## Bibliometrics beyond rankings

(or: integrating heterogeneous data)

#### Peter van den Besselaar

VU University Amsterdam

Department of Organization Sciences & Network Institute



## What are bibliometric (alt-metic) scores?

#### Performance metrics

- Answering 'who are the best' (papers, journals, researchers, institutions, universities, countries)
- Efforts to improve finding 'the' correct indicators

#### Incentive

- With beneficial and negative effects (for who?)
- Different, depending on position / career phase

#### Ideology

- Excellence discourse
- Really used by established elites?



## Demystifying citations

- Just an observational item
  - May be used (next to others) to measure aspects of performance
- But the underlying concepts are something else
  - Citations 'correlate' with underlying performance concepts
  - Ideally: multiple item scales are needed
  - Ranking on individual items is meaningless
- Observations help to find theoretical and practical answers
- However where are smart questions about the functioning and impact of the science system

## Incentives or ideology?

- Indicators and rankings have become important as incentives – as people react
  - E.g., citations, H-index, Impact factor or A-publications
  - Researchers, managers, policy makers, funders may adapt
- However, do decision makers really use citation based criteria?
  - Or do they only claim so?

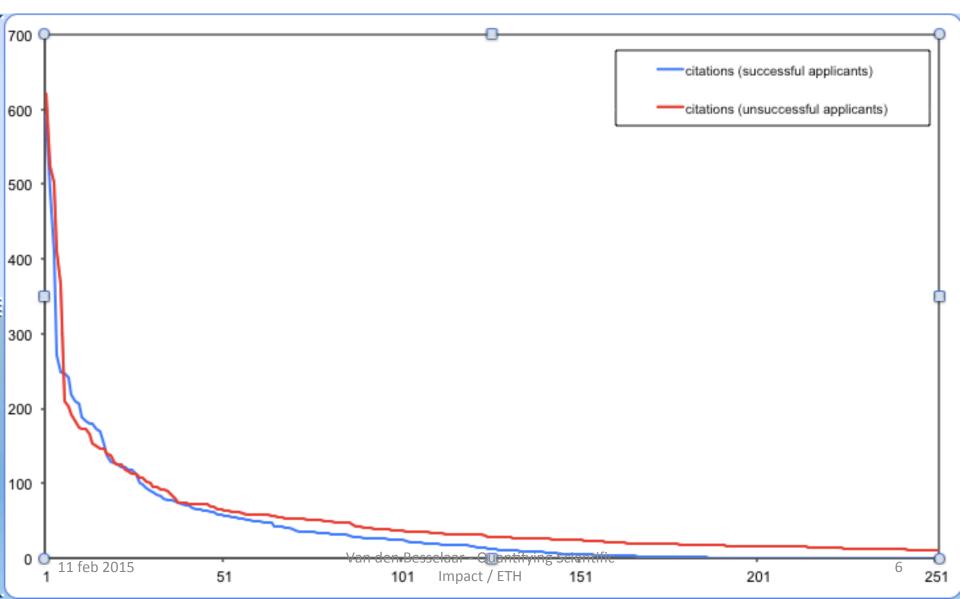


## At least they do not always!

- Council decisions do not correlate with bibliometrics / many false positives and false negatives, and with a very low predictive validity.
- Those around the council (insiders) apply more, and get more funding; but do not have better performance
  - Better bureaucratic competencies, learning to write proposals, information advantage.
- Panel members and reviewers consider impact factor of journals as more important than the performance of the applicants
  - "... has extensive experience in the field, achieving important research outcomes, with an impressive H-index and many citations. However, the publication venues are not very prestigious. The PI has already established a research team."



## Citations: granted and non-granted



## Impact: of agents or of the system?

- Impact rank order of individual agents: trivial
  - always a rank-order; there is always a top
- But the real impact question is at the systems level
  - What structural and behavioral characteristics pay off in terms of research systems' impact, performance?
    - Rankings may play a role (as part of an incentive structure)
    - How (if at all) do they work, and under what conditions?
- Understanding underlying mechanisms is important
  - Also for policy and management: what works and why?

