



AI FOR PROPOSAL

HANDLING AND SELECTION

Wolfgang Kerzendorf SciOps 2022 18 May 2022 on behalf of the DeepThough Initiative

I C



"WHEN YOU'RE FUNDRAISING, IT'S AI. WHEN YOU'RE HIRING, IT'S ML. WHEN YOU'RE IMPLEMENTING, IT'S LOGISTIC REGRESSION."

everyone on Twitter ever





ML FOR PROPOSAL HANDLING AND SELECTION

Always has been

Wait it's all about peer review





THE OXFORD E WIKIPEDIA; TIONARY DEFINES PEER REVIEW



PEER REVIEW IS THE EVALUATION OF SCHOLARLY WORK. RESEARCH. OR IDEAS BY ONE OR MORE PEOPLE WITH SIMILAR COMPETENCIES AS THE **PRODUCERS**.



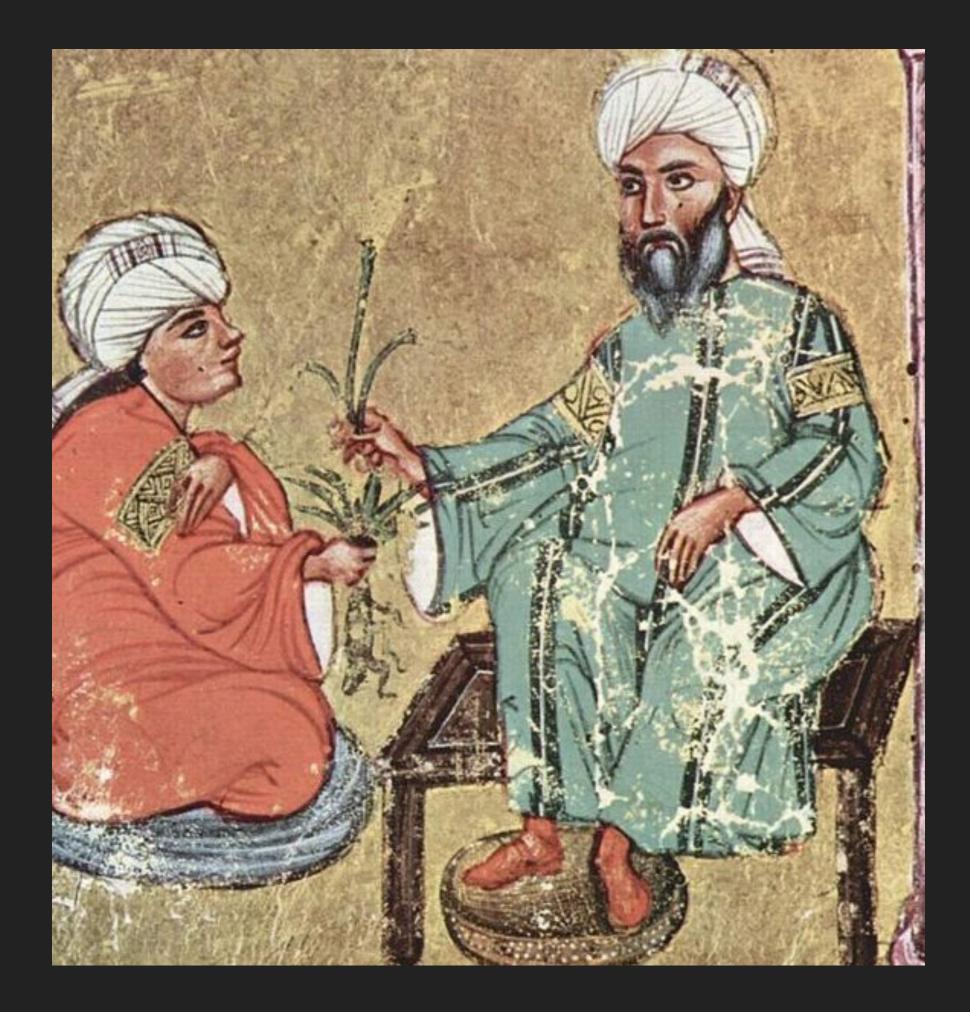




- A form of self-regulation of the scientific community
- It should (according to Wikipedia) be used to
 - maintain quality standards
 - improve performance
 - provide credibility
- Focussing on resource allocation in this talk

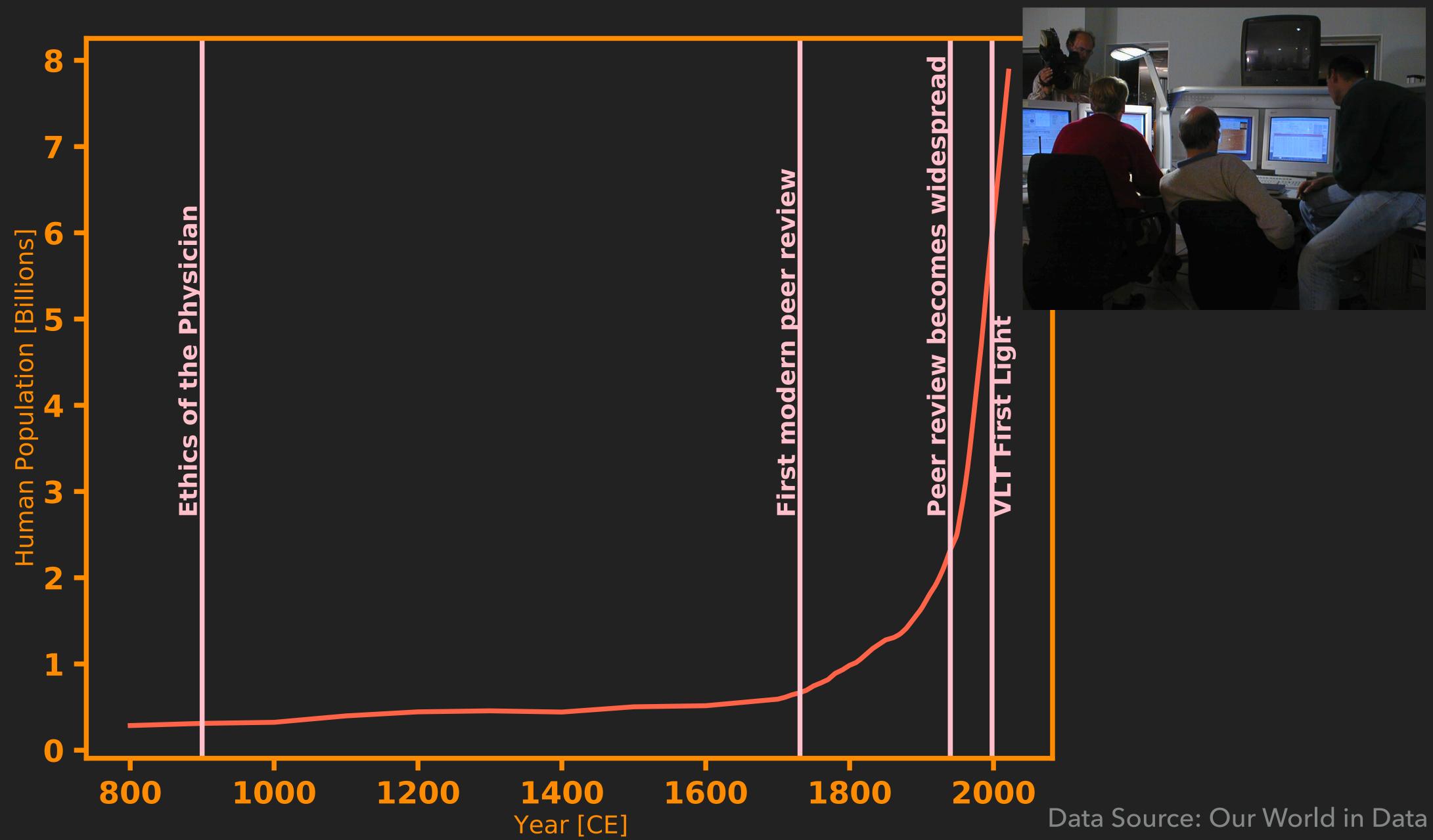
SOME HISTORY

- Credibility of science is most crucial in medical science
- "Ethics of the Physician" written by Alī al-Ruhāwī in ~900 CE
- Modern peer review Royal Society of Edinburgh in 1731
- Second half of 20th century more widespread (see e.g. Spier 2002)



