

# How researchers' performance should be assessed: Wrap up

Yerevan 27-28 Oct. 2022

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# Outline

1. Research evaluation: why
2. How to measure (and compare!) individual research performance
3. How not to measure research performance
4. Ranking distortions when using invalid indicators
5. Conclusions and recommendations

# Conclusions

- ✓ Count only what counts and be aware of what you cannot count
- ✓ The most popular research performance indicators are invalid
- ✓ Field classification of scientists is absolutely required to compare performance at the individual level
- ✓ Research performance at the individual level is absolutely required to measure performance at organizational level

# The use of bibliometrics to inform decision-making at policy and management levels

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# Research evaluation goals

- ✓ Stimulating higher research productivity
- ✓ Allocating resources according to performance
- ✓ Informing research policy (strategy)
- ✓ Reducing information asymmetry between supply and demand
- ✓ Demonstrating that investment in research is effective and delivers public benefits

# Outline

1. How to measure research performance at the aggregate level (discipline, institution, ...)
2. How not to measure research performance
3. Ranking distortions when using invalid indicators
4. Conclusions and recommendations

# Tangible image

“Scientometrics is to research  
policy/management as diagnostic  
imaging is to medicine”

# Research evaluation problems

- ✓ Proliferation of (invalid) performance indicators
- ✓ Doubtful assessment methods
- ✓ Abundance of non theory-based rankings
- ✓ Media fanfare for (wrong!) world institutions rankings
- ✓ Do-it-yourself practices
- ✓ Poor strategic and policy perspectives



# Individual research performance indicator

## The Fractional Scientific Strength (FSS)

$$FSS_R = \frac{1}{(w_R + k)} \cdot \frac{1}{t} \sum_{i=1}^N c_i f_i$$

Where:

$N$  = number of publications of the researcher in the period under observation

$c_i$  = weighted combination of normalized citations and impact factor associated to publication  $i^*$

$f_i$  = fractional contribution of the researcher to publication  $i$

$w_R$  = average yearly salary of the researcher

$k$  = average yearly capital used by the researcher

$t$  = number of years of work of the researcher in the period under observation

\* Abramo, G., D'Angelo, C.A., & Felici, G. (2019). Predicting long-term publication impact through a combination of early citations and journal impact factor. *Journal of Informetrics*, 13(1), 32-49.

# FSS in words

- ✓ It counts all publications of a scientist in a period of time
- ✓ It divides each publication by the number of authors (it weights their contribution based on their position in the byline, if not alphabetically ordered)
- ✓ It measures their value by a weighted combination of citations and IF, each scaled by a factor accounting for field and year of publication
- ✓ It accounts for input

# Research performance at the aggregate level

- ✓ **Premise:** To measure research institution performance, one needs to know the identity of staff, output and field of research of each individual
- ✓ **Statement:** Research institutions are not homogenous in terms of number and size of research fields
- ✓ **Proposition:** Individual performance is absolutely required to measure performance at organizational level

# The Fractional Scientific Strength (FSS)

aggregate level

Productivity of research units (e.g. field, discipline, department, institution) based on  $FSS_R$

$$FSS_D = \frac{1}{RS} \sum_{j=1}^{RS} \frac{FSS_{R_j}}{\overline{FSS_R}}$$

Where:

$RS$  = research staff of the unit, in the observed period

$FSS_{R_j}$  = productivity of researcher  $j$  in the research unit

$\overline{FSS_R}$  = average productivity of all national productive researchers in the same SDS as researcher  $j$

