## Scientific citations in Wikipedia

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## Abstract

The Internet-based encyclopædia Wikipedia has grown to become one of the most visited web-sites on the Internet. However, critics have questioned the quality of entries <sup>1,2</sup>, and an empirical study has shown Wikipedia to contain errors in a 2005 sample of science entries <sup>3</sup>. Biased coverage and lack of sources are among the "Wikipedia risks" <sup>2</sup>. The present work describes a simple assessment of these aspects by examining the outbound links from Wikipedia articles to articles in scientific journals with a comparison against journal statistics from *Journal Citation Reports* such as impact factors. The results show an increasing use of structured citation markup and good agreement with the citation pattern seen in the scientific literature though with a slight tendency to cite articles in high-impact journals such as *Nature* and *Science*. These results increase confidence in Wikipedia as an good information organizer for science in general.

Wikipedia increases in popularity and will probably get further importance for organization and dissemination of scientific research. But how can the articles of this freely edited Internet-based encyclopædia be trusted?

Inbound links can to some extent quantify the quality of a work, and examples include Google's PageRank for web-pages and the impact factor of scientific journals. The algorithms behind the PageRank and Kleinberg's HITS<sup>4</sup> can be adapted to Wikipedia<sup>5</sup>, but it is not clear whether high-scoring articles are also quality articles with respect to content. It has been suggested<sup>6,7</sup> that Wikipedia content surviving over a long period and many edits may be deemed of high quality. On the other hand studies have found that highly edited articles are likely quality articles<sup>8</sup>. Other proposals for quality assessment use revision history to compute a trust index for an article or an author reputation index<sup>9,10</sup>. Another feature of an article that may correlate with article quality is the amount of outbound citation to "trusted" material, e.g., scientific articles. How prolific are these and does Wikipedia use them across scientific fields? Critics have noted that Wikipedia may be biased on the corpus level—leaned towards topics that interest the "young and Internet-savvy"—and a possible lack of sources has been noted<sup>2</sup>.

Authors can include scientific references in Wikipedia by different means, most simply, by listing them at the bottom of the article. A more structured approach uses the

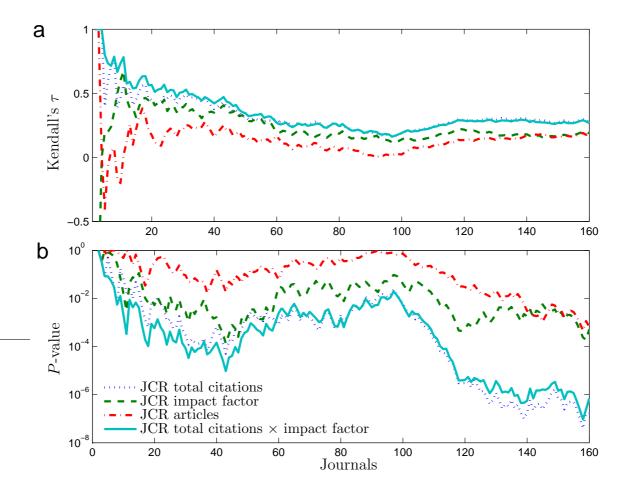


Figure 1: Correlations between citations to a journal from Wikipedia and from scientific journals. Kendall's rank correlation ( $\mathbf{a}$ ) and its associated P-value ( $\mathbf{b}$ ) as a function of the number of journals included in the test, e.g., the value at 80 shows the correlation between Wikipedia citations and JCR numbers for the 80 most cited journals from Wikipedia. The number of citations from Wikipedia is compared with three series of numbers from JCR and one derived: The total citations to a journal, its impact factors, the number of articles and the product of the total citations and impact factor.

<ref> construct and the cite journal template which allow for inline referencing and consistent formatting. A user of the cite journal template needs to fill out the appropriate bibliographic fields of the template, e.g., the fields for the article title and the name of the journal. The structured citation markup makes it relatively easy to extract bibliographic information and ask: How well do the outgoing scientific citations in Wikipedia compare with the citations seen between scientific journals?

To answer this question programs with regular expression matching written in the Perl language extracted the journal titles from the *cite journal* templates in all pages of the English Wikipedia obtained as the XML database dump file. A small list was setup to match the different variations of journal titles, and then the total number of citations was counted for each individual journal. The *Journal Citation Reports* (JCR) for 2005 of *Thomson Scientific* provided statistics on citations between scientific journals.

