 295-303, 2004</b>	<b>S</b>
<b>RF</b>	<b>ABT HA, J AM SOC INF SCI T, v 53, p 1106, 2004</b>	<b>Y</b>
	<b>GARFIELD, SCIENTOMETRICS, 1979 (BOOK!)</b>	<b>Y</b>
	<b>Not in WoS</b>	<b>N</b>
	<b>GARFIELD, J AM SOC INF SCI T, v 8, p 403, 1985</b>	<b>N</b>
	<b>GILBERT GN, SOC STUDIES SCI, v 7, p 113, 1977</b>	<b>Y</b>
	<b>MERTON</b>	<b>Y</b>
	<b>RO</b>	<b>Y</b>
	<b>ZUC</b>	<b>Y</b>

**WoS Coverage  
= 5/7 = 71%**



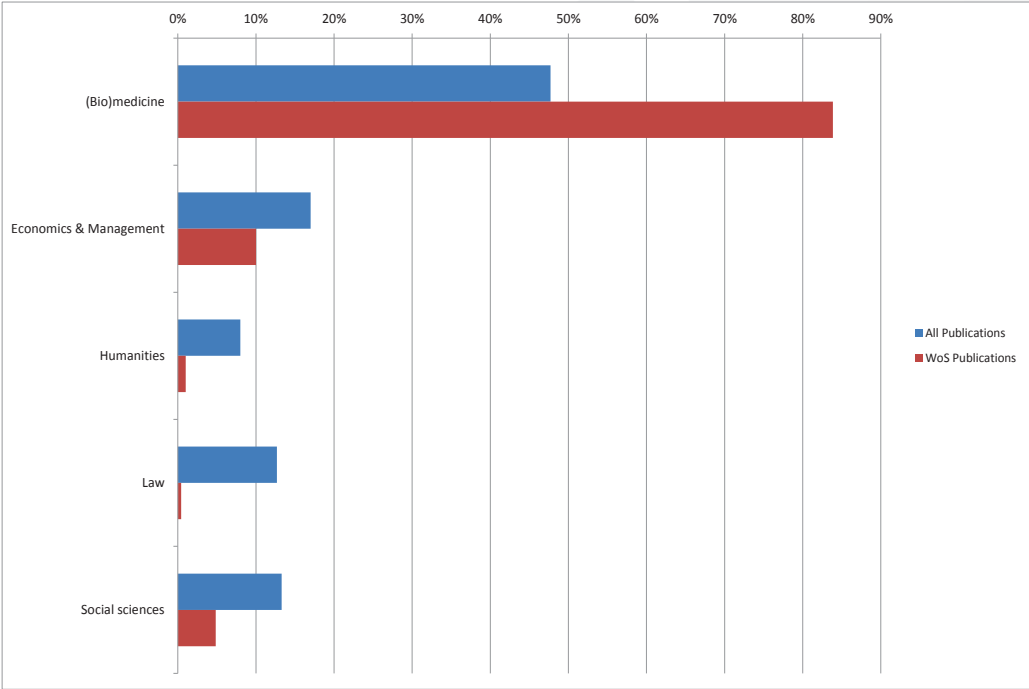
## WoS Coverage in 2010 across disciplines

- **Black**=Excellent coverage (>80%)
- **Blue**= Good coverage (between 60-80%)
- **Green**= Moderate coverage (but above 50%)
- **Orange**= Moderate coverage (below 50%, but above 40%)
- **Red**= Poor coverage (highly problematic, below 40%)



