

# Comparative study of scaling parameters and research output of selected highly- and moderately-cited individual authors

## Badanie porównawczych parametrów skalowania i dorobku badawczego wybranych wysoko i umiarkowanie cytowanych autorów

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### Abstract

The real data of cumulative citations  $l_n$  of selected  $n$ th paper of individual  $N$  papers published by some highly- and moderately-cited individual authors are analyzed to compare Hirsch and Hirsch-type indices  $h$ ,  $h_1$ ,  $h_f$  and  $h_m$ , and citation radii  $R$  and  $R_f$  from consideration of: (1) the number  $A_n$  of coauthors of the paper, (2) the normalization of citations  $l_n$  and cumulative fraction  $l_{nf}$  of citation of the  $n$ th paper by mean and median citations of the citations  $l_n$  of all  $N_c$  cited papers, and (3) the determination of effective rank  $n_{\text{eff}}$  of the  $l_{nf}$  citations. Analysis of the  $l_n(n)$ ,  $l_{nf}(n)$  and  $l_{nf}(n_{\text{eff}})$  data was also carried out by using a Langmuir-type function  $l = l_0[1 - \alpha Kn / (1 + Kn)]$ , where  $l$  denotes the citations  $l_n$  and  $l_{nf}$  of all cited  $N_c$  papers arranged in the decreasing order,  $\alpha$  is an effectiveness parameter,  $K$  is the so-called Langmuir constant,  $n$  denotes the rank  $n$  or  $n_{\text{eff}}$  of citations and  $l_0$  is the value of  $l$  when  $n$  or  $n_{\text{eff}}$  approaches zero. For a comparison of the publication output of different authors it was found that the  $h_m$  index is more consistent than other indices, and it can be normalized to account for the publication career of different authors. However, Langmuir-type function is not adequate for comparison of the publication output of different authors because it describes the rank-order distribution patterns satisfactorily in terms of two parameters. To compare the publication output of different authors independent of their career length  $t$ , it is suggested to use scaling parameters  $h/t$ ,  $h_f/t$  and  $h_m/t$ .

**Keywords:** Citation analysis; Citation distribution; Coauthorship;  $h$ -type indices; Langmuir-type function

### Streszczenie

Przeanalizowano dane liczby cytowań kumulacyjnych  $l_n$  wybranego  $n$ -tego artykułu spośród  $N$  indywidualnych artykułów opublikowanych przez niektórych wysoko i umiarkowanie cytowanych pojedynczych autorów. Do porównania użyto wskaźników Hirscha  $h$  i Hirscha-podobnych  $h_1$ ,  $h_f$  i  $h_m$ , oraz promienia cytowań  $R$  i  $R_f$  pod względem: 1) liczby  $A_n$  współautorów artykułów, 2) normalizacji liczby cytowań  $l_n$  i ułamka kumulacyjnego  $l_{nf}$  cytowania  $n$ -tego artykułu średnimi i środkowymi cytowaniami  $l_n$  wszystkich cytowań  $N_c$  artykułów, 3) określenia efektywnego rzędu  $n_{\text{eff}}$  cytowań  $l_{nf}$ . Analiza danych  $l_n(n)$ ,  $l_{nf}(n)$  i  $l_{nf}(n_{\text{eff}})$  była prowadzona również wedle funkcji typu Langmuira  $l = l_0[1 - \alpha Kn / (1 + Kn)]$ , gdzie:  $l$  oznacza  $l_n$  i  $l_{nf}$  cytowania wszystkich cytowanych  $N_c$  artykułów umieszczonych w malejącym porządku,  $\alpha$  parametr efektywności,  $K$  to tak zwana stała Langmuira,  $n$  oznacza rząd  $n$  lub  $n_{\text{eff}}$  cytowań oraz  $l_0$  to wartość  $l$ , gdy  $n$  lub  $n_{\text{eff}}$  dąży do zera. Do porównania dorobku publikacyjnego różnych autorów stwierdzono, że wskaźnik  $h_m$  jest bardziej miarodajny od pozostałych oraz, że można je znormalizować w celu uwzględnienia kariery publikacyjnej różnych autorów. Funkcja typu Langmuira nie jest właściwa jednak do porównania dorobku publikacyjnego różnych autorów ponieważ opisuje ona w sposób zadowalający rozkład kolejności rzędu ich artykułów przy pomocy dwóch parametrów. Do porównania dorobku publikacyjnego różnych autorów, niezależnego od długości ich kariery  $t$ , zaproponowano stosowanie parametrów skalowania  $h/t$ ,  $h_f/t$  and  $h_m/t$ .

**Słowa kluczowe:** Analiza cytowań; Rozkład cytowań; Współautorstwo; Współczynniki typu  $h$ ; Funkcja typu Langmuira

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### 1. Introduction

For promotion/recruitment of faculty/research positions and award of research grants it is desired to compare the research output of candidates working in a scientific field. A commonly used measure for this purpose is the  $h$  index, proposed by Hirsch [1], which is defined as the number of papers of  $n$ th rank with citations  $l_n \geq h$ . A convenient way to determine the  $h$  index of an author is to look for the value of the rank  $n$  of the paper when  $n \leq l_n$  from the plot of the decreasing number  $l_n$  of citations received by the  $n$ th paper against all of his/her  $N_c$  cited

papers (rank–size distribution plots). The main advantages of the  $h$  index are that it is a single number characterizing publications and citations of an author and it is insensitive to uncited or relatively poorly cited papers. However, the citation distribution of an author is frequently skewed either with a few highly cited papers or a large number of papers with few citations. Consequently, since an  $n$ -ranked paper enters in the counting of the  $h$  index of an author, citations outside the  $h$ -core (i.e. citations  $l_n > h$  received by papers  $n < h$  and  $l_n < h$  received by papers  $n > h \geq N_c$ ) are not used anywhere.

In order to overcome the above disadvantage of the  $h$  index its several variants, simultaneously retaining its advantages, have been widely proposed and discussed (for example, see: refs. [2-13]).

It is well known that the Hirsch index  $h$  of an author increases with his/her publication duration  $t$  [1,5,14-17], typical  $h$  indices of researchers publishing in different research fields are different [1], and researchers publishing in large collaborations usually have high values of their  $h$  index [1,18,19]. In fact, these factors make the comparison of scientific research output of authors of different academic career length working across various research disciplines difficult. In order to compare the research output of researchers publishing a constant number of papers per year of similar quality during their publication duration  $t$ , Hirsch [1] proposed the parameter  $m = h/t$  as a useful measure. From an analysis of the behavior of  $h$  index as a function of academic age  $t$  of about 1400 Italian physicists, Mannela and Rossi [16] found that a time-scaled index  $h/t^{1/2}$  is related to the  $h$  index.

