## Citation indices and dimensional homogeneity

Evaluative and descriptive bibliometrics provide a quantitative focus on citations and/or publications<sup>1</sup>. At the simplest level of aggregation, we study the performance of an individual scholar. At this micro-level, a controversial usage of indicators is to perform ranking and hard impact assessment to inform critical decisions about funding, promotion and tenure and the allocation of billions of dollars of research funding<sup>2</sup>. There is therefore a pressing need that indices (e.g., the *h*-index) go beyond heuristic rules of thumb and instead are founded on axiomatic principles. Five natural properties are considered and Perry & Reny<sup>2</sup> propose a unique new index, the Euclidean index  $i_E$ , the Euclidean length of an individual's citation list. Here we show that following these five rules is not sufficient for robustness. There is a need to introduce one more requirement, that of dimensional homogeneity or consistency. We show that  $i_E$  is not dimensionally commensurable with other citation indices like the impact *i*, or the *h*-index or many of its variants.

Dimensional homogeneity is a well known principle in theoretical physics and engineering analysis. It requires that an equation must have quantities of same units on both sides. An equation is meaningful only if it is homogeneous, with equality being applied between quantities of different nature. [M], [L] and [T] are the first such fundamental units to be encountered in physics, where they stand for the units of mass, length and time. Velocity or speed combines length and time as  $[L]/[T] = [LT^{-1}]$ . Momentum will be  $[M][L]/[T] = [MLT^{-1}]$ , etc.

Extending this idea to bibliometrics, the basic dimensional unit in bibliometrics is the minimum unit of publication, namely the paper, say [P]. This has the same role as [M], [L] and [T] in physics. Leydesdorff<sup>3</sup> and Bollen *et al.*<sup>4</sup> have identified size and impact as the main categories in which the majority of bibliometric indicators can be arranged into<sup>1</sup>. Size is measured as the number of papers P (a numerical quantity) and its corresponding dimensional unit, in this case [P]. Impact is derived from the impact of all the P papers in the portfolio. Thus if the kth paper has  $c_k$  citations, this means that this paper has been cited by  $c_k$  papers. This is also the impact  $i_k$  of the kth paper. Here,  $c_k$  or  $i_k$  is the numerical quantity and the fundamental unit is again [P]. The total citations  $C = \sum c_k$ then has the units [P<sup>2</sup>] since the individual impact of each paper is summed over the total number of papers in the portfolio. The specific impact i = C/P of the portfolio also has the units [P].

Some elaboration of the definitions above is worthwhile. The number of citations received by the kth paper,  $c_k$  has units of *P* (i.e. 'paper'). Then,  $C = \sum c_k$  is not an algebraic sum of magnitudes in units of P, in which case C will turn out to have units of P. This will lead to the absurd conclusion that the average impact i = C/P, which is the number of citations that the average paper in the portfolio must have, has no units. Indeed, it must have the units of P. This is possible only if C is taken as the area under the curve of the citation distribution and must have units of  $P^2$ . Only with this protocol can one ensure that the units for bibliometric indices are reasonable, are used consistently, and make sense.

The best-known bibliometric indicator beyond the count of papers P, the impact *i* or the total citation count C is the hindex<sup>5</sup>. A scholar's *h*-index is the number, h, of his/her papers that each have at least h citations. Fortuitously, this definition makes the *h*-index commensurable with P and i, i.e. h has the same dimensions as number of papers and the impact of the papers. Most of the variants of hindex, such as the g-index $^{6,7}$  have the same dimension and can be directly compared to each other. If indeed they had different dimensions, they are incommensurable and cannot be directly compared. Here we show that the newly proposed Euclidean index  $i_E$  has a different dimension and so is not an alternative to nor can be compared to any of the other *h*-type indices.

Leydesdorff<sup>3</sup> and Bollen *et al.*<sup>4</sup> see bibliometrics through a two-dimensional prism – most of bibliometric indicators can be arranged into two categories<sup>1</sup>, namely, quantity/size and impact (which can be interpreted as a proxy for quality or excellence). Prathap<sup>8.9</sup> proposed that comparative evaluation needs at least three dimensions: quantity/size, quality/ excellence and consistency/balance or evenness. The quality–quantity–consistency parameter space leads to the evolution of second order indicators for any portfolio of papers<sup>10,11</sup>.

For any portfolio of publications, the total number of papers or articles, P, and the total number of citations, C, are often taken as indicators or proxy measures for the size of output of a group and the impact of its published research respectively<sup>12</sup>. The total impact, C, is sizedependent, and a specific impact, *i*, defined as C/P is size-independent. The journal impact factor was defined in such a manner as a size-independent indicator to select journals for inclusion in the Science Citation Index. It was not originally intended to be a direct measure or proxy of quality<sup>13</sup>, but since then has been accepted as a proxy or indirect measure of the quality or scholarly influence of a journal in a size-independent manner. In the same way, the scientific output of an individual or an entity can be measured using the following three-dimensional parameter space.