## What is the impact we are after?

#### Scholarly impact

- Does the system (to be defined) contribute to scientific break through and scientific progress
- Does the system generate a next generation of very good researchers

#### Societal impact

- Does the system contribute to radical social and technological innovations?
- Does the system generate a next generation of very creative highly educated workforce?
- Are links between science and society well functioning



## Proposal

- Let's use citation data for understanding the working of the system – let's first ask relevant questions
- For example:
  - Impact of organizational forms on performance?
  - Impact of funding ecology on performance?
  - Impact of evaluation institutions on performance?
  - How to link the system with society to improve the use of knowledge?
  - How to select talent selection what is scholarly talent and how to identify?
  - Identification of new fields specialties

# Example 1: What incentives to introduce? (Quantity versus quality)

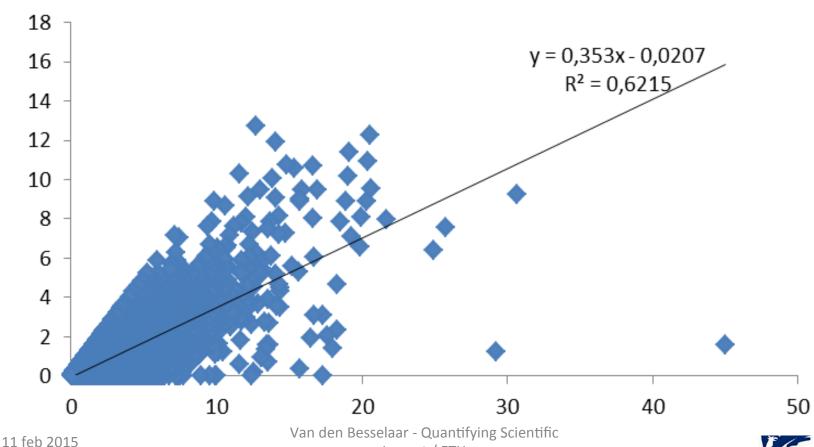
- Is focus on output good or bad for the system?
  - Focus on quantity is wrong incentive (L. Butler on Australia)
  - High impact is by chance the more one tries (many publications) the more likely to get a hit (Simonton on scientific creativity)

## Citation impact as test:

- Are the more productive authors also author of the highly cited papers?
  - Test (50.000 Swedish authors); Using percentile groups
  - Top 1% highly cited authors: good for 8% of the fract.
     publications
  - The high volume producers have much larger share in top impact papers.
- Simonton, not Butler!

# CSS1 (top 20% cited papers) by productivity

#### CSS<sub>1</sub>



Impact / ETH

# Example 2: Does higher competition and autonomy improve performance?

- Competition: % project funding
  - Van Steen (2010) OECD project-funding study
- Autonomy of universities
  - Aghion et al (2007) survey among universities
- Academic freedom
  - Teichler et al (2013) study on academic profession
- Performance:
  - Share of country in (field normalized) top 10% cited papers (woS)

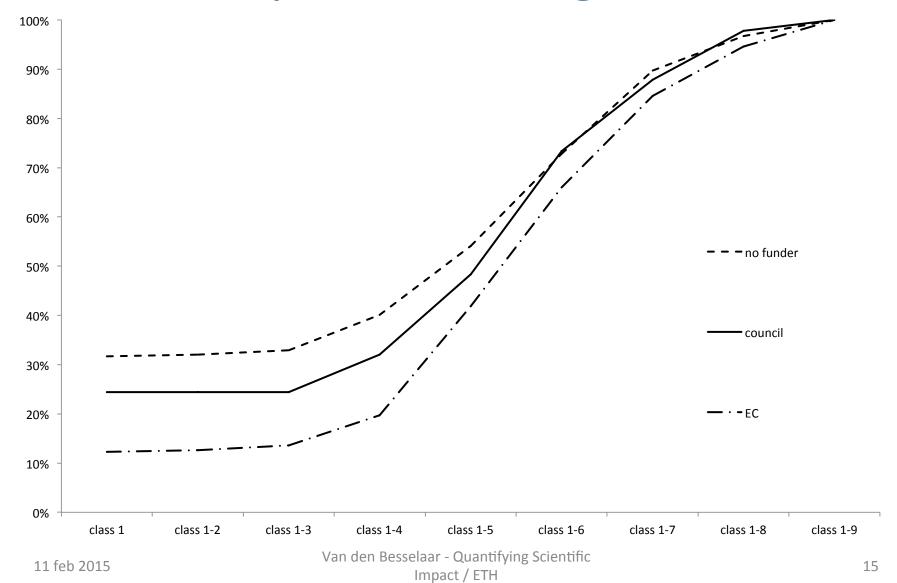


## Preliminary findings

- Some preliminary tests
  - Competition: works negative on performance r = -0.24 (14 countries)
  - Autonomy: too large autonomy works negative r = -0.29 (9 countries)
  - Academic freedom is important for performance r = 0.58 (8 countries)
- Further work needed