All citation-related measures, including the  $h$  index and its different variants, for the publication output of an author assume that all papers receiving citations are written by him/her alone. However, in the case of multiple-authored papers, it is unfair to award full credit to each author because this method in reality penalizes authors who publish alone. Therefore, devising of a fair method of counting of contributions of individual authors in multi-authored papers has drawn considerable attention for over four decades (for example, see: refs. [18,20-26]). The problem is also complicated because single-authored papers published in different journals with high impact factors usually earn the lowest number of citations and the number  $L$  of cumulative citations increases with increasing number  $A$  of coauthors, following approximately the relation:  $L = L_0(0.2A)^{1/3}$  [27]. In this relation  $L_0$  is a normalizing factor related to the journal.

The culture of authorship of papers in different disciplines is not the same. The following authorship patterns are usually observed [24,28]: (1) junior researchers are the first authors and group leaders are the last authors, (2) senior researchers are the first authors followed by junior researchers, (3) authors in multi-authored papers are listed in the order of decreasing contribution of coauthors involved their publication, and (4) all authors are arranged alphabetically, especially in large collaborations as in nuclear physics experiments. In case (2) it is not always possible to establish the contributions of the first, senior, corresponding authors. However, in general, contributions of different authors in multi-authored papers frequently remain unknown and the information that one usually has to determine the credit of authors in different multi-authored papers is the authors' list in the papers. Therefore, assigning due credit to the coauthors of papers in different disciplines is a problem in citation analysis.

For publications involving a large number of coauthors, Hirsch [1] suggested to normalize individual au-

thors to normalize their  $h$  indices by a factor reflecting the average number of authors. Counting of contributions according to the order of the authors has also been proposed [21,27,29-33]. In this approach the contribution of the first author is always dominant in a multi-authored paper but equal contributions of the first and last (corresponding) author can also be considered [31].

It is well known that the average number of citations per paper differs among various scientific disciplines due to their citation behavior (for example, see: refs. [1,4,34-38]). Using the total number of citations [35,36] or distributions of citations to the papers published in different fields [4,34,37-39] different scaling parameters have been proposed to compare the research output of researchers in various fields. The average number of citations in some studies [1,4,34,35,37,38] whereas median or geometric mean of citations in others [36] has also been proposed as an effective scaling parameter in different fields.

To account for the effect of multiple coauthorship through the  $h$  index, Hirsch [40] proposed  $\bar{h}$  (hbar) index as the number of an individual author's papers that have citations greater than or equal to the  $\bar{h}$  index of all coauthors of each paper. However, this approach considers papers instead of authors. Following the idea advanced by Hirsch [1] of normalizing individual authors to normalize their  $h$  indices by a factor reflecting the average number of authors, Batista et al. [18] proposed to divide the  $h$  index of an individual author by the number of authors of the paper in the  $h$ -core. The resulting so-called  $h_1$  index is defined as:  $h_1 = h^2/A_h$ , where  $A_h$  is the total number of coauthors of a particular author in the  $h$ -core. The main problem with this  $h_1$  index is that its value is enormously changed for authors with some papers with a large number of coauthors. Egghe [41] proposed to count the contribution of multiple authors considering either fractions  $l_{nf}$  of citations (i.e.  $l_{nf} = l_n/A_n$ , where  $A_n$  is the number of authors of a paper) or fractions  $n_{eff}$  of rankings of all  $n$ -ranked papers (i.e.  $n_{eff} = n/A_n$ ). Arrangement of the fractions  $l_{nf}$  of citations to all  $n$ -ranked papers of an author in decreasing order gives his/her new Hirsch-type index, namely the  $h_f$  index, which is again an integer as the  $h$  index. Similarly, counting of the rank  $n$  of each paper fractionally as inverse of the number  $A_n$  of its authors results in the so-called  $h_m$  index, which is a noninteger number [42,43].

Performance of multi-authorship indices for the ranking of authors has been discussed in the literature [26,44-46]. Abramo et al. [44] recommended to use indicators or evaluation methods that take into consideration authors' contributions. Sahoo [26] proposed  $I$ -index from consideration of an author's percentage share in the total citations received by his/her papers. He observed that equi-distribution of credit among the coauthors of a paper would give the most probable value of his  $I$ -index (with an associated small standard deviation which decreases with increasing  $h$ -index). Dunaiski et al. [45] reported best results with equal contribution of co-authors to a paper's score, independent of impact indicator used to compute paper scores.

The  $h$  index of authors is an empirical measure of their publication output. Since the  $h$  index of an author is defined in terms of the highly cited papers, its prediction is essentially associated with the description of the rank-order distribution of citations of his/her papers. This approach has been used by Egghe [47], and Egghe and Rousseau [48,49], who used Lotka's law for the rank-order distribution of citations. However, Sangwal [50] observed that Lotka-type function poorly describes real rank-order distributions of citations of different authors. From an examination of real citation distributions of authors Burrell [51] also arrived at a similar conclusion.

Following the concepts of processes of adsorption of additives during crystal growth, Sangwal [50] proposed four novel functions to describe rank-order distributions of citations of different authors. He observed that, among these functions, a Langmuir-type function satisfactorily describes the  $l_n(n)$  data for different authors and that the Langmuir constant  $K$  of this function characterizes the citation behavior of an author. This function was later employed to explain rank-order distributions of journals published in different countries [52] and rank-order distributions of cumulative citations  $l_n$  and fractions  $l_{nf}$  of citations of papers received by multi-authored papers published by moderately-cited authors working in different scientific fields [53]. Since the  $h$ ,  $h_f$  and  $h_m$  indices of an author are related to the three distributions  $l_n(n)$ ,  $l_{nf}(n)$  and  $l_{nf}(n_{eff})$ , respectively, constructed from the bibliometric data of his/her publication output, it is interesting to analyze the research output of some highly- and moderately-cited authors using the proposed Langmuir-type function.

The aim of the present paper is fourfold: (1) to verify whether normalization of distribution of cumulative citations  $l$  of individual papers with total citations  $L$  and the cumulative fractions  $L_f$  of citations of the papers of an author, based on equal contribution of different authors by their mean and median citations, yields a universal citation distribution, (2) to analyze the distribution of normalized citations  $l$  and  $l_f$  using Langmuir-type function, (3) to compare the research output of selected authors using different citation indices proposed in the literature, and (4) to propose an objective measure for characterization (and comparison) of the publication output of different authors from distribution of cumulative citations  $l_n$  of his/her  $N_c$  cited papers published during their entire publication career.