THE CHALLENGE: A GROWING AND **GLOBAL SCIENTIFIC COMMUNITY**





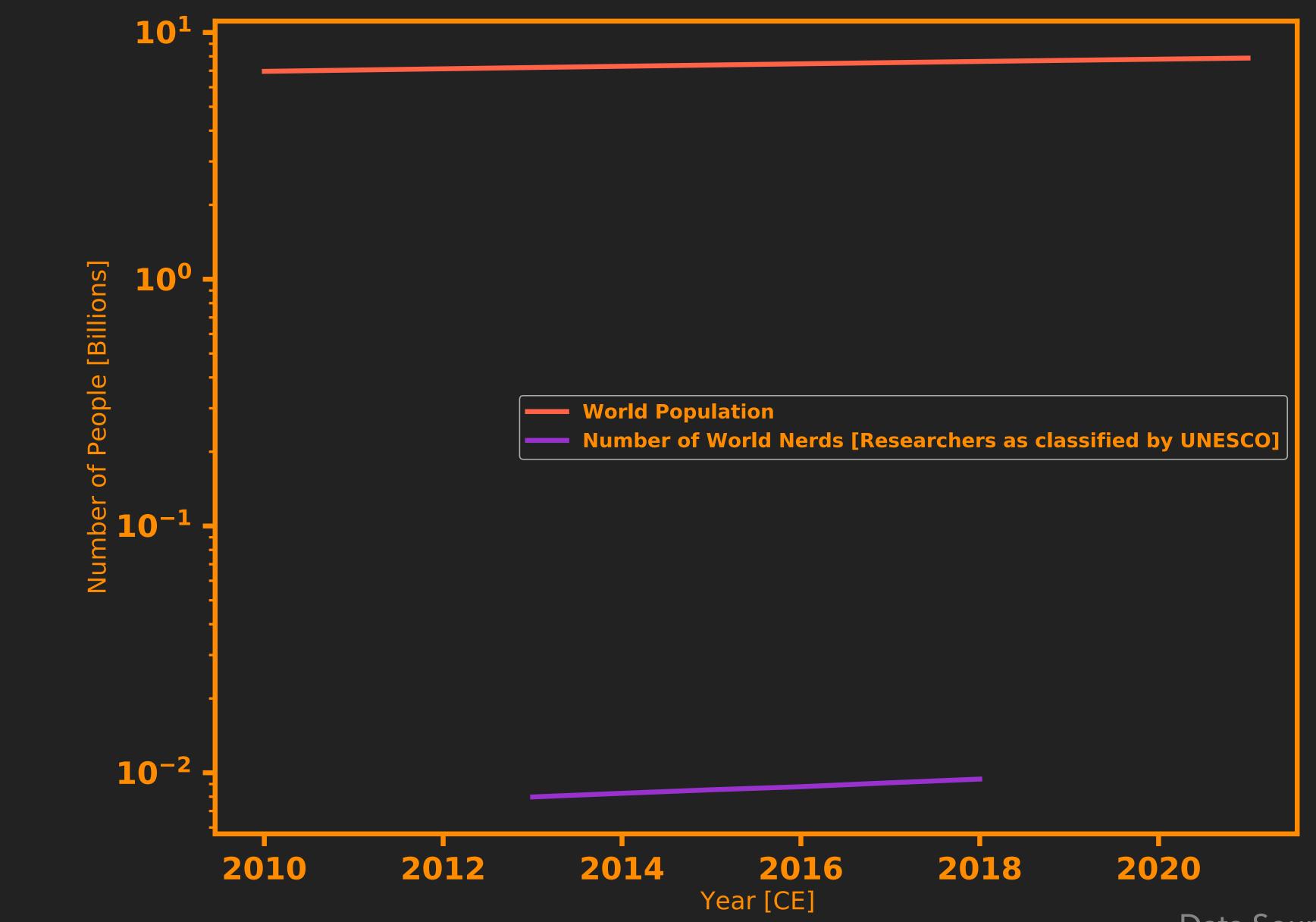








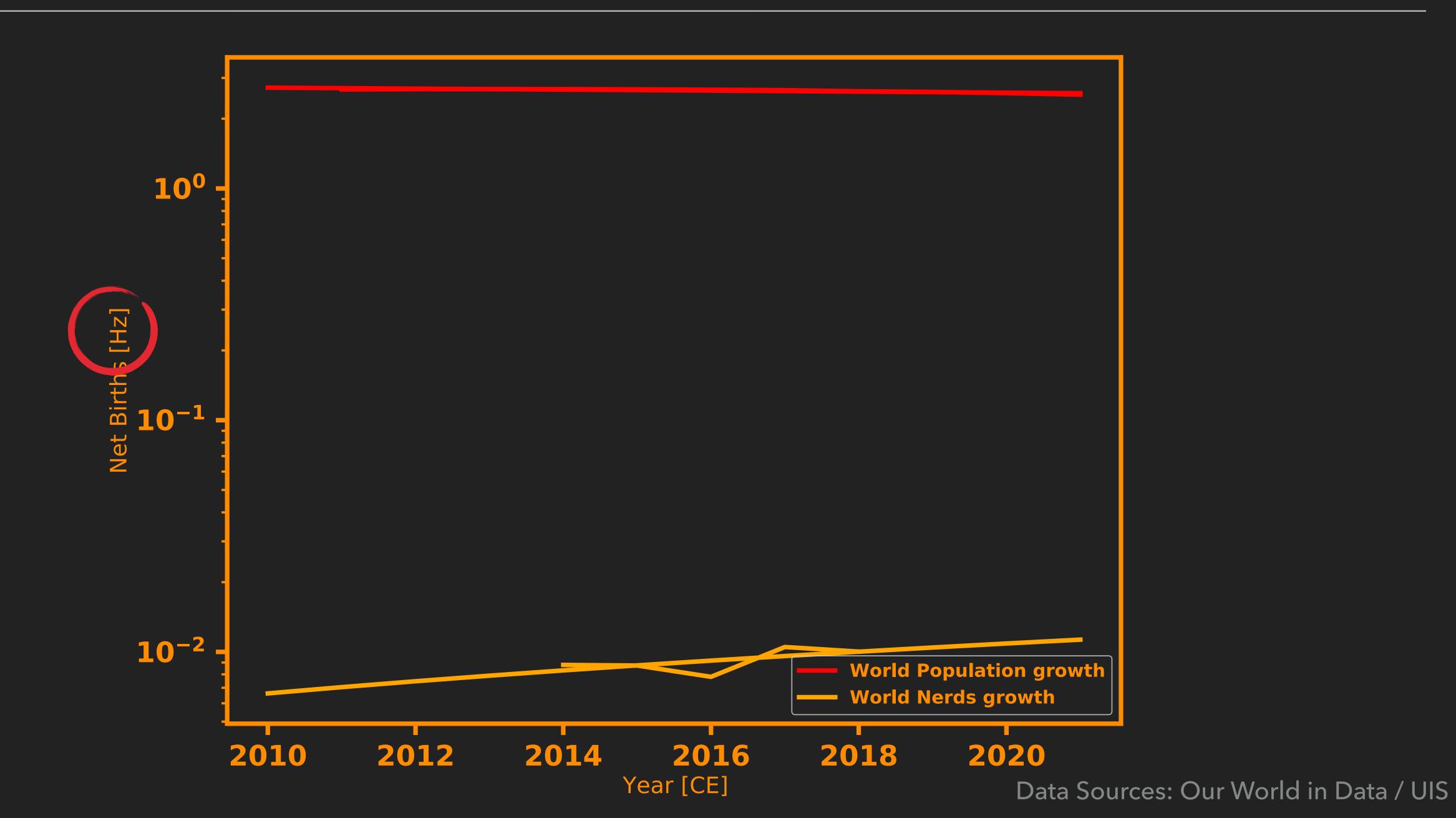
NERDS PER SECOND



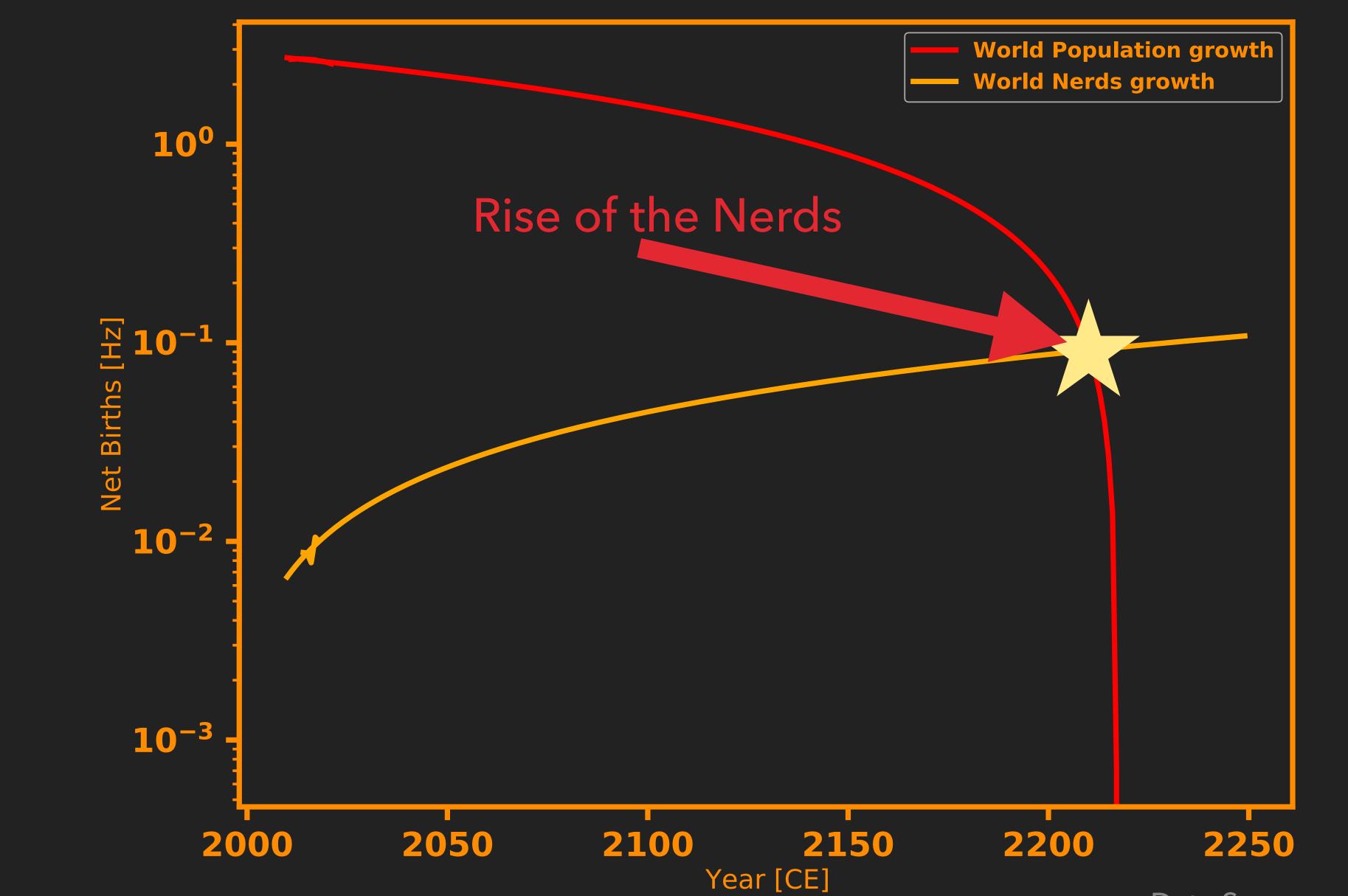
Data Sources: Our World in Data / UIS

م / | ||<

NERDS PER SECOND



NERDS PER SECOND

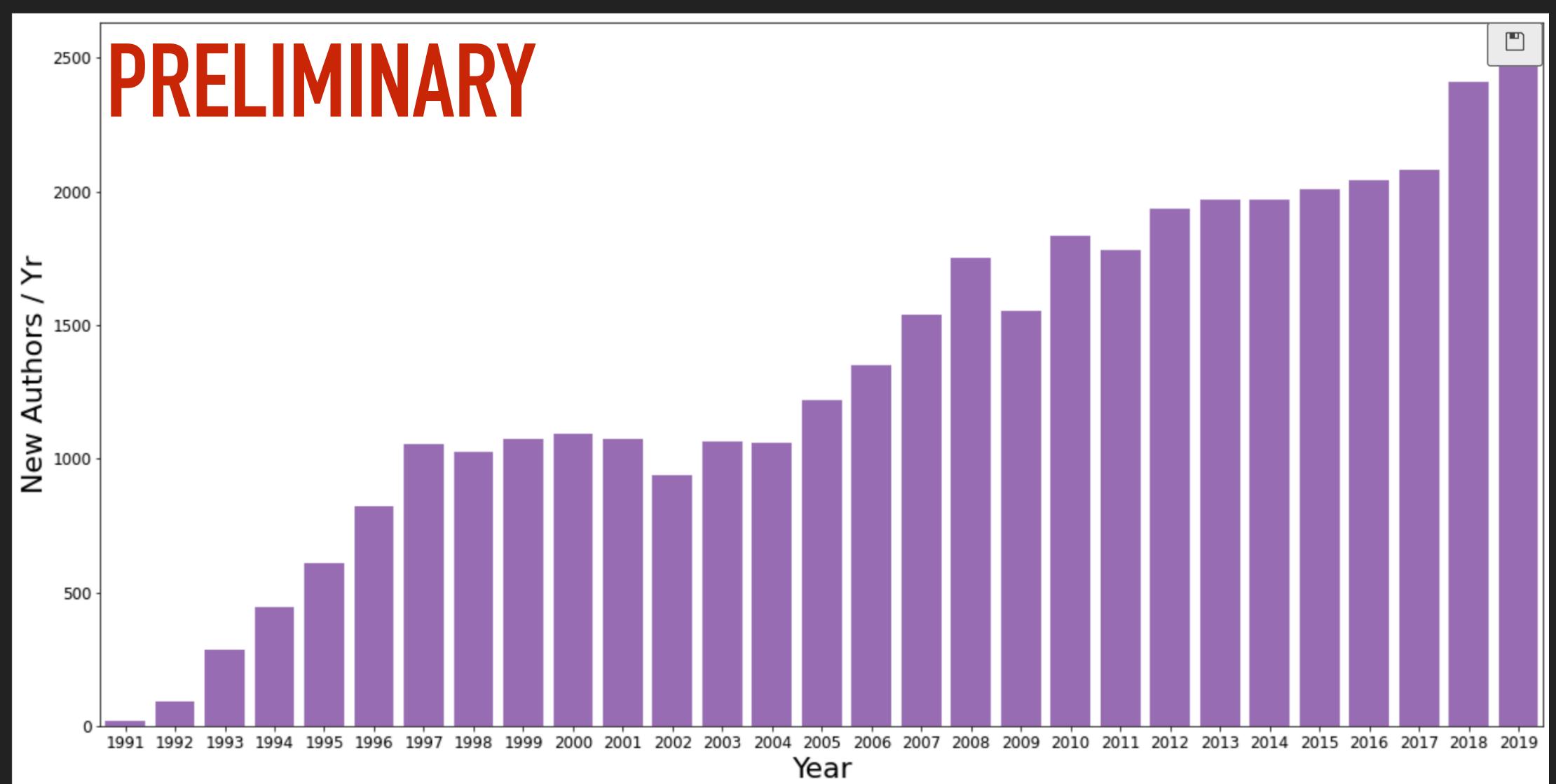


Data Sources: Our World in Data / UIS

م / | ||<

GROWTH IN ASTRONOMY

RISE OF THE ASTRONOMERS



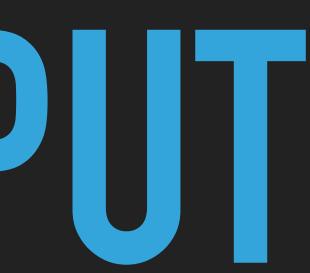


Bea Lu

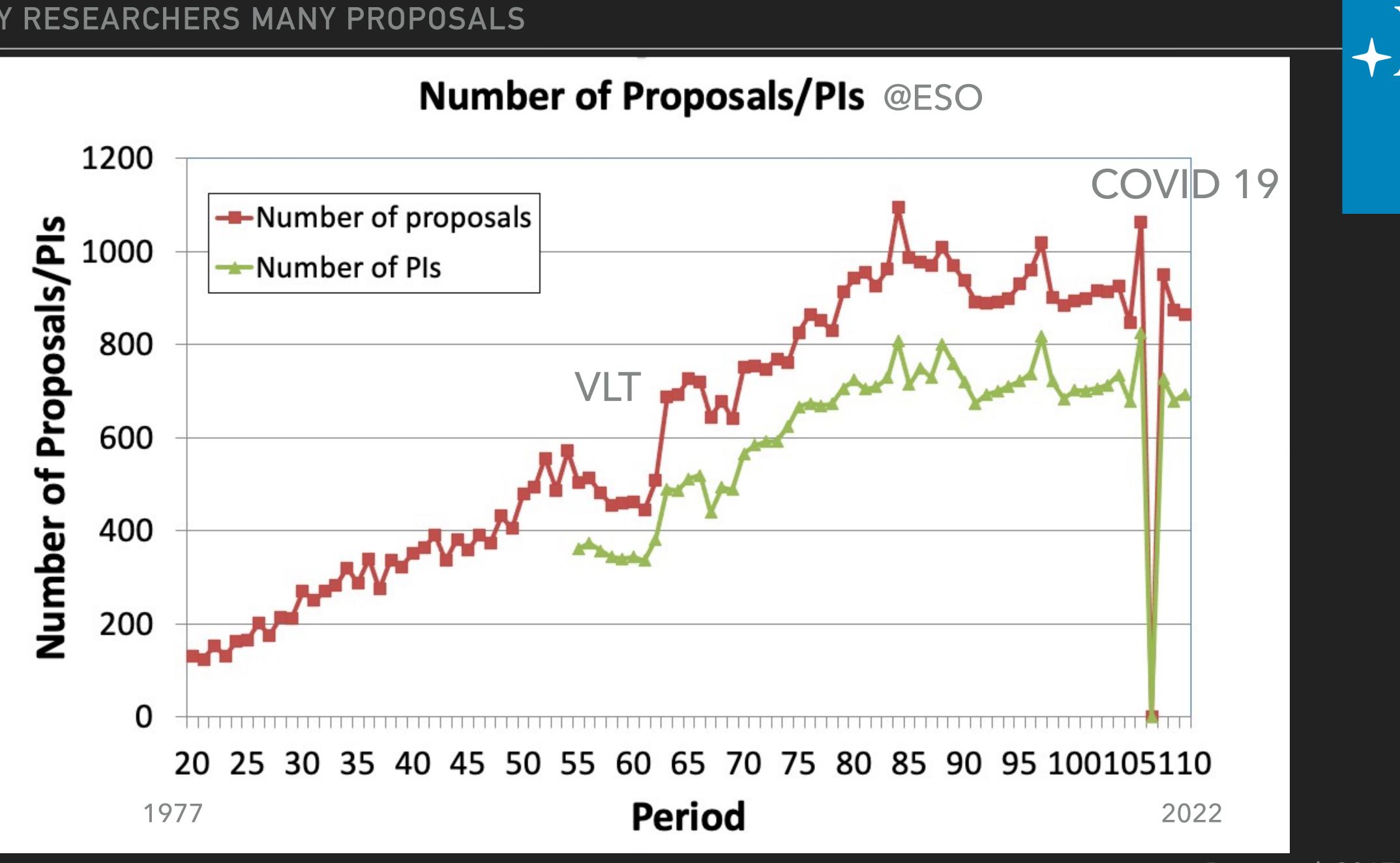




MANY RESEARCHERS



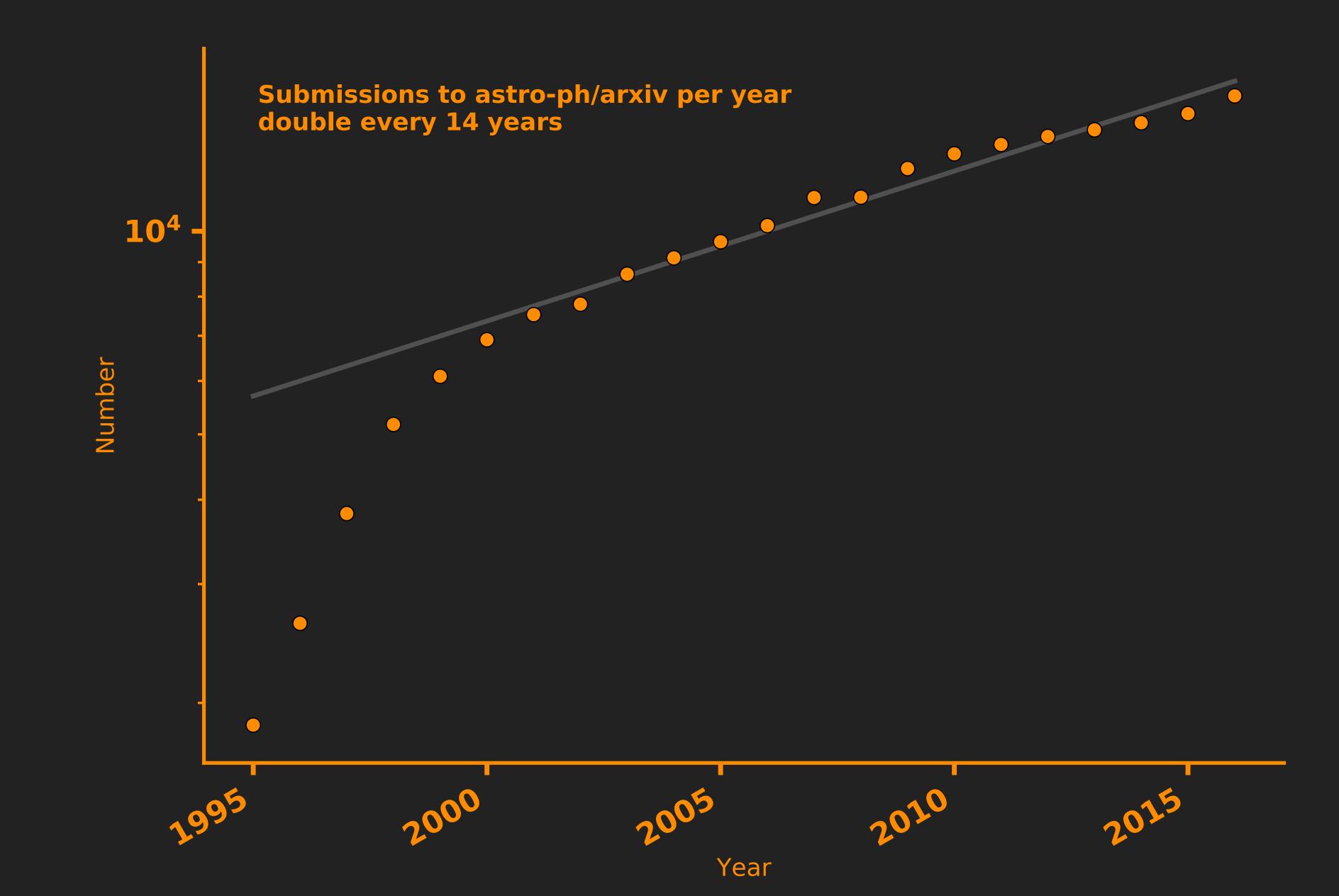
MANY RESEARCHERS MANY PROPOSALS



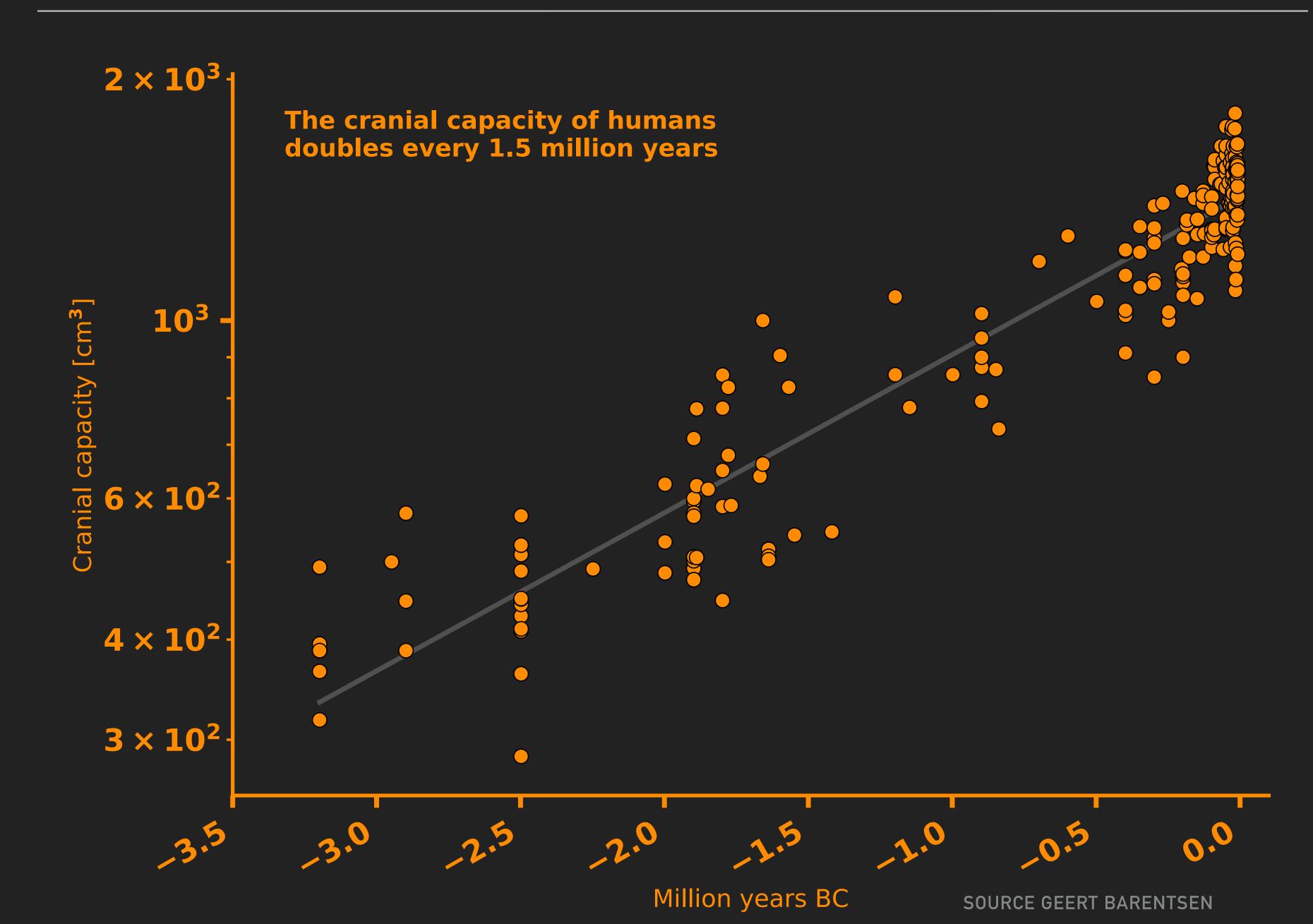
Patat et al. 2017 (updated)