## External coverage in bibliometric studies

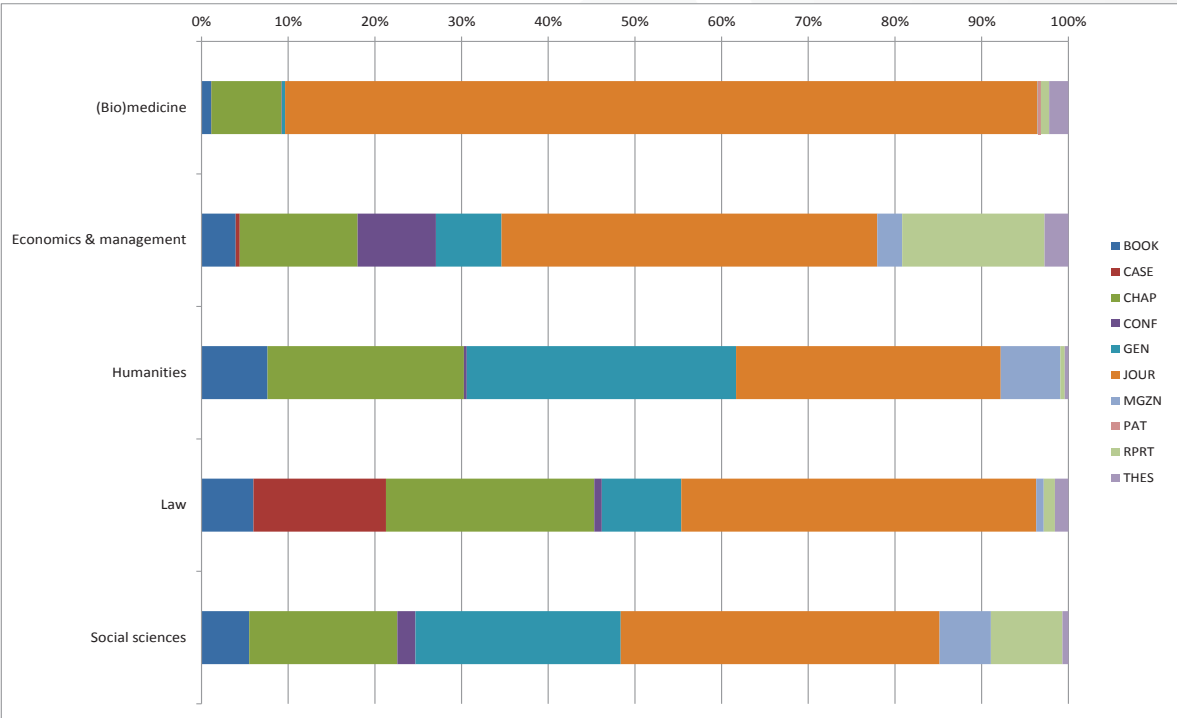
# External coverage & journal literature (i)



- Production is spread across disciplines.
- In Web of Science, Biomedicine is dominant !



# External coverage & journal literature (ii)



- We observe a variety of types of output.
- Journal publishing is important in all disciplines !



# Infamous bibliometric indicators: JIF & H-index

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## Definitions of Journal Impact Factor & Hirsch Index

- **Definition of JIF:**
  - The mean citation score of a journal, determined by dividing all citations in year T by all citable documents in years T-1 and T-2.
- **Definition of h-index:**
  - The 'impact' of a researcher, determined by the number of received citations of an oeuvre, sorted by descending order, where the number of received citations on that single paper equals the rank position.