### 2. The Langmuir-type function

Langmuir-type function of rank-order distribution of items is based on the concepts of adsorption processes involved during crystal growth. The basic concepts used in the derivation of this function have been described earlier [50,52,53]. In the context of citation distribution the Langmuir function is based on the following postulates:

- (1) The  $N$  papers of an author have the same number  $s_{max}$  of possible active citation sites, and these possible sites for the papers can be represented in the

form of a two-dimensional set of successive papers arranged at equal distance along the  $x$  axis such that  $s_{max}$  equi-spaced points, denoted as sites  $l_n$ , stacked along the  $y$  axis represent citations received (filled circles) and unreceived (open circles) by each of the  $N$  papers. Figure 1 schematically illustrates this arrangement of  $N$  papers in the form of decreasing citations

- (2) The maximum number of cumulative  $l_0$  citations belongs to the paper of rank  $n = 0$  represented by  $s_{max}$  possible active sites, no citations are received by the papers of rank  $n > N_c$  represented by  $s_{ad}$  sites, whereas  $0 < l_n < l_0$  citations are received by the papers  $0 < n < N_c$  represented by  $(s_{max} - s_{ad})$  sites. If we define the ratio of the number of  $s_{ad}$  (covered) sites to the total number  $s_{max}$  of possible active sites as the coverage  $\theta$  of active sites (i.e.  $\theta = s_{ad}/s_{max}$ ), the coverage  $\theta$  may be considered as a measure of unreceived citations by the  $n$ th paper.
- (3) The rank  $n$  of a paper is a measure of probability of receiving citations by the paper. This assumption means that the number of  $l_n$  citations received by the  $n$ th rank paper decreases with increasing value of  $n$  whereas  $l_0$  citations are produced by the paper of rank  $n = 0$ .
- (4) The process of unreceiving (inhibition or blocking) of citations may be described by the usual isotherms applied in adsorption of adsorbant atoms, ions or molecules on active adsorption sites on the surface of a solid.

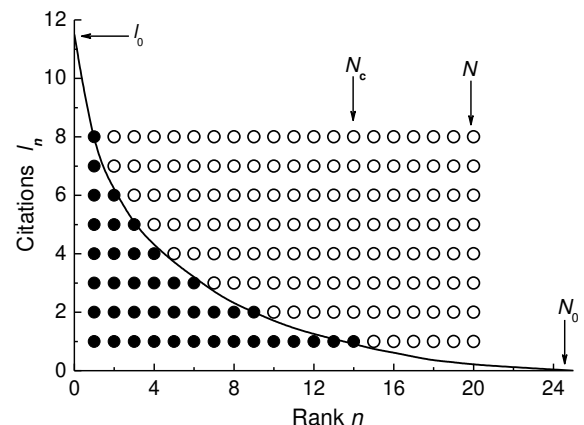


Figure 1: Graphical illustration of the number  $l_n$  of citations received by a set of  $n$  papers. Filled and open circles denote received (blocked) and unreceived (uncovered) citations, respectively. Dependence of  $l_n$  citations on rank  $n$  of papers is shown by the curve starting from citations  $l_0$  at rank  $n = 0$  and terminating at rank  $n = N_c$ . Note that  $N_c$  is the maximum number of papers that received citations ( $N_c = 14$  here).

With the above assumptions the relationship between the number  $l$  of citations received by a paper and the coverage  $\theta$  of blocked citation sites may be given by

$$l = l_0(1 - \alpha\theta), \tag{1}$$

where  $l_0$  is the maximum number of citations received when  $\theta = 0$  and  $\alpha$  is an effectiveness parameter for unblocking of citation sites (see below). When the cover-

age  $\theta$  of citation sites follows Langmuir adsorption isotherm

$$\theta = \frac{Kn}{1 + Kn}, \quad (2)$$

one obtains from Eq. (1) the usual Langmuir-type (LT) function relating the number  $l$  of citations with the rank  $n$  of the paper in the form

$$l = l_0 \left[ 1 - \alpha \left( \frac{Kn}{1 + Kn} \right) \right]. \quad (3)$$

In Eqs. (2) and (3) the parameter  $K$ , usually known as the Langmuir constant, characterizes the behavior of citations generated by the papers whereas  $n$  is the rank of the paper. The units of  $K$  are inverse of paper rank (i.e. paper-rank<sup>-1</sup>) and are determined by the way the paper rank  $n$  is expressed. If one defines a dimensionless paper rank  $x = n/N_c$ , Eq. (3) may be expressed as

$$l = l_0 \left[ 1 - \alpha \left( \frac{K'x}{1 + K'x} \right) \right], \quad (4)$$

where the new dimensionless Langmuir constant  $K' = KN_c$ , with  $N_c$  as the number of papers which receive citations ( $N_c < N$ ). The dimensionless Langmuir constant  $K'$  for citations of different paper-citation systems is related to their corresponding dimensionless differential energy  $Q$  by

$$Q = \ln K' = \ln(KN_c). \quad (5)$$

The effectiveness parameter  $\alpha$  may be given by (cf. Eq. (1))

$$\alpha = \frac{1}{\theta} \left( 1 - \frac{l_i}{l_0} \right), \quad (6)$$

where  $l_i$  is the number of unreceived citations by a paper. In Eq. (6) when the active citation sites are blocked completely, i.e.  $l_i = 0$ , depending on the value of coverage  $\theta$  the following situations are possible regarding the values of  $\alpha$ : (1) when the coverage  $0 \leq \theta \leq 1$ ,  $\infty \geq \alpha \geq 1$ , and (2) when  $\theta \geq 1$ ,  $0 \leq \alpha \leq 1$ . In the latter case, the highest value of unity for  $\alpha$  is achieved when  $\theta = 1$  whereas  $\alpha \rightarrow 0$  when  $\theta \rightarrow \infty$ .

When  $l/l_0 = 0$ , Eq. (4) gives

$$K' = KN_c = (\alpha - 1)^{-1}. \quad (7)$$

According to relation (7) the dimensionless Langmuir constant  $K' = KN_c$  is inversely proportional to  $(\alpha - 1)$  with the proportionality constant  $(KN_c)_0 = 1$  such that  $\ln(KN_c)_0 = 0$ . Since  $K$  and  $K'$  are always positive, Eq. (7) implies that  $\alpha \geq 1$ . This inference is consistent with our earlier findings [50,52,53].

### 3. Bibliometric data and their analysis

For the analysis we used examples of bibliometric data on the cumulative citations received by papers pub-

lished by 11 selected authors. Of these, six authors are from those who published first single-authored original papers which received more than 20000 citations each up to 2013. These authors were selected from the authors of first single-authors of top-cited papers, which showed mainly an initial increase and then, after going through a maximum value, a slow decrease in the number of their yearly citations in successive years [54]. The other five authors are from those who were nominated professors in chemistry by the President of Poland in 2013 and received citations lower than 2000 each up to 2012 [53]. Hereafter these two groups of authors are referred to as highly- and moderately-cited authors, respectively.

