### Human error: reference out of scope

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### Introduction: the need for objectivity

- Authors may avoid citing the work of potential rivals.
- They may also misrepresent the content of prior work.
- Peer reviewers and editors may have their own biases or perverse incentives.
- Institutional ethics committees may care more about avoiding damage to the institute's reputation than about righting wrongs.
- See (Taswell et al., 2020, ASIS&T 2020) for a review of these issues.
- We need an alternative to subjective judgments: Quantify it.
- In (Craig & Taswell, 2018, *ASIS&T-SIGMET 2018*), we proposed FAIR Attribution to Indexed Reports (FAIR) Metrics of adherence to good citation practices.

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# Methods: FAIR Metric counts and ratios

- We calculate the 4 ratios from 4 counts, first defined in (Craig & Taswell, 2018, *BIBM 2018*).
- Q: statements correctly attributed to prior work
- *M*: statements misrepresenting the content of prior work
- *P*: statements taken without attribution (potentially plagiarized) from prior work
- N: statements presented as novel and not found in prior work
- In (Craig et al., 2019, *ASIS&T 2019*), we introduced 4 ratio FAIR Metrics, each with a different emphasis.
- $F_Q = \frac{Q}{Q+P+M}$ .

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$$F_M = \frac{Q-M}{Q+P+M}$$
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$$F_P = \frac{Q-P}{Q+P+M}$$
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$$F_N = \frac{Q-N}{Q+P+M+N}$$
.

• Also briefly summarizes the pilot validation study described here.

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### Methods: ideal automated FAIR Metric calculation

- Start with a test document T and a collection of all prior work  $C = C_1, C_2, ..., C_N$ .
- Represent all claims made in T and in every member of C as RDF triples.
- Set Q = M = P = N = 0, and iterate over all claims in T.
- If a claim in T cites a document  $C_i$ , search  $C_i$  for an equivalent claim.
- If found, increment Q. Otherwise, increment M.
- If a claim in T does not cite a source, search all documents in C for an equivalent claim.
- If found, increment *P*. Otherwise, increment *N*.
- Worst-case time complexity is O(|T|∑<sub>i=1</sub><sup>|C|</sup> |C<sub>i</sub>|) where |C<sub>i</sub>| = # of statements in C<sub>i</sub>, |T| = # of statements in T, |C| = # number of documents in C, and statement comparison is unit-time.

# Methods: limited-scope manual FAIR Metric calculation

- Start with a test document *T*, a small (singleton) set of prior works claimed to be similar *C*.
- List all the claims in T as natural language sentences.
- Set Q = M = P = N = 0, and iterate over all claims in T.
- If a claim in T cites a document other than C, discard it.
- If a claim in T cites C, search C for an equivalent claim.
- If found, increment Q. Otherwise, increment M.
- If a claim in T does not cite a source, search C for an equivalent claim.
- If found, increment P. Otherwise, increment N.
- Worst-case time complexity is O(|T|∑<sub>i=1</sub><sup>|C|</sup> |C<sub>i</sub>|) where |C<sub>i</sub>| = # of statements in C<sub>i</sub>, |T| = # of statements in T, |C| = # of documents in C, and statement comparison is unit-time.
- 8 evaluators work independently.

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# Methods: example case set

- Search Retraction Watch for computer science- or neuroscience-related papers retracted for plagiarism to use as a T.
- For each, look up the plagiarized paper to use as C.
- Search Google Scholar for a paper on a related topic to use as a second *T* to compare to *C*.
- 32 found for CS.
- 18 found for Neuro.

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# Results: divide by 0 error

- It turns out two arbitrarily selected papers in the same field will not necessarily cite each other.
- Ended up with not only P = 0 but M = 0 and Q = 0 for almost all non-plagiarizing test papers.
- This made  $F_M$ ,  $F_Q$ , and  $F_P$  undefined, since their denominators are Q + P + M.
- Even the plagiarizing test cases often ended up with M = Q = 0, regardless of what sources they actually cited.
- This attempt at calculating FAIR metrics was not very fair.

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# Methods: limited-scope manual FAIR Metric calculation 2.0

- Start with a test document *T*, a small set of prior works claimed to be similar *C*, and the set of works referenced by *T*, *R*.
- List all the claims in T as natural language sentences.
- Set Q = M = P = N = 0, and iterate over all claims in T.
- If a claim in T cites a document  $R_i$ , search  $R_i$  for an equivalent claim.
- If found, increment Q. Otherwise, increment M.
- If a claim in T does not cite a source, search C for an equivalent claim.
- If found, increment P. Otherwise, increment N.
- Worst-case time complexity is O(|T| max(∑<sub>i=1</sub><sup>|C|</sup> |C<sub>i</sub>|, max(|R<sub>i</sub>|))) where |C<sub>i</sub>| = # of statements in C<sub>i</sub>, |R<sub>i</sub>| = # of statements in R<sub>i</sub>, |T| = # of statements in T, |C| = # of documents in C, and statement comparison is unit-time.

Craig et al. (Brain Health Alliance)

# Results: Seems to work this time

Target	Ret-	Comparison	Μ	N	Р	Q	F <sub>M</sub>	F <sub>N</sub>	F <sub>P</sub>	$F_Q$
text	-racted?	text								
Taswell	no	Mons	0	20	0	22	1.00	0.05	1.00	1.00
2007		2005								
Uddin	yes	Foster et	0	18	18	87	0.83	0.56	0.66	0.83
2022		al. 2019								
Gnat et	yes	de Hoog et	0	3	10	30	0.75	0.63	0.50	0.75
al. 2022		al. 2017								
Ullah et	yes	Sansaniwal &	31	3	7	2	-0.73	-0.02	-0.13	0.05
al. 2018		Kumar 2015								
Wilkinson	no	Taswell	6	5	24	28	0.38	0.37	0.07	0.48
et al. 2016		2007								

- Target: the text for which we are calculating FAIR Metrics.
- Retracted?: Was Target retracted for plagiarism of Comparison?
- Comparison: We are checking the Target for plagiarism of this text.
- Counts: Misquoted; Novel; Potentially Plagiarized; Quoted;

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$$F_M = \frac{Q-M}{Q+P+M}$$
;  $F_N = \frac{Q-N}{Q+P+M+N}$ ;  $F_P = \frac{Q-P}{Q+P+M}$ ;  $F_Q = \frac{Q}{Q+P+M}$ 

Craig et al. (Brain Health Alliance)

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### Discussion: Limitations of this method

- Can only detect plagiarism where it is already suspected
- Relies on potentially biased judgments of equivalence
- e.g., How much can you summarize and still convey the same idea?
- Claims with a correctly cited source are still Quoted even if copied verbatim from prior work.
- Novel claims in T about "asparagus" are still Novel even if they are otherwise identical to claims in C about ginger.
- 1 sentence = 1 claim? If not, division gets arbitrary.
- If authors reiterate their points, how do we select only unique statements?
- Does the evaluation method unfairly favor a particular style of writing?
- F<sub>N</sub> score favors review articles

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# Conclusion

- Target manual evaluation of FAIR Metrics allows systematic comparison of two papers.
- Is more labor-intensive than traditional peer review.
- Results in a well-organized document that can serve as substrate for peer review of the peer review.
- These semantically formatted manual evaluation records using the PDP-DREAM Ontology will provide an annotated data set against which to validate future AI/automated approaches.

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