MANY RESEARCHERS MANY PAPERS



HUMANS WON'T GET SMARTER ... FAST ENOUGH



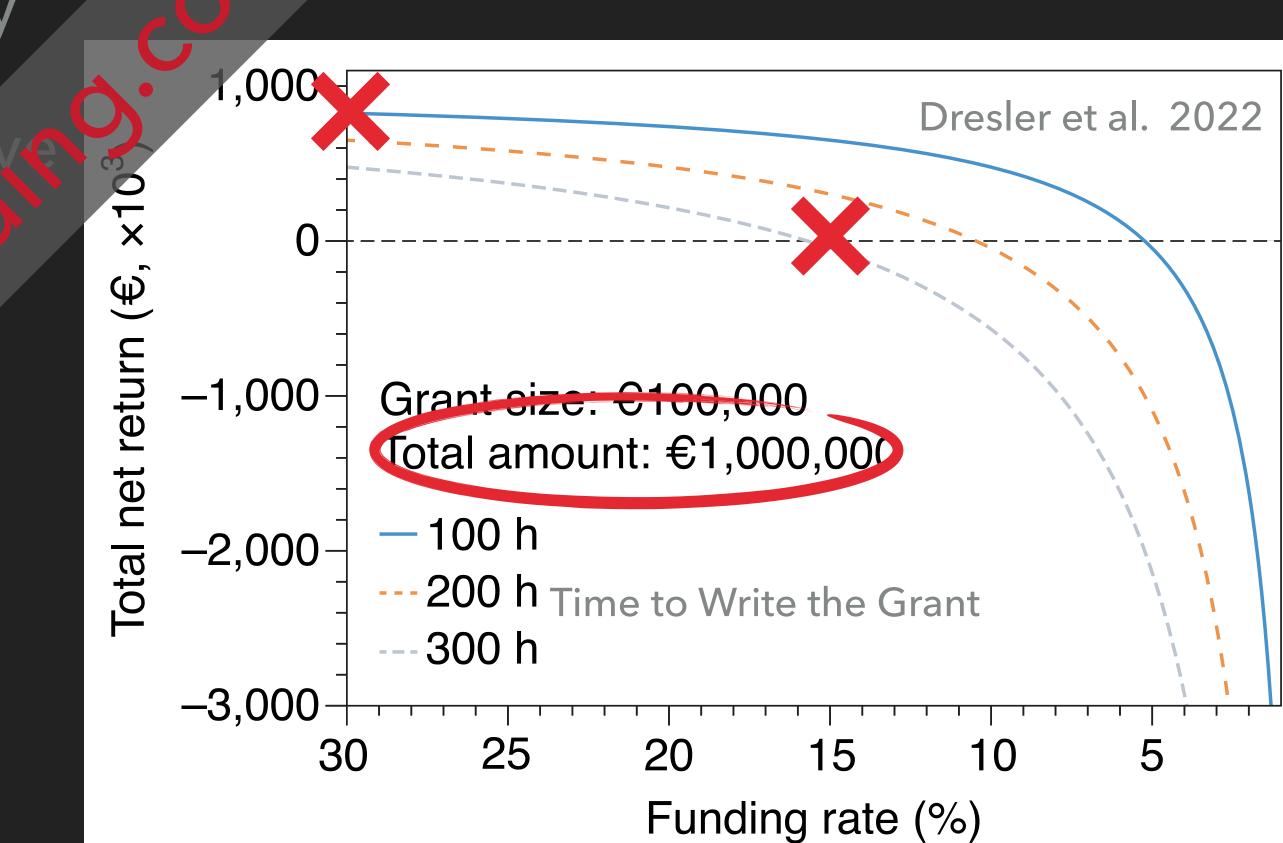
CHALLENGE?



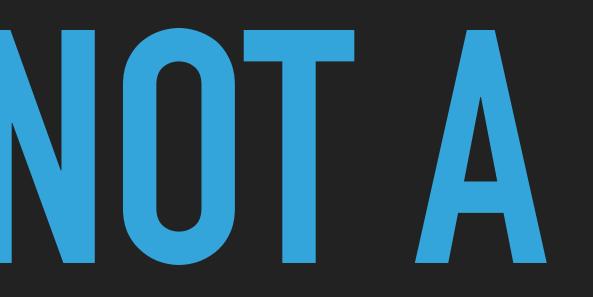
COST OF PEER REVIEW

- Rising number of researchers and rising num
- Funding does not increase as steeply
- Net-injection financial can be negative

research products



A PATCH - NOTA





Featuring Nando and many others here at ESO

ML ENHANCED

DISTRIBUTED PEER REVIEW

Kerzendorf, Patat et al. 2020



TWO ASPECTS OF THE EXPERIMENT

DISTRIBUTED PEER REVIEW

IDENTIFYING EXPERTISE WITH ML

DISTRIBUTED PEER REVIEW HISTORY

- Distributing the peer review task among the applicants as opposed to an invited panel
- Internet is changing things (Kohane & Altman 2000; The new peer review):
 - Recent proposals to start a life sciences online repository of preprints highlights the trend towards "publish first, review later" that seems to be emerging.
- For example Wikipedia a new form of peer review (March 9, 2000)
- Formalized Distributed Peer Review (Merrifield & Saari 2009)
- Gemini Fast Turnaround program (since 2015; Andersen+ 2019)
- > Pilot at NSF in 2016 for Civil, Mechanical, and Manufacturing Innovation Division
 - Program Officer retired





- Time Allocation Committee operations.
- 172 proposals 23% of Pls participated in this process
- Everyone who submits one proposal needs to review 8 proposals (each proposal has 8 reviews)