The Thomson Reuters' Web of Knowledge database was employed to collect the basic bibliometric data. The data represent papers published till 2013 and 2012 by the highly- and moderately-cited authors, respectively. The data were collected during 21-24 October 2014 and 1-15 April 2014, respectively. An author's authorship of each paper was identified unambiguously following his/her affiliation, research area and names of frequent coauthors. Despite the fact that these bibliometric data were collected some years ago, more recent data are not included in the analysis in view of long publication careers, lying between 32 and 68 years, of most of the authors (see Table 1).

The basic bibliometric data for an author comprised the number  $N$  of cumulative papers, the number  $L$  of cumulative citations received by  $N_c$  papers (such that  $N_c < N$ ) and the publication duration  $t$  since the publication of the first paper. In addition to the above data, the citations  $l_n$  received by individual  $n$ th paper published by an author and the number  $A_n$  of its coauthors were collected from the Web of Knowledge database. From these lists of the values of the number  $l_n$  of citations received by each of his/her  $n$ th paper and the number  $A_n$  of its coauthors, the author's cumulative citations  $L = \sum l_n$ , his/her cumulative fractions  $L_f$  of citations (i.e.  $L_f = \sum l_{nf}$ , where the fraction  $l_{nf}$  of  $l_n$  citations of a paper is:  $l_{nf} = l_n/A_n$ ), and the effective rank  $n_{\text{eff}}$  of the papers (i.e.  $n_{\text{eff}}(n) = \sum 1/A_n$ , where  $A_n$  is the number of authors of the  $n$ th paper), were calculated. In view of different authorship patterns used in the lists of authors of the papers considered in this study and enormously high number of coauthors in many cases,  $l_{nf}$  and  $n_{\text{eff}}$  were calculated on the assumption of equal contributions of  $A_n$  coauthors of the  $n$ th-ranked paper fetching  $l_n$  citations. The values of the cumulative papers  $N$  published by different authors, the cumulative number  $N_c$  of their papers receiving cumulative citations  $L$ , cumulative fraction  $L_f$  of citations, and their publication duration  $t$  are given in Table 1. In columns 2 and 4 of this table  $N_c^a$  denotes the cumulative number of papers without the so-called outliers fetching exceptionally high citations whereas  $L^a$  is the cumulative number of citations received by  $N_c^a$  papers.

The real distribution of  $l_n(n)$ ,  $l_{nf}(n)$  and  $l_{nf}(n_{\text{eff}})$  data of different papers published by the selected authors were analyzed using Eq. (3). Nonlinear least-squares fitting, involving chi-square residual, of the citation data

Table 1: Bibliometric data and various calculated indices for different authors

Author	$N (N_c/N_c^a)$	$t$	$L (L^a)$	$L_f$	$h (A_n)$	$h_1$	$h_f$	$h_m (N_m)$	$R^b$	$R_f$
Laemmler UK	93 (84/81)	45	236007 (13478)	5345.3	58 (172)	19.56	40	21.43 (55)	(65.50)	41.24
Becke AD	84 (70/67)	36	90924 (15603)	11953.3	48 (86)	26.79	40	31.42 (44)	(70.47)	61.68
Southern EM	127 (110/109)	56	38598 (6612)	3460.4	41 (120)	14.01	28	19.11 (36)	(45.88)	33.19
Felsenstein J	113 (99/94)	48	46478 (12312)	9513.5	51 (74)	35.15	30	41.92 (51)	(62.60)	55.03
Shannon RD	171 (152/150)	45	43179 (9080)	4240.0	45 (141)	14.36	28	18.30 (39)	(53.76)	36.74
Scatchard G	84 (73/72)	68	29077 (5655)	2800.6	33 (87)	12.52	25	16.03 (32)	(42.43)	29.86
MBa	103 (70/69)	15	1331 (582)	237.01	17 (572)	0.51	7	5.24 (21)	20.58 (13.61)	8.69
MCy	80 (68)	35	1117	310.06	18 (85)	3.81	9	8.06 (27)	18.85	9.93
TJe	164 (92)	15	852	390.01	18 (46)	7.04	10	8.06 (15)	16.56	11.14
BBo	80 (74)	41	963	393.35	17 (48)	6.02	10	8.34 (19)	17.51	11.19
BPa	56 (44/43)	32	688 (593)	426.33	16 (32)	8.0	11	10.32 (15)	14.80 (13.74)	11.64

<sup>a</sup> Values of  $N_c$  for cumulative citations  $L^a$ . <sup>b</sup> Values of  $R$  calculated from citations, excluding outliers as mentioned in Table 2, are given in the parentheses.

Table 2: Mean and median values of citations of different authors

Author	Citations $L$ (with coauthors)			Citations $L_f$ (without coauthors)	
	$N$ range	Mean	Median	Mean	Median
Laemmler UK	$\geq 4$	166.40	87.0	65.99	9.5
Becke D	$\geq 4$	232.88	91.0	178.41	46.0
Southern EM	$\geq 2$	60.66	24.0	31.75	9.75
Felsenstein J	$\geq 6$	130.98	49.0	101.21	39.0
Shannon RD	$\geq 6$	41.66	23.0	15.98	6.0
Scatchard G	$\geq 2$	78.54	26.5	38.90	11.75
MBa	All ( $\geq 2$ )	22.71 (12.19)	6.0	3.39	1.5
MCy	All	16.43	6.5	4.56	2.83
TJe	All	9.17	5.0	4.24	1.75
BBo	All	13.01	7.0	5.32	3.0
BPa	All ( $\geq 2$ )	15.64 (13.79)	6.5	9.69	4.0

was carried out with commercially available ‘‘Origin 9.1’’ package. This package yields values of the fitting parameters of an equation, their standard deviations and the corresponding goodness-of-the-fit parameter  $R^2$ . In the case of Eq. (3) the best-fit parameters, among others, are effectiveness parameters  $\alpha$ ,  $\alpha_f$  and  $\alpha_f^{ef}$ , and Langmuir constants  $K$ ,  $K_f$  and  $K_f^{ef}$  for the  $l^*(n)$ ,  $l_f^*(n)$  and  $l_f^*(n_{eff})$  data. Here  $l^*$  and  $l_f^*$  are cumulative relative citations normalized by dividing  $l_n$  and  $l_{nf}$  citations by the average (mean) or median number of citations  $\langle L \rangle$  and  $\langle L_f \rangle$ , respectively, obtained from the values of  $l_n$  and  $l_{nf}$  citations of  $N_c$  cited papers of an author (see Table 2). As seen from Table 2, in the case of some of the authors, especially the highly cited authors, their highly cited papers (i.e. outliers) were excluded while calculating their mean and median citations for the papers. The above normalization procedure was used to verify whether distributions of total citations  $l_n$  of  $n$ th papers of different authors converge to a single curve.