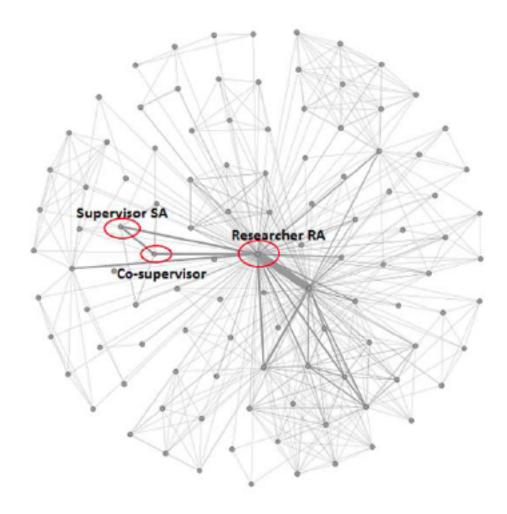
## Example 3: funding modes



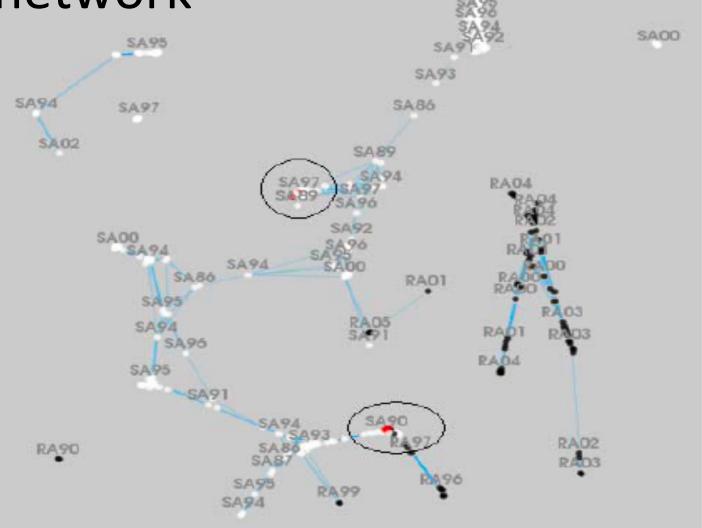
## Example 4: What factors influence selection of talent?

- What is talent?
  - Many dimensions (Van Arensbergen, et al, Res Eval 2014)
  - Which dominate?
  - Independence often mentioned for early career researchers
- Independence or impact or productivity?
- How to measure independence using bibliometrics?
  - An independent young researcher has
    - An *own* network different from former supervisor's network
    - An own research agenda different from former supervisor's agenda

## Coauthor ego network



## Topic network



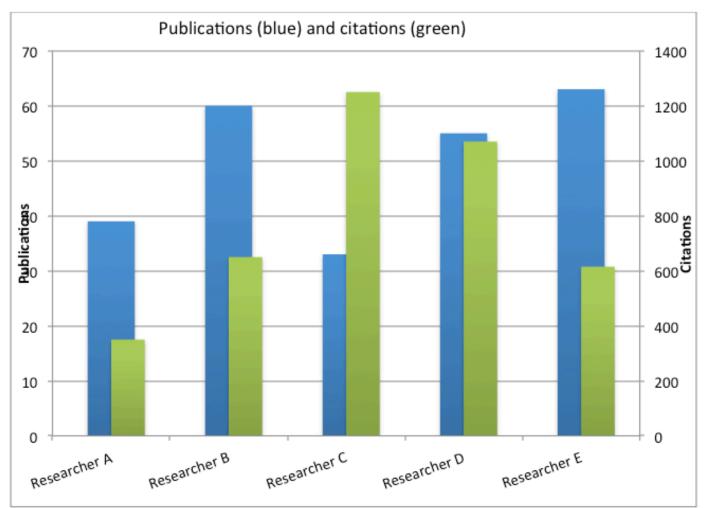
SA02

### Initial test

- Five researcher-supervisor relations
- All in chemistry and life sciences
- Researchers about the same age (-> 40)
- All with good publication and citation performance