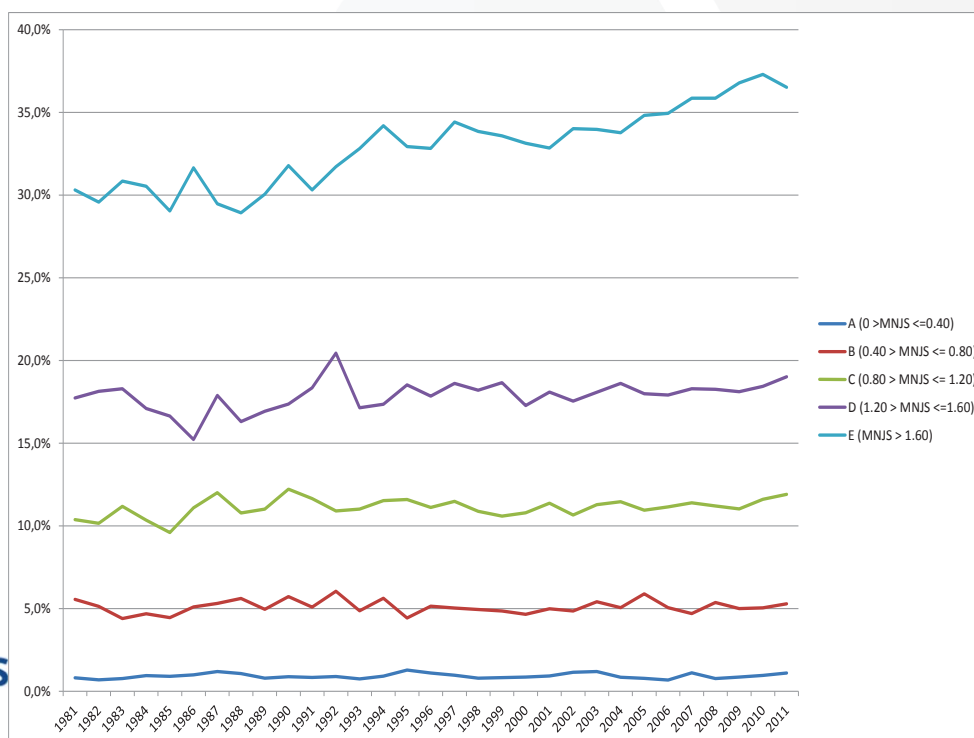
# Problems with JIF

- **Methodological issues**
  - Was/is calculated erroneously (Moed & van Leeuwen, 1996)
  - Not field normalized
  - Not document type normalized
  - Underlying citation distributions are highly skewed (Seglen, 1994)
- **Conceptual/general issues**
  - Inflation (van Leeuwen & Moed, 2002)
  - Availability promotes journal publishing
  - Is based on expected values only
  - Stimulates one-indicator thinking
  - Ignores other scholarly virtues



## Deconstructing the myth of the JIF...

- Take the Dutch output
- Similar journal impact classes
- Focus on publications that belong to the top 10% of their field





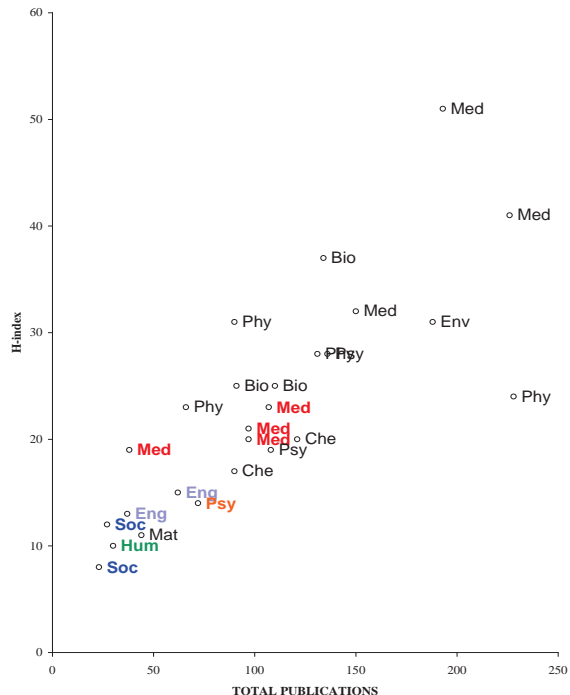
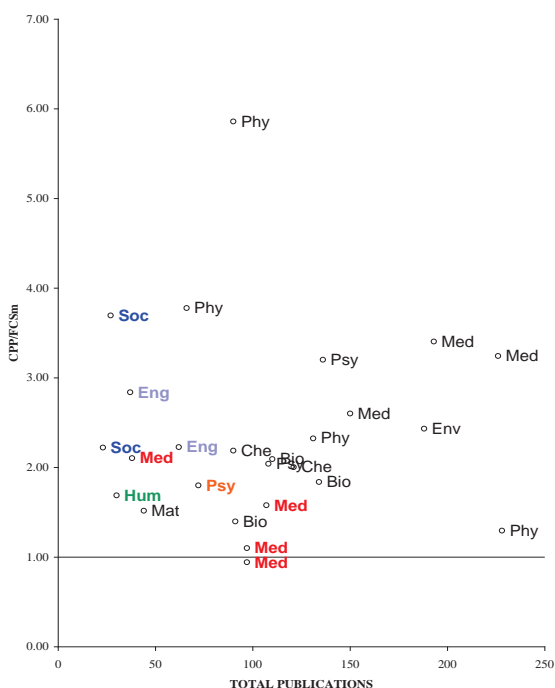
# Problems with H-index