It should be mentioned that the fractions  $l_{nf}$  of citations of individual  $n$ th paper for the various authors are distinguished from those for the cumulative citations  $l_n$  of multi-authored papers by the subscript ‘‘f’’. Similarly, the average value  $\langle L_f \rangle$  of his/her contributed citations  $L_f$  is distinguished from the average value  $\langle L \rangle$  of cumulative citations  $L$  of an author by the subscript ‘‘f’’. However, while denoting relative citations  $l_n^*$  and  $l_{nf}^*$  the subscript  $n$  for the rank  $n$  has been omitted in different figures and tables, and the best-fit parameters of Eq. (3) for the contributed citations  $l_f^*$  of individual papers for the various professors are distinguished from those for

the cumulative citations  $l^*$  of multi-authored papers by the subscript ‘‘f’’.

## 4. Results and discussion

### 4.1. Normalized citations of individual papers of authors and their dimensionless rank

Figures 2 and 3 show the real data of relative citations  $l^*$  and  $l_f^*$  of papers published by different highly- and moderately-cited authors, respectively, as a function of dimensionless rank  $n/N_c$  of their papers. In these figures the relative citations  $l^*$  and  $l_f^*$  of each paper represent cumulative citations  $l_n$  of each  $n$ th paper and their cumulative fractional citations  $l_{nf}$  normalized by dividing them by their mean  $\langle L \rangle$  and  $\langle L_f \rangle$  citations, respectively. Figure 4 shows, as an example, relative citations  $l^*$  and  $l_f^*$  of papers published by moderately-cited authors as a function of dimensionless rank  $n/N_c$  of their papers. Here the  $l_n$  and  $l_{nf}$  citations are normalized by their median  $\langle L \rangle$  and  $\langle L_f \rangle$  citations, respectively.

It may be seen that the  $l^*(n/N_c)$  and  $l_f^*(n/N_c)$  data, normalized by both mean as well as median  $\langle L \rangle$  and  $\langle L_f \rangle$  citations, for different authors result in broad single curves and that the spread or dispersion of the data in the  $y$  direction is relatively large in the entire  $n/N_c$  range. As indicated by the spread of the data, normalization of citations of individual papers by mean values  $\langle L \rangle$  and  $\langle L_f \rangle$  of citations leads to a better convergence in the entire  $n/N_c$  range for all authors (see Figures 2 and 3), but no universality of citation distributions for the authors, similar to that reported by Radicchi et al. [37] for

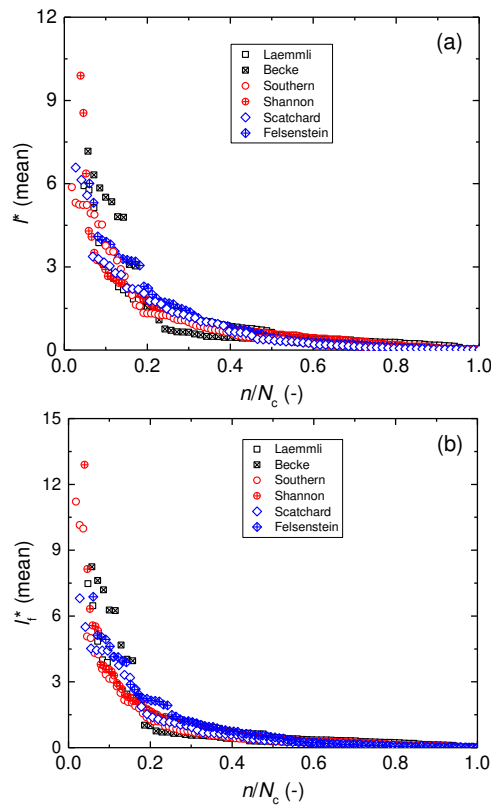


Figure 2: Normalized citations (a)  $l^*$  and (b)  $l_f^*$  of papers published by highly-cited authors as a function of dimensionless rank  $n/N_c$  of their papers. Normalization of citations was carried by the mean  $\langle L_n \rangle$  and  $\langle L_{fn} \rangle$  citations. See text for details.

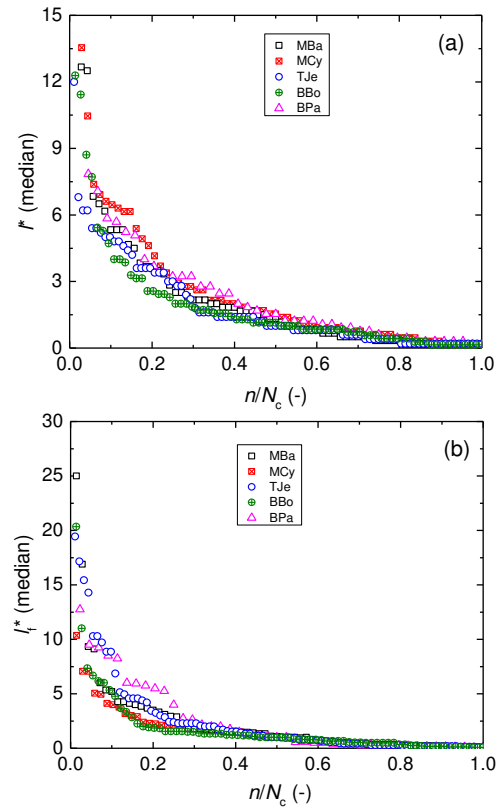


Figure 4: Normalized citations (a)  $l^*$  and (b)  $l_f^*$  of papers published by moderately-cited authors as a function of dimensionless rank  $n/N_c$  of their papers. Citations  $L_n$  and  $L_{fn}$  are normalized by their median  $\langle L_n \rangle$  and  $\langle L_{fn} \rangle$  citations.

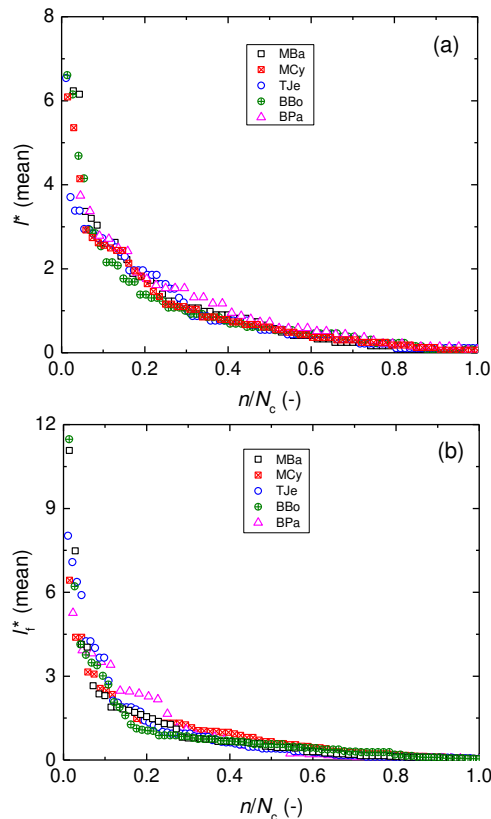


Figure 3: Normalized citations (a)  $l^*$  and (b)  $l_f^*$  of papers published by moderately-cited authors as a function of dimensionless rank  $n/N_c$  of their papers. Normalization of citations was carried by the mean  $\langle L_n \rangle$  and  $\langle L_{fn} \rangle$  citations. See text for details.

the distribution of citations within different disciplines, is observed. However, large spread in the relative citations of different papers at low  $n/N_c$  is a general feature of these citation patterns. These dispersions are associated with different dependence of  $l^*$  and  $l_f^*$  on  $n/N_c$  for each author. This means that the distribution patterns of  $l^*$  and  $l_f^*$  are characteristic for each author, and the values of the parameters of any function such as Langmuir-type function (3) capable of describing them are representative of the author.