Period 103 (2018) a distributed peer review was run in parallel to normal ESO

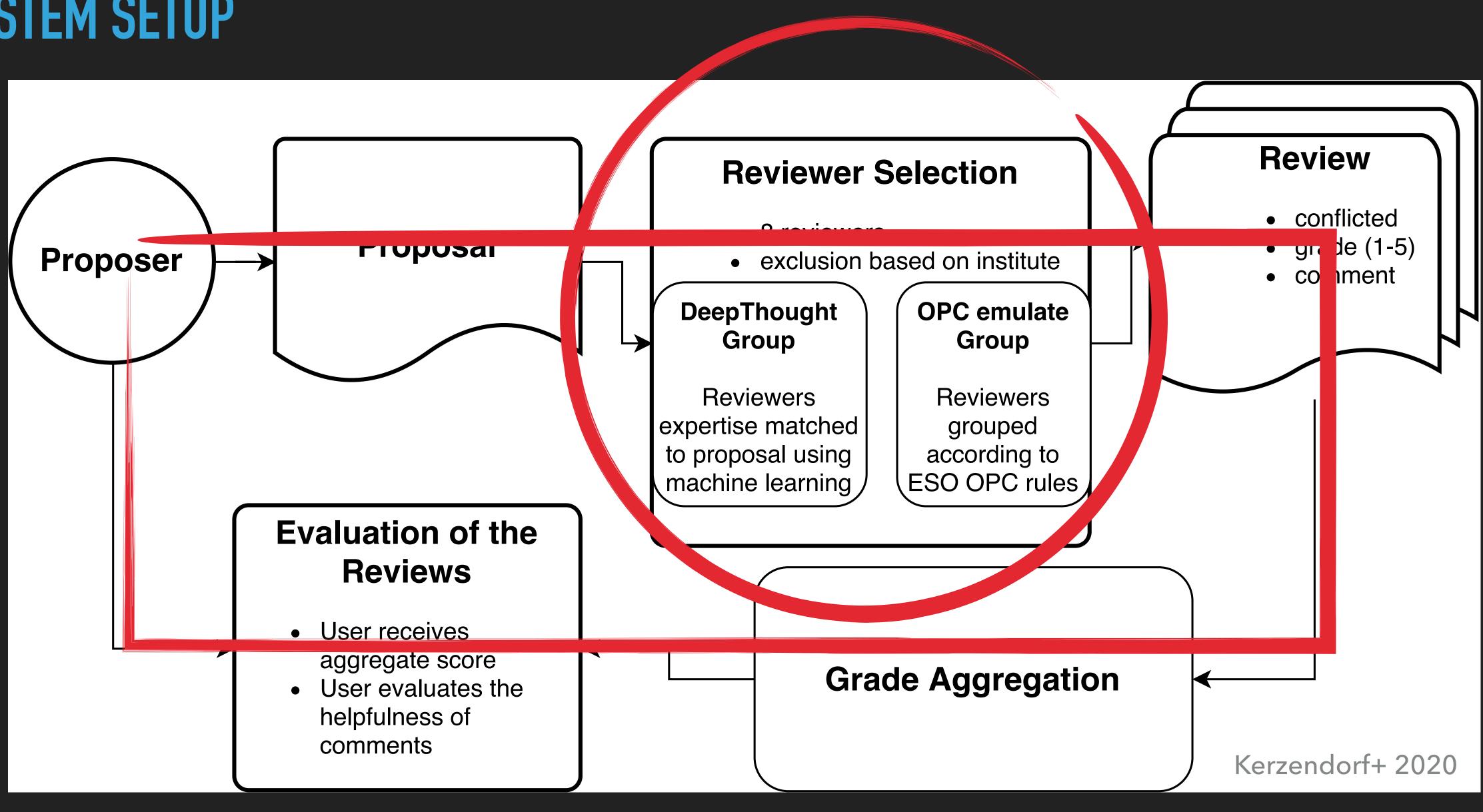






THE EXPERIMENTAL SETUP

SYSTEM SETUP





IDENTIFYING EXPERTISE WITH ML

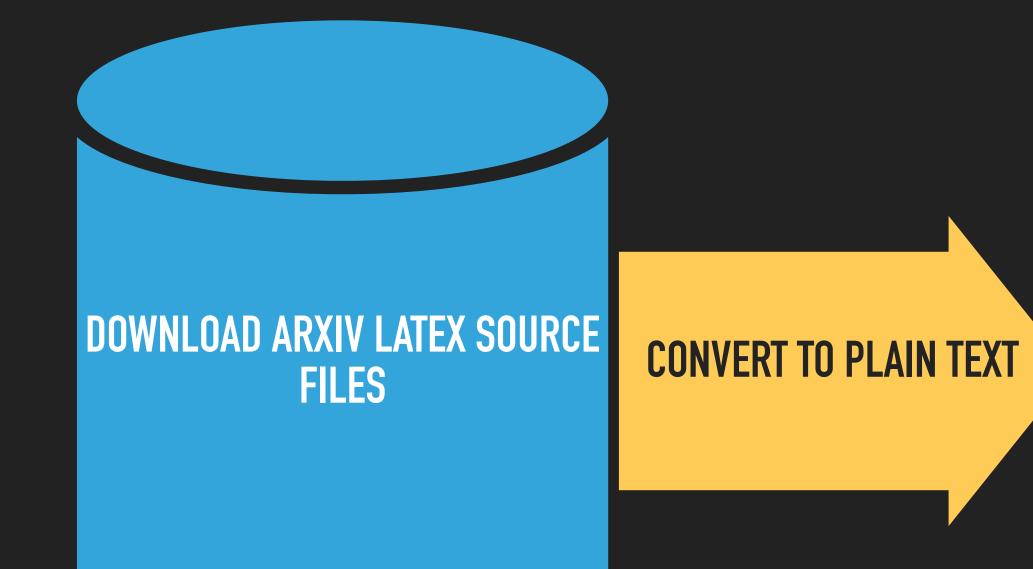
IDENTIFYING EXPERTISE

OBJECTIVELY



FINDING EXPERTS

- Panel expertise and proposal often matched by self-identified knowledge categories
- Distributed peer review also requires matching
- Should be automatic to lower impact on observatory
- Expertise is partially expressed in papers people write
- ... and they are easily accessible through Arxiv
- ... and Arxiv can be fully downloaded (~2 TB)





@ESO - thanks to Uta and team

USE NATURAL Language processing

INFORMATION ENCAPSULED IN DOCUMENT VECTORS

LOTS OF JARGON! WHAT DID WE DO?

DETOUR TO NATURAL LANGUAGE PROCESSING



KERZENDORF 2017A

DOCUMENT WORD VECTORS (TFIDF – LUHN 1957; SPÄRCK JONES 1972)

Document =

star model

0.0210.019

().