- **Bibliometric-mathematical issues**
  - mathematically inconsistent (Waltman & van Eck, 2012)
  - conservative
  - Not field normalized (van Leeuwen, 2008)
- **Bibliometric-methodological issues**
  - How to define an author?
  - In which bibliographic/metric environment?
- **Conceptual/general issues**
  - Favors age, experience, and high productivity (Costas & Bordons, 2006)
  - No relationship with research quality
  - Ignores other elements of scholarly activity
  - Promotes one-indicator thinking



## The problem of fields and h-index ...

- Spinoza candidates, across all domains ...
- Use output, normalized impact, and h-index



# In what database context ... ?

Selected my own publications in WoS and Scopus, Google Scholar has a pre-set profile.

Database	H-index	Based upon ...
Web of Science	14	Articles in journals
Scopus	25	Articles, book (chapters), and conference proceedings papers
Google Scholar	33	All types, incl. Reports

## CWTS methodology: basic indicators

## Indicators suitable for assessment (1)

***p***: the number of publications of a unit, in a certain period.

***tcs***: The total number of citations received in a certain period.

***mcs***: the mean citation score of the oeuvre of a unit.

***% not cited***: the share of that oeuvre that is not cited.

***% self citations***: the share of citations given by the (co-)authors.

## Indicators suitable for assessment (2)

***mncs***: the comparison of the actual impact with expected field average impact scores.

***mnjs***: comparison of the journals in which the unit published, with the field average impact in which the output was published.

***internal coverage***: indicates relevance of the bibliometric analysis, based on reference behavior of units themselves.

***Top 10%***: The share of the output that belongs to the top 10% most highly cited in the fields the unit is active in.

## Various additional types of analysis focus on ...

- *Research profiles*: a break down of the output over various fields of science.
- *Scientific cooperation analysis*: a break down of the output over various types of scientific collaboration.
- *Knowledge user analysis*: a break down of the 'responding' output into citing fields, countries or institutions.
- *Network analysis*: how is the network of partners composed, based on scientific cooperation?



## Advantages and disadvantages of bibliometric analysis

## Some disadvantages of applying bibliometrics ...

- Steers away from more qualitative considerations.
- Metrics shape as much as measure scientific activity.
- People tend to forget we are talking about *'indicators'*.
- Tends to stimulate one-dimensional thinking.
- It requires skills to calculate and interpret results.
- ....



## Some advantages of applying bibliometrics ...

- It offers insights into underlying structures and patterns.
- It is a strong complementary tool to peer review.
- It is relatively stable in time.
- ....



## We have not dealt with ...

- The historical-social sciences perspective on the origins of the rise of bibliometrics in the nowadays science system.
- University rankings and all their problems.
- Bibliometric mapping and network methodologies.
- *'Address'* and *'Author'* issues when collecting data.
- Open Access and the 'issues' in relation to evaluation
- ...



## Some conclusions ...

- Bibliometrics should always be combined with peer review,
- ... and preferably conducted by skilled experts !
- Always contextualize the bibliometric scores !
- One better avoids the ***'Quick & Dirty'*** indicators !
- Advanced bibliometrics can be very helpful in research management, at various levels.



**Thank you for your attention!**

**Any questions?  
Ask me now, or mail me  
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