#### 4.2. Rank-order distribution of normalized citations of different authors

Figures 5 and 6 show the data of relative citations  $l^*$  and  $l_f^*$  of papers, normalized by the mean values of  $\langle L \rangle$  and  $\langle L_f \rangle$  citations, of different highly- and moderately-cited authors, respectively, as a function of the rank  $n$  of their papers. Solid and dashed curves in the figures present best-fit plots for  $l^*$  and  $l_f^*$  with the values of the parameters of Eq. (3) listed in Table 3.

The distribution patterns of relative citations  $l^*$  and  $l_f^*$  normalized by the mean citations of the papers for different moderately-cited authors in Figure 6a,b are somewhat similar and frequently overlap each other. This feature may be noted from Figure 6a. However, when all papers of an author are included in the normalization of citations, the overlapping of the two citation distribution appears to improve when the first highly-cited papers are excluded from the normalization

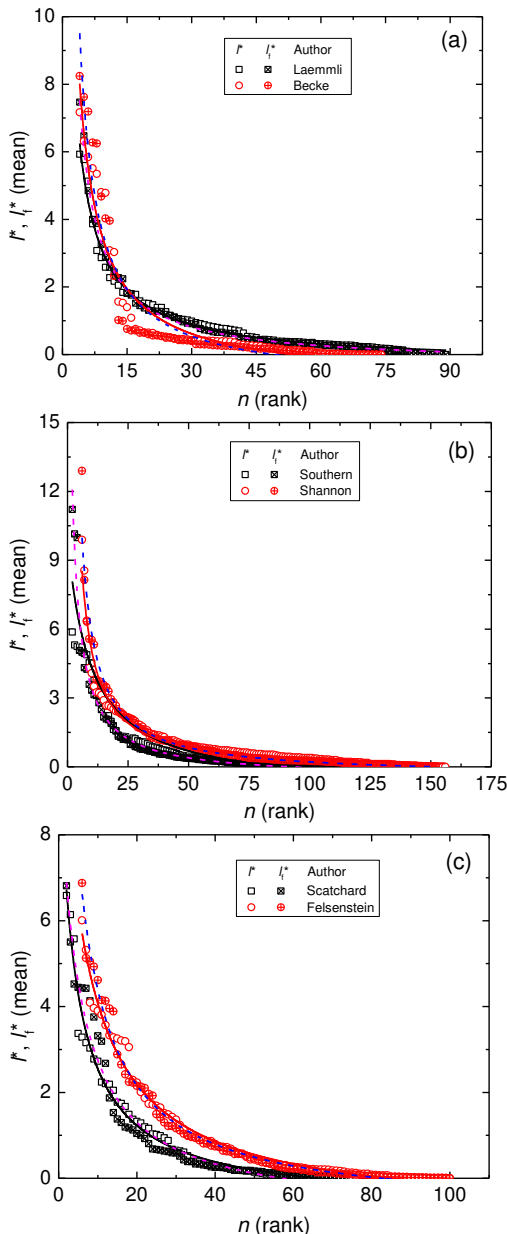


Figure 5: Plots of  $l^*$  and  $l_f^*$  of papers of different highly-cited authors against their rank  $n$ : (a) Laemmli and Becke, (b) Southern and Shannon, and (c) Scatchard and Felsenstein. Solid and dashed curves are drawn for  $l^*$  and  $l_f^*$  with the best-fit values of the parameters of Eq. (3) listed in Table 2. Cumulative citations  $L_n$  and cumulative fractionalized citations  $L_{nf}$  are normalized by mean  $\langle L_n \rangle$  and  $\langle L_{nf} \rangle$  citations.

(see Figure 6b).

From the trends of the distributions of relative citations  $l^*$  and  $l_f^*$  of papers published by different highly- as well as moderately-cited authors, the following inferences can be made:

- (1) Mean citations of individual papers of different authors is better for comparison of their publication output.
- (2) Rank-order distribution patterns of relative citations  $l^*$  and  $l_f^*$  normalized by the mean citations of the papers for different authors are different and are characterized by the two sets of three parameters:  $l_0^*$ ,  $\alpha$  and  $K$  for the  $l^*(n)$  data and  $l_{f0}^*$ ,  $\alpha_f$  and  $K_f$  for

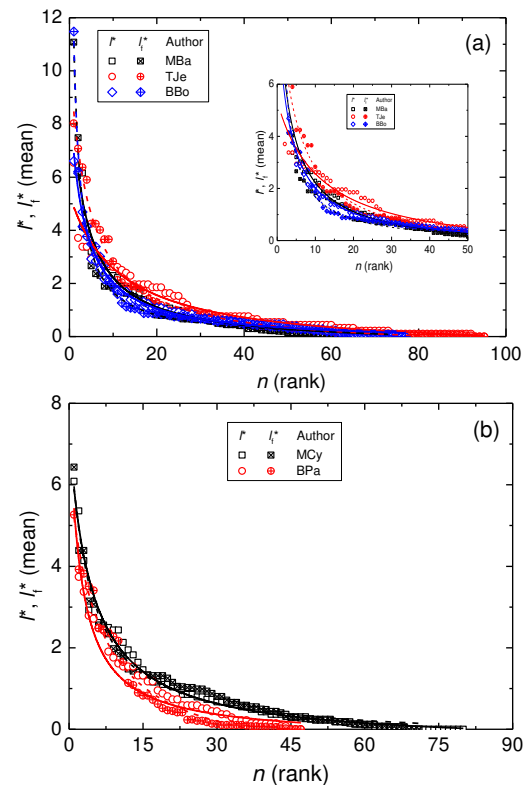


Figure 6: Plots of  $l^*$  and  $l_f^*$  of papers of different moderately-cited Polish authors against their rank  $n$ : (a) MBA, TJe BBo, and (b) MCy and BPa. Solid and dashed curves are drawn for  $l^*$  and  $l_f^*$  with the best-fit values of the parameters of Eq. (3) listed in Table 3. Inset in (a) shows magnified part of the plots close to the origin. Normalization of citations by mean citations.