# The performance in each field (SDS)

The fields within the discipline (UDA) “Medicine” of Institution *X*

| Field                                         | O     |              |                | FSS   |              |                |
|-----------------------------------------------|-------|--------------|----------------|-------|--------------|----------------|
|                                               | Score | Rank         | Rank( $\eta$ ) | Score | Rank         | Rank( $\eta$ ) |
| MED/09-Internal medicine                      | 0.739 | 6 out of 12  | 55             | 0.435 | 8 out of 12  | 36             |
| BIO/14-Pharmacology                           | 0.457 | 25 out of 37 | 33             | 0.287 | 25 out of 37 | 33             |
| MED/38-General and specialised pediatrics     | 0.524 | 33 out of 42 | 22             | 0.460 | 28 out of 42 | 34             |
| MED/40-Gynaecology and obstetrics             | 0.816 | 5 out of 22  | 81             | 0.242 | 5 out of 22  | 81             |
| MED/42-General and applied hygiene            | 1.103 | 8 out of 52  | 86             | 1.000 | 14 out of 52 | 75             |
| MED/07-Microbiology and clinical microbiology | 1.525 | 3 out of 23  | 91             | 2.077 | 2 out of 23  | 95             |
| BIO/13-Applied biology                        | 0.425 | 37 out of 42 | 12             | 0.225 | 38 out of 42 | 10             |
| MED/08-Pathological anatomy                   | 0.667 | 28 out of 40 | 31             | 0.485 | 26 out of 40 | 36             |
| MED/11-Cardiovascular diseases                | 1.023 | 8 out of 27  | 73             | 1.053 | 9 out of 27  | 69             |

# The performance of Institution 'X' in each discipline (UDA)

| UDA* | O     |                | SS    |                | FO    |                | FSS   |                |
|------|-------|----------------|-------|----------------|-------|----------------|-------|----------------|
|      | Score | Rank( $\eta$ ) | Score | Rank( $\eta$ ) | Score | Rank( $\eta$ ) | Score | Rank( $\eta$ ) |
| 2    | 1.231 | 81             | 1.246 | 76             | 0.988 | 69             | 1.087 | 76             |
| 3    | 1.031 | 72             | 0.973 | 63             | 1.111 | 86             | 1.092 | 79             |
| 5    | 1.031 | 65             | 0.853 | 45             | 1.064 | 72             | 0.865 | 47             |
| 6    | 1.033 | 74             | 1.033 | 67             | 1.080 | 76             | 1.115 | 79             |
| 7    | 0.775 | 46             | 0.643 | 39             | 0.845 | 54             | 0.734 | 46             |
| 9    | 0.741 | 26             | 0.763 | 43             | 0.763 | 33             | 0.766 | 39             |

\* 2, Physics; 3, Chemistry; 5, Biology; 6, Medicine; 7, Agricultural and veterinary sciences; 9, Industrial and information engineering

# Key performance indicators

## ➤ Individual level:

- Productivity (FSS) and its components
- Highly-cited articles per researcher

## ➤ Institution level:

- Productivity (FSS)
- Share of unproductive staff
- Share of top scientists
- Effectiveness of recruitment
- Rate of institution-industry collaborations

# How not to measure research performance

- ✓ The MNCS
- ✓ The h-index
- ✓ The Shanghai ranking and the like
- ✓ The UK-like national research assessment exercises (RAEs)



# Distortion of universities rankings by h and g indexes

| Percentage of Q1 universities by<br>FSS not included in the same set<br>by |    |    |
|----------------------------------------------------------------------------|----|----|
| UDA                                                                        | h  | g  |
| Mathematics and computer science                                           | 45 | 47 |
| Physics                                                                    | 48 | 51 |
| Chemistry                                                                  | 49 | 46 |
| Earth sciences                                                             | 42 | 35 |
| Biology                                                                    | 42 | 36 |
| Medicine                                                                   | 40 | 35 |
| Agricultural and veterinary science                                        | 41 | 33 |
| Civil engineering                                                          | 28 | 26 |
| Industrial and information engineering                                     | 40 | 35 |
| <i>Total</i>                                                               | 42 | 38 |