Quantity: No. of papers/articles *P* published during a prescribed publication window. This is a size-dependent proxy.

Quality: The impact *i* computed as C/P where *C* is the number of citations during a prescribed citation window of all the articles *P*. Note that the definition of *i* needs two distinct windows to be identified, the publication window and the citations window. The famous JIF is based on the use of a publication window of two years immediately preceding a single year citation window<sup>13–16</sup>. This is a size-independent proxy.

Once the quantity P and quality i parameters are defined, it is possible to postulate the following sequence of indicators of performance<sup>11</sup>:

Zeroth order indicator:  $P = i^0 P$ .

First order indicator:  $C = i^1 P$ .

Second order indicator:  $X = i^2 P = i^1 C$ .

Thus both *P* and *C* serve as indicators of performance in their respective ways. Following Leydesdorff and Bornmann<sup>17</sup>, one can think of C = iP as the first order integrated indicator for performance. Prathap<sup>8,9</sup> showed that the indicator  $X = i^2P$  can be thought of as a second order integrated indicator of performance. Since *X* gives greater emphasis to quality

than C does, it is expected to be a better indicator or proxy of performance. Given the citation sequence  $c_k$  of a portfolio of P papers, this paradigm then leads to a trinity of second order terms<sup>8,9</sup>:

$$X = i^2 P, E = \sum c_k^2$$
 and  
 $S = \sum (c_k - i)^2 = E - X,$ 

where  $P = \sum 1$ ,  $C = \sum c_k$  and i = C/P.

In the foregoing, X is exergy, E energy and S is entropy. It is easy to see that X, E and S have the units  $[P^3]$ .

Hirsch<sup>5</sup> requires citation sequences to be re-arranged in a monotonically decreasing order. Highly cited articles are usually found in a small core, implying a possible huge variation in the quality of each paper in the publication set. Two different portfolios can have the same C, and one could have achieved this with far fewer papers, with a higher quality of overall performance, or with the same number of papers (i.e., same quality) but a higher degree of consistency. Thus, C by itself, which is a first-order indicator, may not be the last word on the measurement of performance. The product  $X = iC = i^2 P$  is a robust second-order performance indicator, and is arguably a better proxy for performance<sup>8,9</sup>. Apart from X, an additional indicator E also appears as a second-order indicator as above. The coexistence of X (exergy) and E (energy) allows us to introduce a third attribute that is neither quantity nor quality. In a bibliometric context, the appellation 'consistency' may be more meaningful. The simple ratio of X to Ecan be viewed as the third component of performance, namely, the consistency term  $\eta = X/E = (C^2/P)/\sum c_k^2$ . Perfect consistency  $(\eta = 1, \text{ i.e.}, \text{ when } X = E)$  is a case of absolutely uniform performance (i.e. entropy S is zero); that is, all papers in the set have the same number of citations,  $c_k = c$ . The greater the skew, the larger is the concentration of the best work in a very few papers of extraordinary impact. The inverse of consistency thus becomes a measure of concentration. X by itself is a proxy of performance that ignores the actual distribution of the citations over the publication set. The ratio X/E, denoted as  $\eta$ , which is now dimensionless, takes into account the variability in the citation distribution of a portfolio of papers. It is important to emphasize again that this ratio is identical to evenness or balance in ecology, and also serves as an inverse measure of concentration, a term used by economists<sup>18</sup>.

Perry and Reny<sup>2</sup> used five axioms or 'basic properties', which they considered crucial for an indicator of an individual's citation impact. These are monotonicity, independence, depth relevance, scale invariance and directional consistency. They proposed a unique new index, the Euclidean index  $i_E$ , the Euclidean length of an individual's citation list. In terms of the foregoing nomenclature, it is given simply by  $i_E = \sqrt{E}$ . Immediately we see that the units for the Euclidean length is  $[P^{3/2}]$ . It is therefore not commensurable with *i* or *h* or any of the *h*-variants all of which have the units of [P]. We also notice that  $i_E$  cannot capture the large skew in any citation distribution (that is the third dimension of consistency or evenness).

Prathap<sup>19</sup> gives typical citation indices for leading authors in an emerging area of research, namely polymer solar cells

Table 1. The leading authors in polymer solar cells research ranked according to the default<br/>quantity parameter P