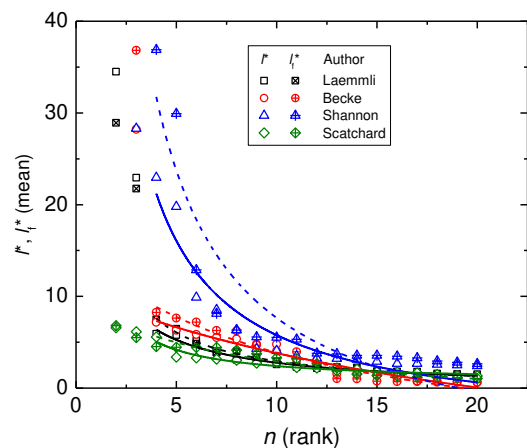


Figure 7: Plots of normalized citations  $l^*$  and  $l_f^*$  of papers of four highly-cited authors against their rank  $n$  in the range of  $n < 20$ . Solid and dashed curves are drawn for  $l^*$  and  $l_f^*$  in the range  $4 \leq n \leq 20$  with the best-fit parameters of Eq. (3) listed in Table 4. Normalization of  $l^*$  and  $l_f^*$  citations by mean citations.

the  $l_f^*(n)$  data.

- (3) Inclusion of citations  $l_n$  and  $l_{nf}$  of individual highly-cited papers during the analysis leads to large differences in the distributions of normalized citations.

Figure 7 shows plots of relative citations  $l^*$  and  $l_f^*$  of papers of four highly-cited authors against their rank  $n$  in the range of  $2 < n < 20$ . Solid and dashed curves are



Table 3: Values of parameters of Langmuir-type function (3) for  $l^*(n)$  and  $l_f^*(n)$  data of different authors

Author	Citations $l^*$ (with coauthors)				Citations $l_f^*$ (without coauthors)			
	$l_0^*$	$\alpha$	$K$	$R^2$	$l_0^*$	$\alpha_f$	$K_f$	$R^2$
Laemmli UK	23.40	1.0115	0.658	0.9841	111.7	1.0027	3.325	0.9946
Becke AD	44.81	1.0178	1.043	0.9292	1162	1.0007	27.82	0.9178
Southern EM	10.0	1.1083	0.105	0.8951	27.79	1.0174	0.624	0.9755
Felsenstein J	12.05	1.0730	0.161	0.9849	19.97	1.0404	0.30	0.9872
Shannon RD	523804	1.0	9997	0.9616	623514	1.0	9999	0.9679
Scatchard G	10.31	1.0617	0.244	0.9828	10.0	1.0874	0.20	0.9655
MBa	10.17	1.0362	0.307	0.9690	26.87	1.0041	1.152	0.9840
MCy	7.25	1.0550	0.214	0.9828	7.57	1.0342	0.258	0.9796
TJe	5.35	1.1083	0.088	0.9492	10.57	1.0505	0.233	0.9892
BBa	9.16	1.0255	0.315	0.9887	28.46	1.0014	1.551	0.9820
BPa	7.78	1.0294	0.415	0.9593	6.27	1.1571	0.171	0.9761
	10.0 <sup>a</sup>	1.1857 <sup>a</sup>	0.113 <sup>a</sup>	0.9936 <sup>a</sup>				

<sup>a</sup> Best-fit values for data without first point.

Table 4: Values of parameters of Langmuir-type function (3) for  $l^*(n)$  data in the rank range  $4 \leq n \leq 20$ 

Author	Citations $l^*$ (with coauthors)				Citations $l_f^*$ (without coauthors)			
	$l_0^*$	$\alpha$	$K$	$R^2$	$l_0^*$	$\alpha_f$	$K_f$	$R^2$
Laemmli UK	33.57	1.0065	1.033	0.9591	177.8	1.002	5.383	0.9881
Becke AD	10.58	2.2264	0.040	0.9535	15.08	1.592	0.088	0.9438
Shannon RD	368560	1.0	3581	0.8991	640567	1.0	3987.4	0.8393
Scatchard G	8361	0.9999	472	0.9125	10	1.218	0.140	0.8760

Table 5: Values of parameters of Langmuir-type function (3) for  $l_f^*(n_{\text{eff}})$  data

Author	$N_c^{\text{ef}}$	$l_0^{*\text{ef}}$	$\alpha_f^{\text{ef}}$	$K_f^{\text{ef}}$	$R^2$
Laemmli UK	32.83	165474	1.0	9993	0.9886
Becke AD	48.92	47087	1.00002	1248	0.8894
Southern EM	59.59	24632	1.00003	939.4	0.9556
Felsenstein J	75.31	26.05	1.03429	0.465	0.9853
Shannon RD	58.54	271559	1.0	7898	0.9144
Scatchard G	40.89	10.0	1.10088	0.340	0.9562
MBa	17.91	11.216	1.02460	1.727	0.9890
MCy	22.87	10.0	1.00177	1.341	0.8380
TJe	35.08	10.61	1.08863	0.369	0.9786
BBa	31.31	13.06	1.00222	1.718	0.9675
BPa	21.69	10.0	1.03760	0.747	0.7520

drawn for  $l^*$  and  $l_f^*$  in the range  $4 \leq n \leq 20$  with the best-fit parameters of Eq. (3) listed in Table 4. From these plots the following features may be noted:

- (1) The values of both  $l^*$  and  $l_f^*$  for all of the four authors show relatively poor fit in view of their irregular decreasing trends with increasing rank  $n$ .
- (2) Except in the case of Scatchard, for low  $n$  the values of  $l^*$  and  $l_f^*$  steeply decreases with increasing  $n$ .
- (3) In the case of Becke and Shannon, after an initial steep decrease the values of  $l^*$  and  $l_f^*$  decrease relatively poorly with increasing  $n$ .

These deviations of the data from the best-fit plots are associated with the difference in the number  $s_{\text{max}}$  of the active citation sites for the papers of an author (see assumption 1 in Section 2).