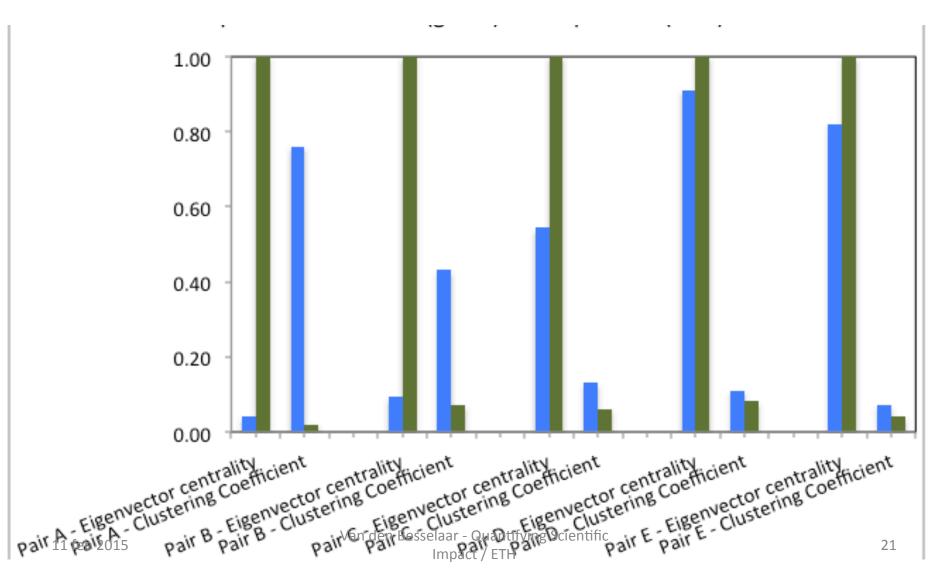
### Performance of researchers in the test

publications between 40 and 60; citations between 350 and 1200



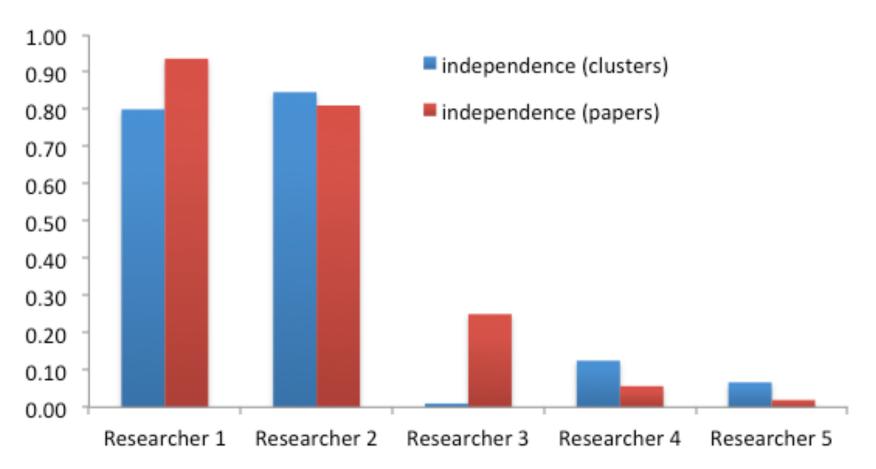
## Coauthor network independence

(Blue = supervisor; green = researcher)



### Cognitive independence

(share of topical clusters without papers of supervisor)



## Preliminary findings (3)

 'Quantity indicators (publications, citations)' do not distinguish successful (A, B) from the others (C, D, E).

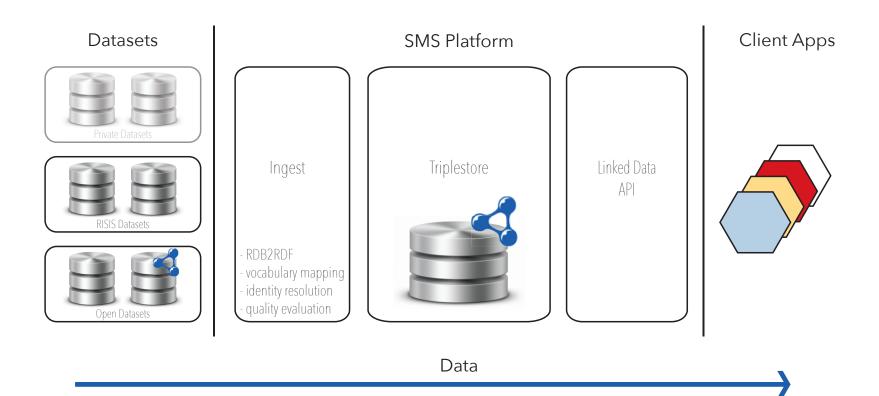
 The proposed indicators are plausible indicators for measuring independence.

Independence seem to predict academic career success

### Conclusions

- Bibliometric indicators should be used better as variables in sociologically informed studies of how science systems work and can be improved
  - Rankings and related phenomena are part of the system not of its understanding
- Alt-metrics: an additional data source for those research
  - if we know what it means!
- Bibliometric data remain of utmost importance but in combination with other data -> data infrastructure

## Annex: RISIS SMS: Data integration with maximal flexibility, quality control, access



- Based on semantic Web Technologies for maximum flexibility and interoperability
- Client access via a set of entity-centric APIs

## Thanks for your attention

www.vandenbesselaar.net