MATCHING REVIEWERS

WHAT IF WE COULD KNOW WHAT EVERYONE KNOWS

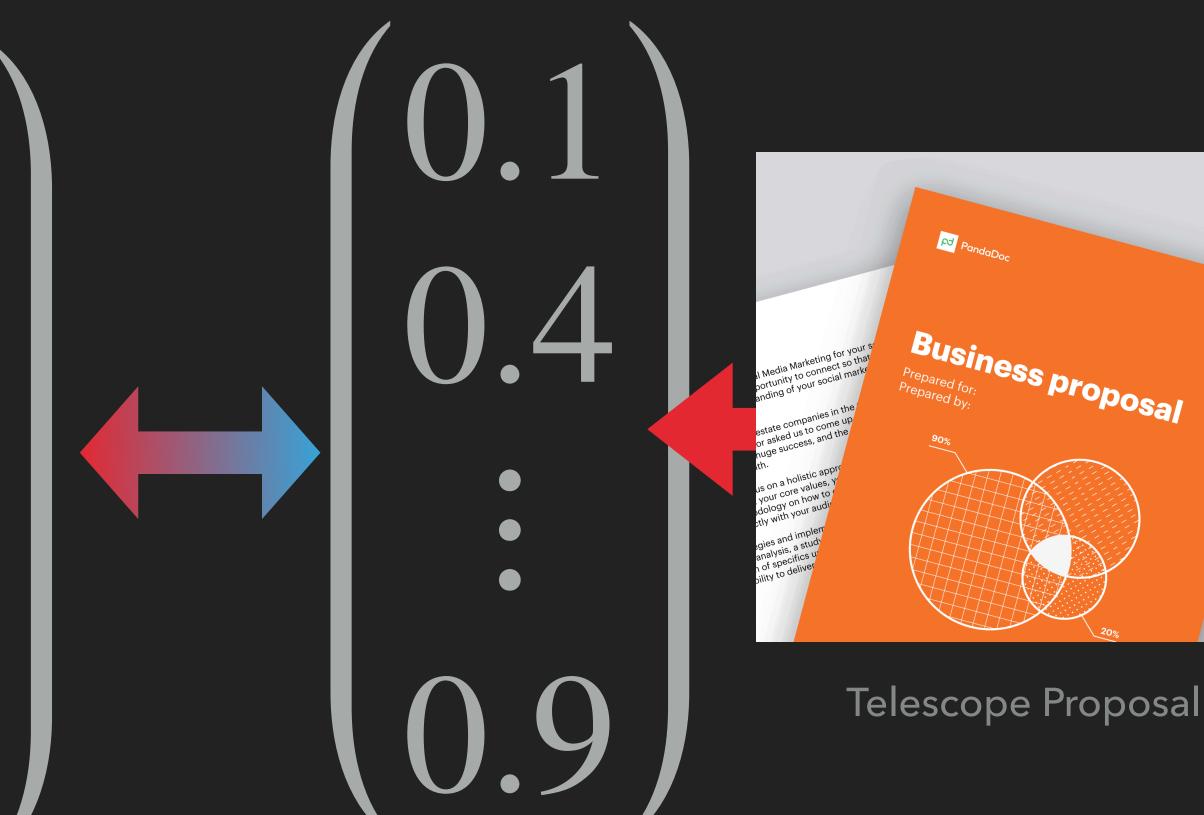


Sum of Scientist - published works

document vectors

0.3 $\mathbf{V} \bullet \mathbf{V}$

Knowledge Vector



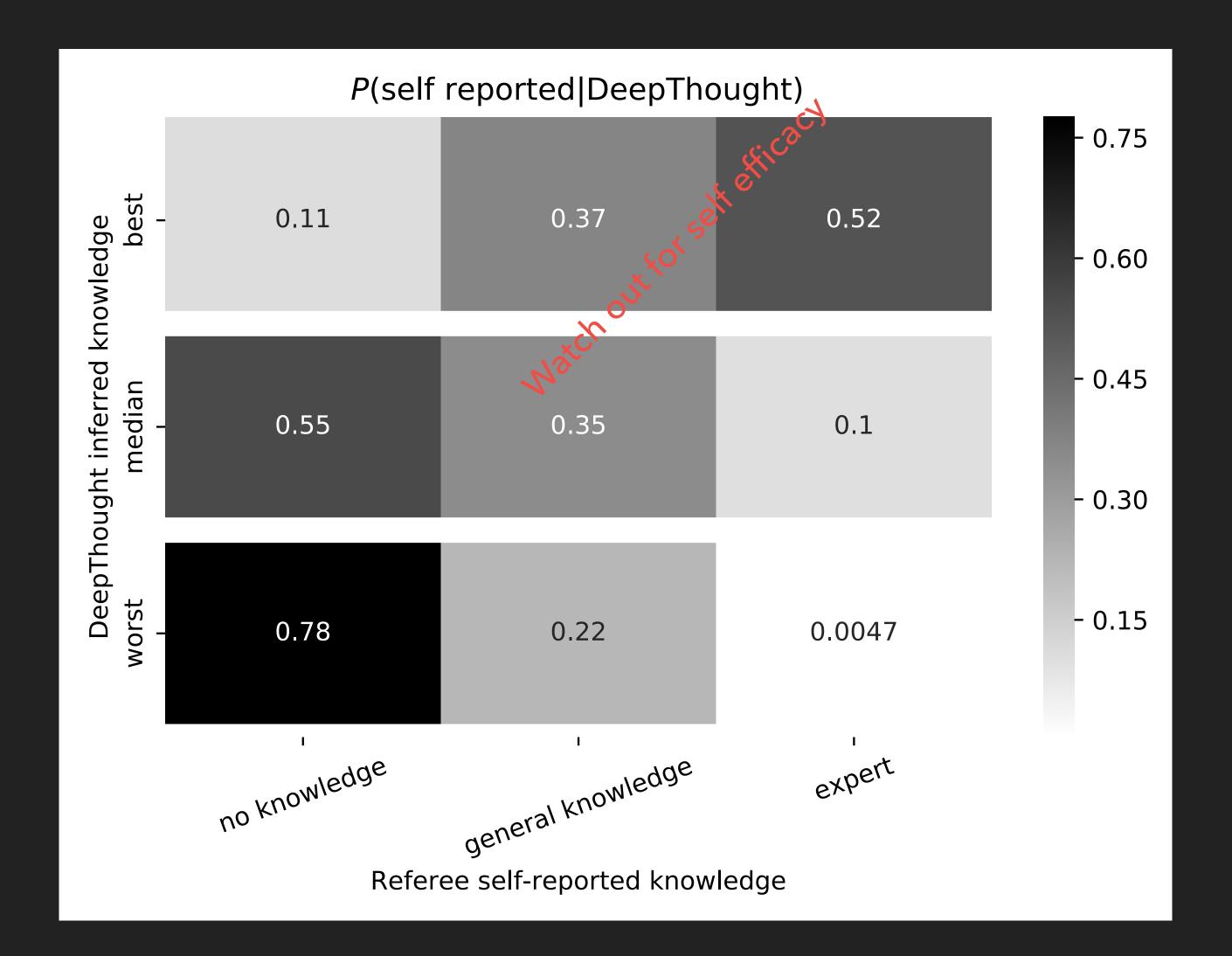
Proposal Vectors







SELF-ASSESSED EXPERTISE VS DEEPTHOUGHT

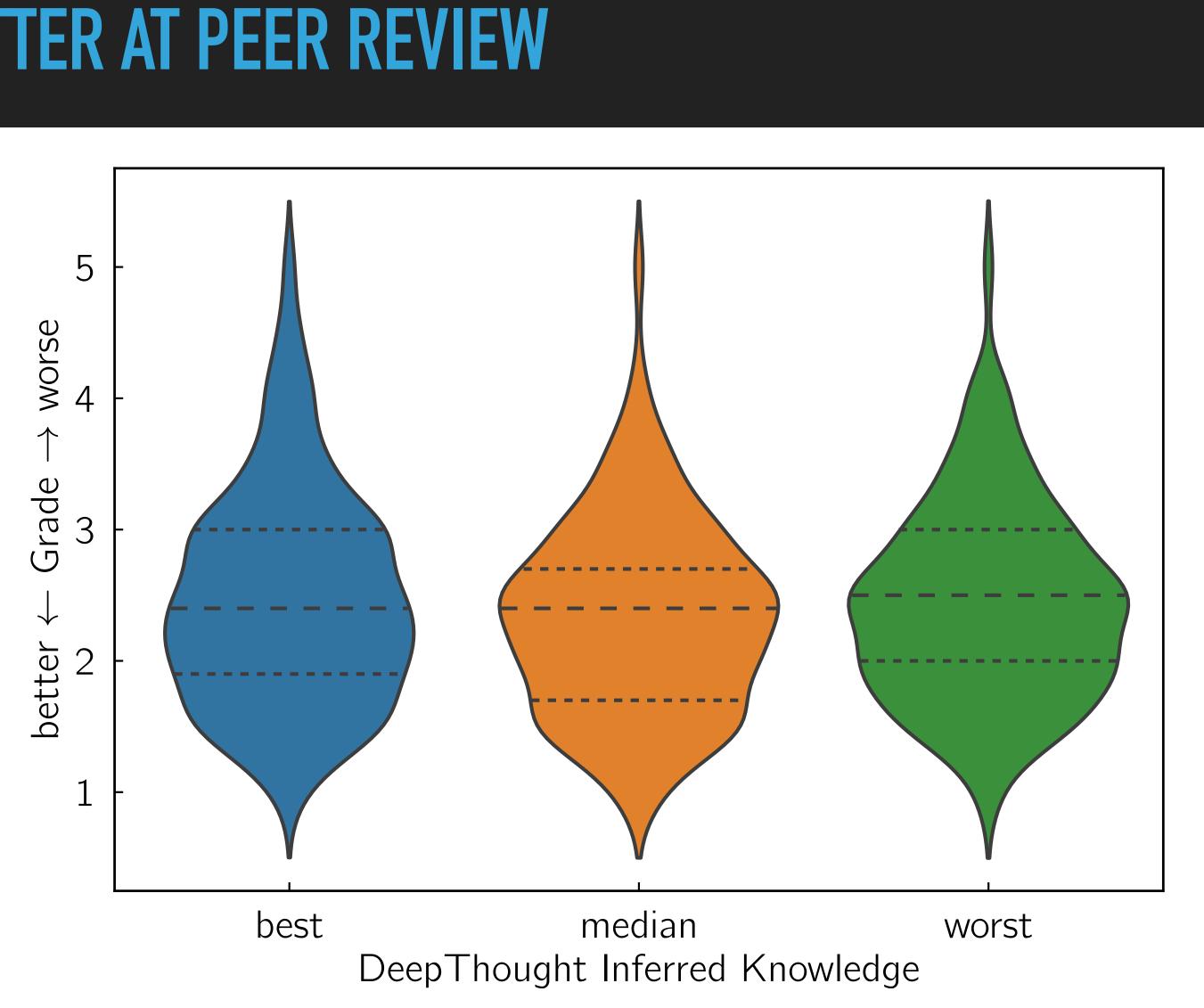


Kerzendorf+ 2020

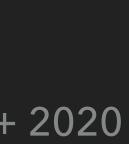


DOES EXPERTSE

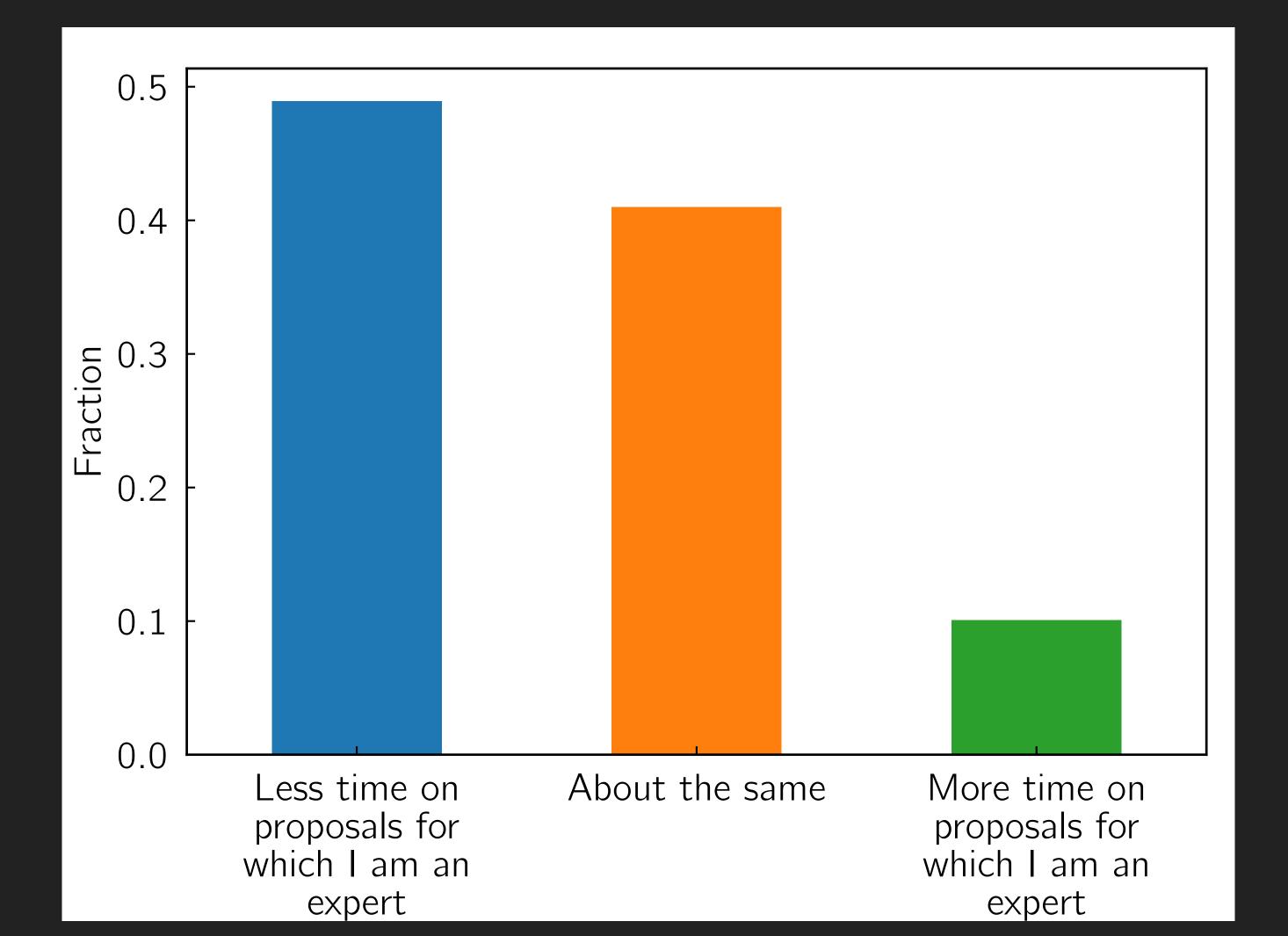
ARE EXPERTS BETTER AT PEER REVIEW



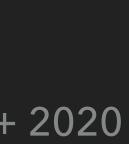
Kerzendorf+ 2020



EXPERT REVIEWERS NOT NECESSARILY DIFFERENT ... BUT CHEAPER

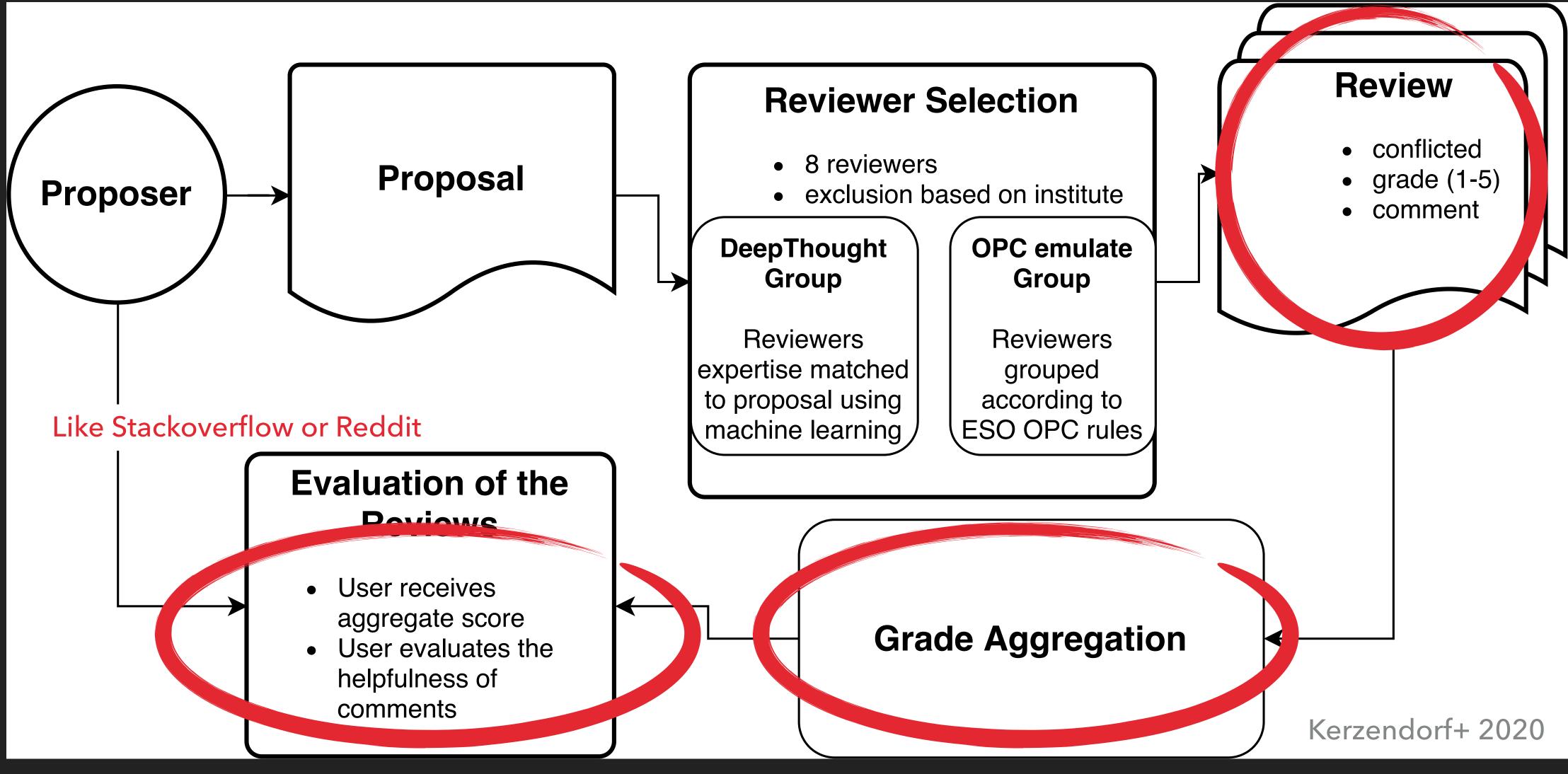


Kerzendorf+ 2020



THE EXPERIMENTAL SETUP

SYSTEM SETUP



COMPARING TO TRADITIONAL TAC



HARD COMPARISON

- First experiment in the 1970s National Academy of Sciences Committee on Science and Public Policy (Cole, Cole & Simon 1981)