The regular expression matched 30368 outbound citations from the cite journal tem-

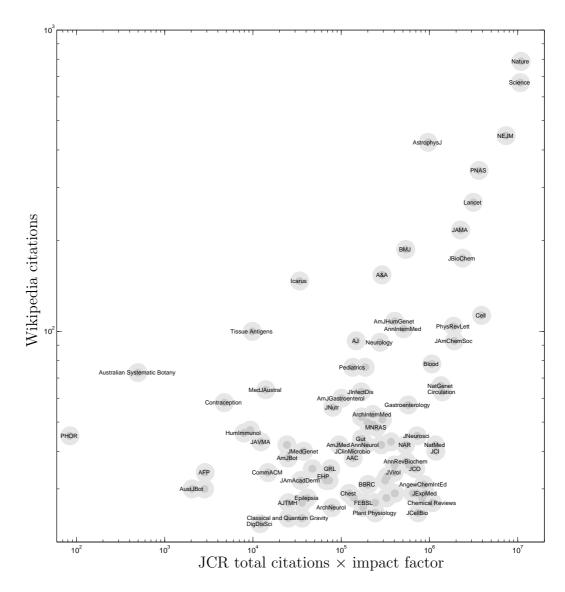


Figure 2: Comparison between citations from scientific journals and from Wikipedia. Scatter plot with each dot representing the target journal receiving the citations, and with one axis representing the number of citations from Wikipedia and the other the product of two numbers: JCR total citations and impact factor. It indicates the 100 most Wikipedia referenced articles. The plot shows not all journal titles.

plate with the database dump for 2 April 2007. The summary statistics for the individual journals with the largest number of inbound citations from Wikipedia showed Nature (787), Science (669) and New England Journal of Medicine (NEJM) (446) on the top (number of citations in parenthesis). A number of astronomy journals received many citations: The Astrophysical Journal (424), Astronomy & Astrophysics (154), Icarus, International Journal of Solar System Studies (147) and The Astronomical Journal (93). Apart from NEJM other medical journals high on the list included The Lancet (268), JAMA (217), British Medical Journal (187) and Annals of Internal Medicine (104). Some

newspapers and non-scientific journals also received citations via the *cite journal* template with, e.g., The New York Times (69) among the most referenced. These non-scientific entries as well as journals such as Scientific American and Physical Review (that as a "multivolume" journal may be referenced in several ways) were excluded and the rest of the values were correlated against numbers obtained from JCR (Fig. 1). The Wikipedia citation numbers showed high correlation with the JCR's numbers for the total number of citations to a journal. Wikipedia citation numbers correlated less with JCR impact factor and the JCR's measure of numbers of articles in a journal. With 47.4 Annual Review of Immunology has the highest impact, but because it publishes few articles it receives relatively few citations both from scientific journals and from Wikipedia (18). The correlations depended on the number of journals included in the test, with the largest correlation observed for the highly cited journals. It may simply reflect that journals with a small number of citations make noisy and poor statistics. In most cases the highest correlation could be obtained by multiplying the total number of citation with the impact factor, i.e., Wikipedia authors slightly overcite high-impact journals compared to JCR numbers. The high correlation among top-cited journals with this combined number means that the 10 journals with the highest value of this measure feature among the 19 most Wikipedia-referenced journals.

When individual journals are examined Wikipedia citations to astronomy journals stand out compared to the overall trend (Fig. 2). Also Australian botany journals received a considerable number of citations, e.g., Nuytsia (101), in part due to concerted effort for the genus Banksia, where several Wikipedia articles for Banksia species have reached "featured article" status. Computer and Internet-related journals do not get as many as one would expect if Wikipedia showed bias towards fields for the "Internet-savvy". Communications of the ACM (34) became the most referenced. Of the medical journals BMJ received relatively many Wikipedia citations. Authors cite more often freely available articles "1", and this may be particularly true for authors of the free encyclopædia. Since BMJ's research articles are free the journal may gain extra citations from this effect.

Citing Wikipedia as an authoritative source may be questionable with the present state of review on Wikipedia, and some universities have even banned citations to Wikipedia<sup>12</sup>. But when citations to trusted material support statements Wikipedia may be valuable for background reading. The present number of structured outbound citations from Wikipedia dwarfs in relation to the total number of scientific citations in the entire scientific literature. With this low number dedicated enthusiasts can influence the statistics making relatively few edits, cf. Australian botany. However, the use of the cite journal template has grown from zero in February 2005 when first introduced, to 19066 in November 2006, 24656 in February 2007, to a total of 30368 citations in April 2007. Reference management software (Zotero) now includes functionality for handling Wikipedia citations. Thus use of structured scientific citations in Wikipedia will very likely continue to grow and increasingly benefit researchers that look for well-organized pointers to original research.

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