Authors	Р	i	η	h	Ζ	$i_E$	С	-
Dimensions	[P]	[P]	nil	[P]	[P]	$[P^{3/2}]$	$[P^2]$	-
Li, Y. F.	142	33.25	0.20	34	31.41	891.42	4721	
Krebs, F. C.	96	73.05	0.24	41	49.69	1462.71	7013	
Yang, Y.	78	128.65	0.12	37	53.69	3281.34	10035	
Janssen Raj	56	53.32	0.17	24	30.13	962.81	2986	
Hou, J. H.	45	99.89	0.17	21	42.15	1640.71	4495	
Jen, A. K. Y.	45	48.71	0.42	23	35.51	504.50	2192	
Cao, Y.	44	38.73	0.18	15	22.97	599.26	1704	
Kim, H.	44	9.55	0.26	11	10.18	123.38	420	
Yip, H. L.	44	49.82	0.43	23	36.05	504.50	2192	
Zhang, F. L.	44	62.32	0.32	23	37.86	733.40	2742	
Correlation	P	i	η	h	Z	$i_E$	С	
Р	1.00	0.04	-0.35	0.74	0.27	0.29	0.53	
i	0.04	1.00	-0.41	0.55	0.88	0.92	0.83	
η	-0.35	-0.41	1.00	-0.24	-0.14	-0.60	-0.52	
h	0.74	0.55	-0.24	1.00	0.81	0.65	0.86	
Ζ	0.27	0.88	-0.14	0.81	1.00	0.78	0.85	
$i_E$	0.29	0.92	-0.60	0.65	0.78	1.00	0.94	
С	0.53	0.83	-0.52	0.86	0.85	0.94	1.00	



Figure 1. The dimensional relationship between various citation indices.

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from the three-dimensional point of view. In Table 1, we re-interpret the original table 3 of Prathap<sup>19</sup> now introducing the Euclidean index into the analysis. We see little correlation between the primary dimensions *P*, *i* and  $\eta$ , showing that they are indeed orthogonal and therefore independent dimensions. Also shown in the table is the *z*-index defined as  $(\eta i^2 P)^{1/3}$  which was introduced by Prathap<sup>11</sup> as an *h*-type index that is three-dimensional in nature. It has the dimensions of [*P*].

To visualize the exponential relationships between these indices the results from Table 1 are plotted on logarithmic scales in Figure 1. Under consideration are four indices, h, z,  $i_E$  and C. All four are indices of scientific performance, combining in different ways the primary terms of size (quantity), impact (quality or excellence) and consistency or unevenness. Since we are monitoring the performance of leading authors internationally in a newly emerging field, we expect that these will be well correlated with each other. From Table 1, we see that the Pearson's correlation of 0.94 is highest between  $i_E$  and C and the lowest correlation of 0.65 is between  $i_E$  and h. One can go beyond this simple understanding and propose that the slope of the log-log relation of three indices with the h-index relates to their presumed dimensions. We see very clearly that while the z-index and h-index scale identically as [P], the Euclidean index scales as  $[P^{3/2}]$  and C scales as  $[P^2]$ . The form of the relation between two variables (since they are related to begin with, i.e. each is a measure of the bibliometric performance of top scientists in a specialized

field) is determined by the relation between the units in which they are measured.

We show the importance of dimensional analysis and dimensional homogeneity in bibliometric analysis. It is seen that while most *h*-type indices have the dimensions of [P], the newly introduced Euclidean index has the dimensions  $[P^{3/2}]$ . It is not enough to have an axiomatic basis for designing an indicator; it is necessary to examine for dimensional homogeneity to ensure that it is commensurable with other similar indicators. Each indicator can be used in its own right but each will scale differently, e.g. while the z-index and h-index scale identically as [P], the Euclidean index scales as  $[P^{3/2}]$  and C scales as  $[P^2]$ . The form of the relation between two variables (since they are related to begin with, i.e. each is a measure of the bibliometric performance of top scientists in a specialized field) is determined by the relation between the units in which they are measured.

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## Datura discolor Bernh. (Solanaceae), an overlooked species in India

The genus *Datura* L. (Solanaceae) is one of the important plant groups known for traditional and modern medicinal uses as a source of tropane alkaloids. Worldwide the genus comprises about 14 species which are native to America, but vastly diversified in Mexico<sup>1</sup>. According to Symon and Haegi<sup>2</sup>, the Europeans introduced different species of *Datura* to other parts of the world. One of the oldest occurrences of *Datura* is from the pre-Columbian period in the old world, as has been proven with historical and

es as Five species, viz. D. ferox L., D. wide inoxia Mill., D. metel L., D. quercifolia

Gharaibeh<sup>3</sup>

*Inoxia* Mili., *D. metel* L., *D. quercifolia* Kunth, *D. stramonium* L. are known from India<sup>4,5</sup>. These are either cultivated or naturalized in different environmental conditions throughout the country. *Datura* is one of the major plant groups used in the Indian traditional system of medicine, especially Ayurveda. Many important drugs are obtained either directly from *Datura* species or synthe-

taxonomic evidences by Geeta and

sized from their precursor molecules. *D. metel*, *D. stramonium* and *D. inoxia* are commonly known in India as 'Dhotra'<sup>4</sup>. Tropane alkaloids such as atropine and scopolamine obtained from *Datura* are in great demand in the European countries.

India is one of the leading exporters of *Datura* species in international crude drug market<sup>6,7</sup>. Closely related species share almost similar chemical compounds often leading to taxonomic ambiguity affecting the trade of authentic raw materials<sup>8,9</sup>. Though therapeutic uses,