 - physics
 - Half successful, half unsuccessful
 - each proposal

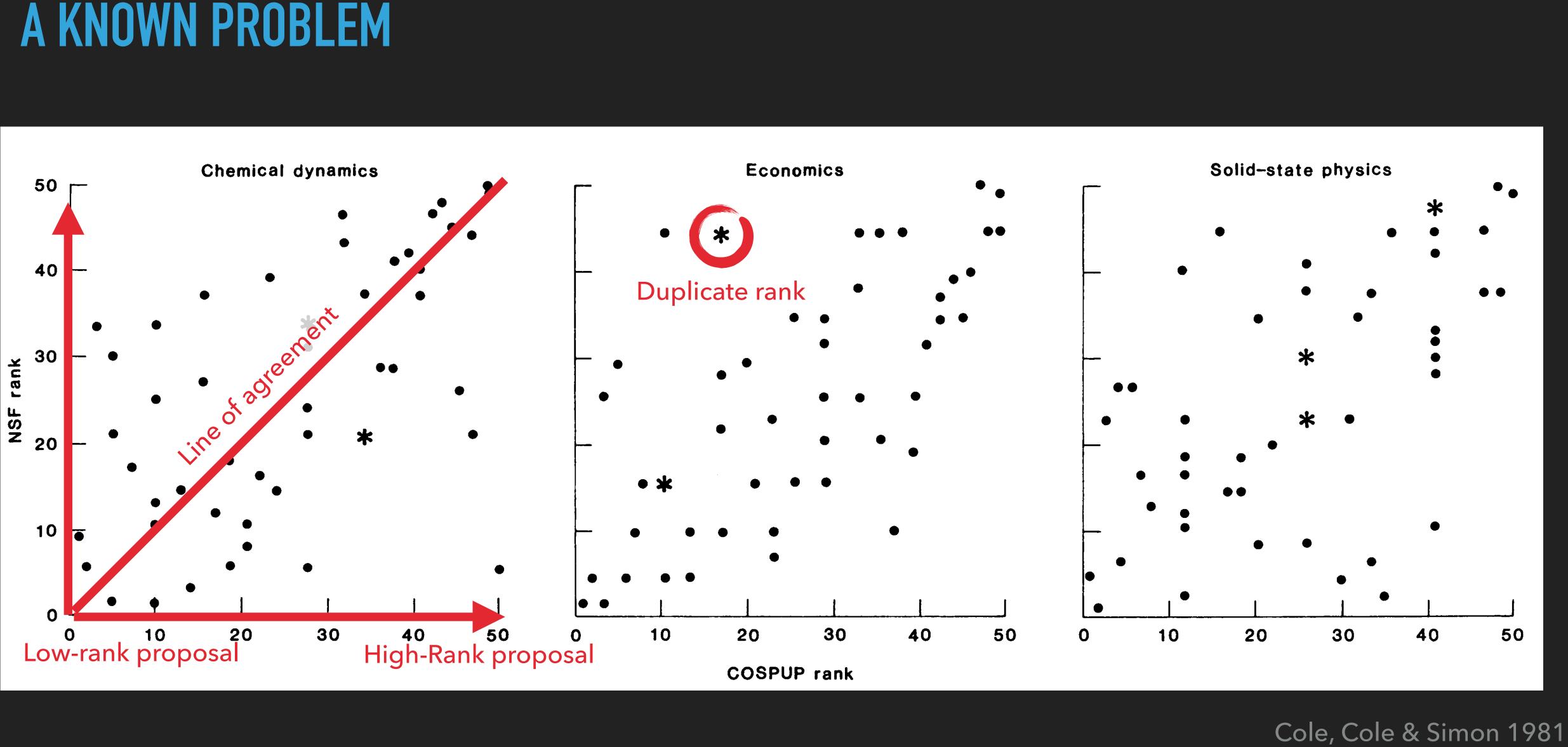
People don't agree what is good - the problem with inter-reviewer reliability

150 NSF proposals from Chemical Dynamics, Economics, and solid-state

Re-evaluated by scientists chosen by the National Academy of Science for

INTER-REVIEWER RELIABILITY

A KNOWN PROBLEM



QUALITY OF THE DEEPTHOUGHT DPR

OUR ATTEMPT AT COMPARISON

	Distributed Peer Review						Parallel Classic evaluation			
1	0.41	0.29	0.21	0.1	- 0.5	г - г	0.43	0.28	0.19	0.1
subset 2 2	- 0.3	0.3	0.25	0.16	- 0.3	panel 2 2	0.25	0.3	0.26	0.2
DPR su 3	- 0.2	0.24	0.3	0.25	- 0.2	OPC p	0.18	0.25	0.29	0.29
4	0.1 Best	0.18	0.27	0.45 Worst	- 0.1	4	0.09 Best	0.18	0.27	0.46 Worst
	- 0.0 1 2 3 4 DPR subset 1						1 2 3 4 OPC panel 1			