# The Shanghai Ranking

ARWU  
by Shanghai  
Jiao Tong  
University

<http://www.shanghairanking.com/ARWU2018.html>

Sapienza, Padua:  
151-200

| Academic Ranking of World Universities 2018 |                                             |                                                                                       |                        |             |          |
|---------------------------------------------|---------------------------------------------|---------------------------------------------------------------------------------------|------------------------|-------------|----------|
| World Rank                                  | Institution*                                | By location                                                                           | National/Regional Rank | Total Score | Score on |
|                                             |                                             | All                                                                                   |                        |             | Alumni   |
| 1                                           | Harvard University                          |    | 1                      | 100         | 100      |
| 2                                           | Stanford University                         |    | 2                      | 75.6        | 44.5     |
| 3                                           | University of Cambridge                     |    | 1                      | 71.8        | 82.3     |
| 4                                           | Massachusetts Institute of Technology (MIT) |    | 3                      | 69.9        | 70.9     |
| 5                                           | University of California, Berkeley          |    | 4                      | 68.3        | 65.6     |
| 6                                           | Princeton University                        |    | 5                      | 61          | 55.8     |
| 7                                           | University of Oxford                        |    | 2                      | 60          | 50.8     |
| 8                                           | Columbia University                         |    | 6                      | 58.2        | 62.8     |
| 9                                           | California Institute of Technology          |    | 7                      | 57.4        | 53.5     |
| 10                                          | University of Chicago                       |    | 8                      | 55.5        | 59.2     |
| 11                                          | University of California, Los Angeles       |  | 9                      | 51.2        | 29.2     |
| 12                                          | Cornell University                          |  | 10                     | 50.7        | 43.1     |
| 12                                          | Yale University                             |  | 10                     | 50.7        | 47.1     |
| 14                                          | University of Washington                    |  | 12                     | 50          | 24.9     |
| 15                                          | University of California, San Diego         |  | 13                     | 47.8        | 19       |

# The Shanghai ranking criteria

## Metodology: total score

| Criteria             | Indicator                                                       | Weight |
|----------------------|-----------------------------------------------------------------|--------|
| Quality of Education | Alumni of an institution winning Nobel Prizes and Fields Medals | 10%    |
|                      | Staff of an institution winning Nobel Prizes and Fields Medals  | 20%    |
| Quality of Faculty   | Highly cited researchers in 21 broad subject categories         | 20%    |
|                      | Papers published in Nature and Science                          | 20%    |
| Research Output      | Papers indexed in SCI-E and SSCI (Web of Science)               | 20%    |
|                      | Per capita academic performance of an institution               | 10%    |

90% of the score is size dependent!

# UK like RAEs: main limits

- ✓ *Robustness*: How sensitive are rankings to the share of the output evaluated?
- ✓ *Reliability*: Do universities submit their best outputs?
- ✓ *Accuracy*: How accurate is the quality evaluation of products and institutions?
- ✓ *Functionality*: How useful are national rankings for universities, students, companies, ...?
- ✓ *Costs and time of execution*: Very high

# Comparison of Italian RAE and FSS quartile university ranking lists

| UDA                                       | No. of<br>universities | % shifting<br>quartile | Correlat. | From top<br>to non top |
|-------------------------------------------|------------------------|------------------------|-----------|------------------------|
| Mathematics and<br>computer science       | 50                     | 46.0%                  | 0.60      | 46.2%                  |
| Physics                                   | 43                     | 60.5%                  | 0.25      | 38.5%                  |
| Chemistry                                 | 42                     | 59.5%                  | 0.69      | 45.5%                  |
| Earth sciences                            | 30                     | 60.0%                  | 0.52      | 37.5%                  |
| Biology                                   | 50                     | 52.0%                  | 0.60      | 69.2%                  |
| Medicine                                  | 43                     | 48.8%                  | 0.73      | 45.5%                  |
| Agricultural and<br>veterinary sciences   | 28                     | 46.4%                  | 0.77      | 42.9%                  |
| Industrial and<br>information engineering | 46                     | 47.8%                  | 0.56      | 50.0%                  |

# Insight

*‘Non quia difficilia sunt non audemus, sed quia non audemus difficilia sunt’*

Seneca (4 BC - 65 AD)

*‘It is not because things are difficult that we do not try; it is because we do not try that things are difficult’*

# Conclusions

- ✓ Count only what counts and be aware of what you cannot count
- ✓ The most popular research performance indicators are invalid
- ✓ Field classification of scientists is absolutely required to compare performance at the individual level
- ✓ Research performance at the individual level is absolutely required to measure performance at organizational level
- ✓ Avoid the “do-it-yourself” temptation
- ✓ The FSS performance evaluation conducted in Italy can be replicated in any other institution or country, and the first might serve as a benchmark for comparison

*Grazie*

Շնորհակալություն

*Thank you!*



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<https://sites.google.com/view/laboratoriortt>