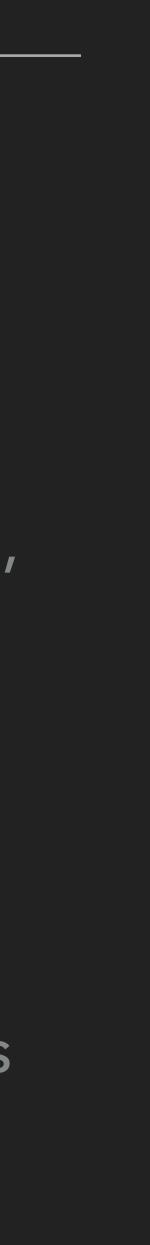
DISTRIBUTED PEER REVIEW – A NEW HOPE

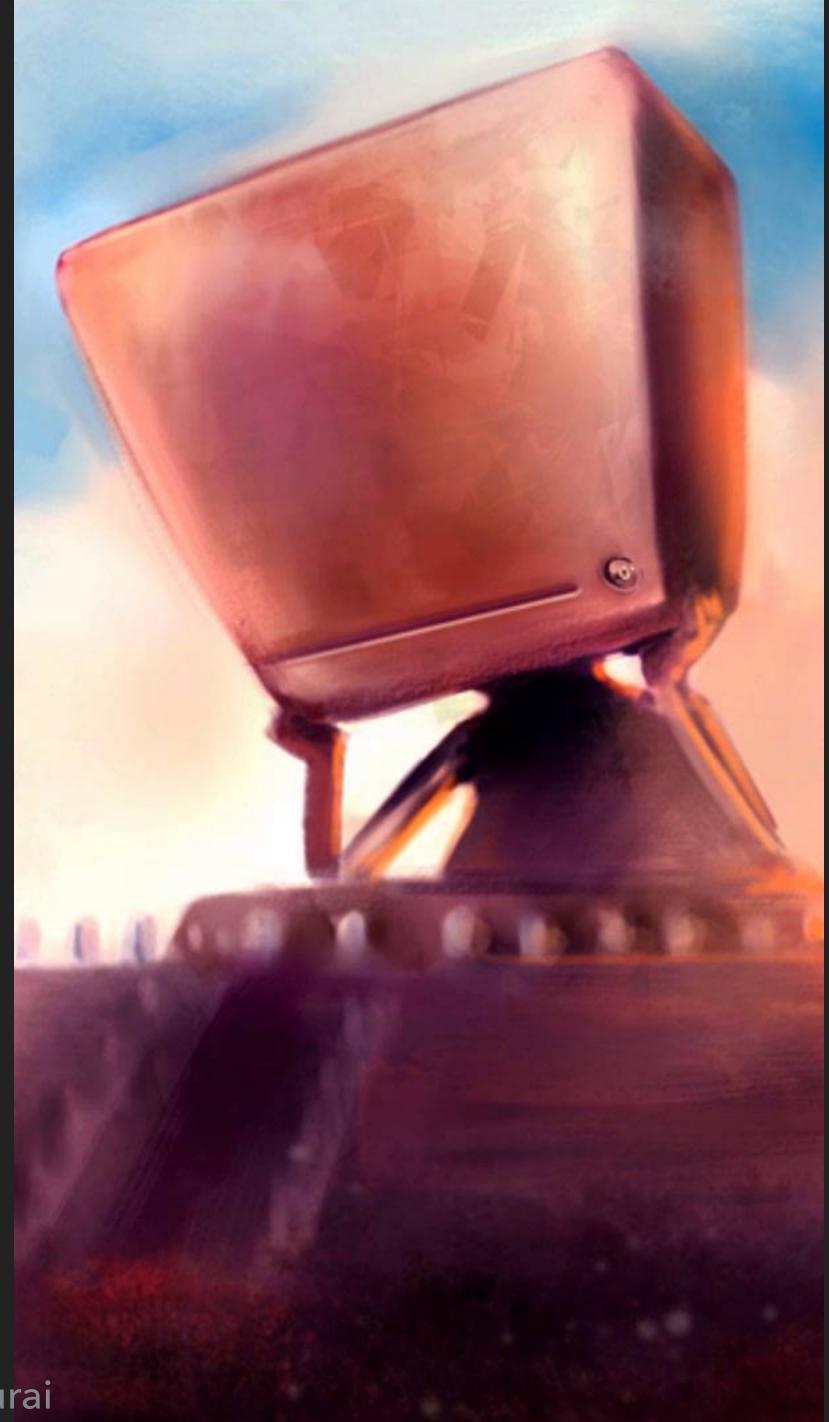
- Distributed Peer Review has several advantages
 - Spread the load
 - Train younger scientist quicker on review
 - With ML faster matching of expertise to proposals
- and no clear disadvantages
- algorithm)
- Kerzendorf+ 2020 Very data rich experiment and loads more to learn
 - Anonymized open data at https://zenodo.org/record/2634598

ESO Council has approved roll out after successful experiment for P110 (without the complex matching)



- Peer Review is a deeply flawed system
- ... but the best we have and likely better than alternatives
- > Difficulty to ensure maintaining of quality standards, increase in performance, AND credibility to our benefactors
- Still lots to research and understand bring in ML with caution
- A foundation of our trade and the trust that is placed in us
- A complex endeavor deserving of the same care than our astrophysics efforts





Credit Bruno Murai







Bea Lu

LITERATURE AS BIG DATA

DEEPTHOUGHT





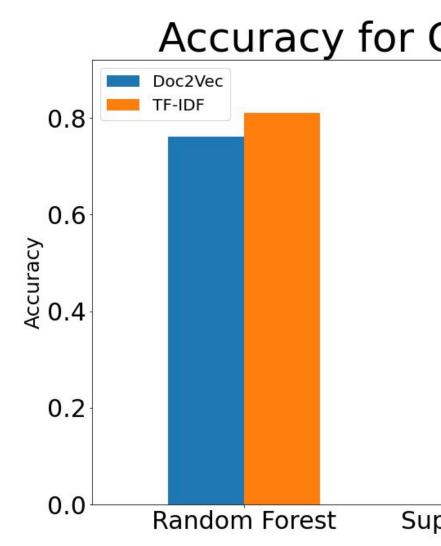
- 2.6 million articles a year in science doubling every 20 years (NSF statistics)
- Complex science questions require input from many fields
- Difficult to get an overview specifically problematic in training next generation
- Knowledge retrieval systems based on last names has issues
- Papers often contain many bits of information useful for various different applications
- DeepThought Initiative working on a variety of topics
- Emphasis on evaluating tools for usefulness astrophysics science questions
 - Physics training of interdisciplinary team members is crucial



IDENTIFYING THE USE OF FACILITIES IN PAPERS



Using AI to identify the publications that used Hubble Space Telescope data for scientific gain.



The success of an algorithm highly depends on the dataset and it is important to start with very simple algorithms before increasing the complexity. the best algorithm combination is TF-IDF with a Support Vector Machine Collaborators: classifier with an accuracy **0.87**.





Accuracy for Classification Techniques

Support Vector Machine Deep Neural Network Classifiers

> Wolfgang Kerzendorf, Michigan State University Jack O'Brien, Michigan State University Annie Didier, NASA Jet Propulsion Laboratory Brian Cherinka, Space Telescope Science Institute Katharina Kann, University of Colorado, Boulder

Amado-Olivo, WEK+ in prep.











- Many subfields do not have dedicated publication spaces
- Scattered publications across multiple journals
- Papers combining multiple subfields including the required one
- Organizations partially hand-curate such virtual journals
- Development and testing of algorithms to automate this process
- Work in progress for Nuclear Physics literature (for the Facility of the Rare Isotope Beam)
- Potential expansion to summarize and provide ML generated reviews



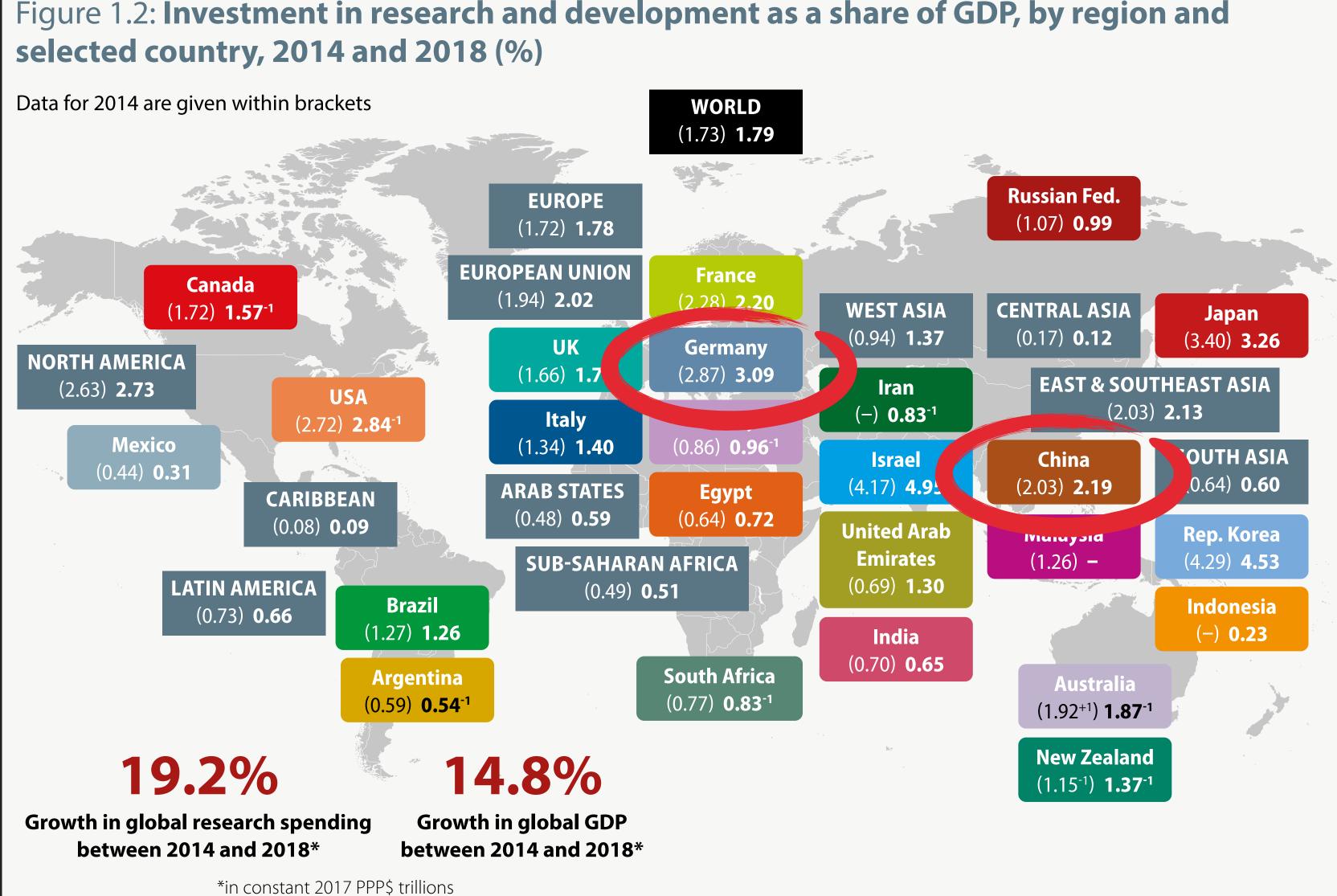


AN OPPORTUNITY: A GROWING AND **GLOBAL SCIENTIFIC COMMUNITY**



GROWING INVESTMENT IN SCIENCE

Figure 1.2: Investment in research and development as a share of GDP, by region and

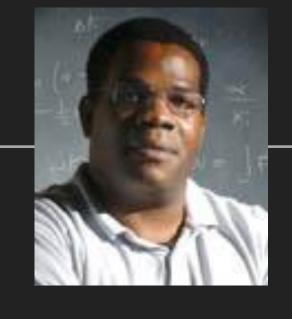


UNESCO science report 2021



EXPERTISE IDENTIFICATION TOOL

- Large number of researchers separated by geography and communities
- Worldwide science collaboration building additional connections in addition to economics and politics
- Construct and maintain a list of unique authors and their publications
- Provide various algorithms for identifying expertise in researchers as reviewers or new collaborators
- Lower barriers for connections to under-represented communities
- Transparently constructed through open-science techniques
- ... work in the beginning watch this space





Lou Strolger @ STScl



A META-RESEARCH ENDEAVOR

- ML and NLP providing opportunities for new knowledge retrieval paradigms
- Growing and global community requires a rethink of our current processes
- Not unique to astronomy Medical field is calling this meta research (see METRICS@Stanford with loannidis)
- Other efforts underway but very few with deep domain knowledge embedding Next steps, initial discussions with ArXiv, ESO, ESA, NASA underway
- Your input invaluable









Please contact me:

wkerzend@msu.edu

Twitter: @dtspace42

@wkerzendorf