The distribution of relative citations  $l_f^*$  normalized by mean citations  $\langle L_f \rangle$  of  $N_c$  cited papers of different authors can also be analyzed as a function of their effective rank  $n_{\text{eff}}$ . Figure 8a and b shows the plots of relative citations  $l_f^*$  of papers of the 6 highly-cited and 5 moderately-cited authors, respectively, as a function of their effective rank  $n_{\text{eff}}$ . The curves in the figures are drawn according to Eq. (3) with the best-fit values of the new

parameters  $l_0^{*\text{ef}}$ ,  $\alpha_f^{\text{ef}}$  and  $K_f^{\text{ef}}$  of Eq. (3) listed in Table 5. Table 5 also includes the values of the effective number  $N_c^{\text{ef}}$  cited papers of different authors. It may be noted that the data for all authors are characterized by individual sets of the new parameters  $l_0^{*\text{ef}}$ ,  $\alpha_f^{\text{ef}}$  and  $K_f^{\text{ef}}$  of Eq. (3) but the mutual dispersion among them is smaller when the values of  $l_f^*$  are normalized by the mean  $\langle L_f \rangle$  of cumulative fractions  $l_{\text{nf}}$  of citations of their papers. The values of the goodness-of-the fit parameter  $R^2$  for the plots of the  $l_f^*(n_{\text{eff}})$  data are also comparable with those for the plots of their  $l_f^*(n)$  data (see Tables 3 and 4).

#### 4.3. Parameters characterizing citation distributions of different authors

The above analysis of the publication output of different authors by Langmuir-type function (3) shows that real rank-order distributions of citations  $l_n$  and fractions  $l_{\text{nf}}$  of citations of papers of an author can be described by the two sets of three parameters:  $l_0$ ,  $\alpha$  and  $K$ , and  $l_{f0}$ ,  $\alpha_f$  and  $K_f$ , respectively. The parameters  $l_0$  and  $l_{f0}$  are related to the parameters  $l_0^*$  and  $l_0^{*\text{ef}}$  by the relations:  $l_0 = l_0^* \langle L \rangle$  and  $l_{f0} = l_0^{*\text{ef}} \langle L_f \rangle$ , where  $l_0^*$  and  $l_0^{*\text{ef}}$  are given in Table 3



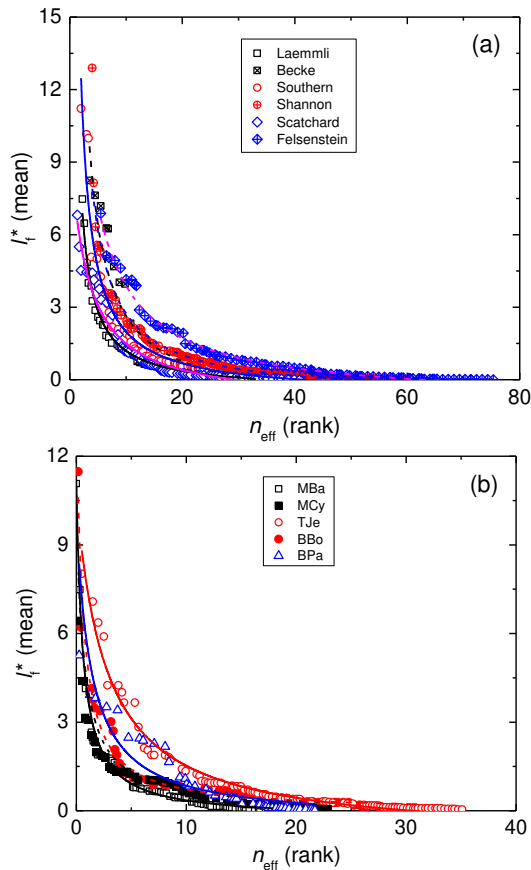


Figure 8: Plots of relatively citations  $l_f^*$  of papers of (a) highly-cited and (b) moderately-cited authors against their effective rank  $n_{eff}$ . Curves are drawn with the best-fit values of the parameters of Eq. (3) listed in Table 4. Normalization of  $l_f^*$  citations by mean citations.

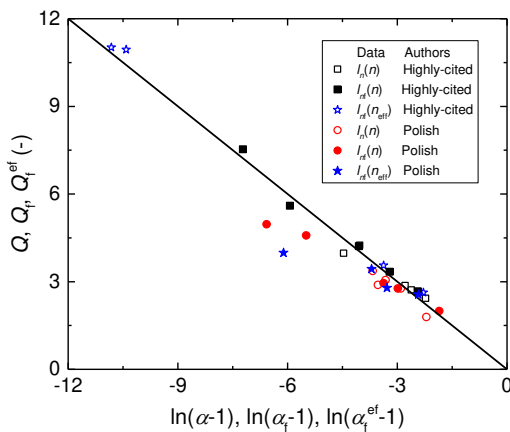


Figure 9: Plots of  $Q = \ln K' = \ln(KN_c)$  against  $\ln(\alpha - 1)$ ,  $Q_f = \ln K_f' = \ln(K_f N_c)$  against  $\ln(\alpha_f - 1)$  and  $Q_f^{ef} = \ln K_f'^{ef} = \ln(K_f^{ef} N_c^{ef})$  against  $\ln(\alpha_f^{ef} - 1)$  for different authors. Linear plot represents the dependence expected from Eq. (10) with slope  $-1$ .

whereas  $\langle L \rangle$  and  $\langle L_f \rangle$  are listed in Table 2. Similarly, as in the case of the  $l_{nf}(n)$  distributions, the  $l_{nf}(n_{eff})$  distribution may be represented by a new set of three parameters:  $l_{f0}^{ef}$ ,  $\alpha_f^{ef}$  and  $K_f^{ef}$ , with  $l_{f0}^{ef} = l_{f0}^{*ef} \langle L_f \rangle$ . The values of the new parameters  $l_{f0}^{*ef}$ ,  $\alpha_f^{ef}$  and  $K_f^{ef}$  are listed in Table 5 and those of  $\langle L_f \rangle$  are given in Table 2.

The best-fit values of the parameters  $l_0$ ,  $l_{f0}$  and  $l_{f0}^{ef}$  obtained from the  $l_n(n)$ ,  $l_{nf}(n)$  and  $l_{nf}(n_{eff})$  distributions

are usually very high and comparable (cf. Tables 2, 3 and 5). However, the mean citations  $\langle L \rangle$  and  $\langle L_f \rangle$  are parameters characteristic for an author. Similarly, the effectiveness parameters  $\alpha$ ,  $\alpha_f$  and  $\alpha_f^{ef}$ , the Langmuir constants  $K$ ,  $K_f$  and  $K_f^{ef}$ , and the number  $N_c$  and the effective number  $N_c^{ef}$  of citable papers of an author are characteristic parameters of his/her publication output.

Eq. (7) may be rewritten in the form (cf. Eq. (5))

$$q = q_0 - \ln(\alpha - 1), \tag{8}$$

where  $q = \ln k$ ,  $q_0 = \ln k_0$ ,  $k$  denotes dimensionless Langmuir constant  $K' = KN_c$ ,  $K_f' = K_f N_c$  and  $K_f'^{*} = K_f^* N_c^*$  as above,  $k_0$  denotes the values of  $K'$ ,  $K_f'$  or  $K_f'^{*}$  when  $(\alpha - 1) = 0$ , and  $\alpha$  denotes the values of  $\alpha$ ,  $\alpha_f$  and  $\alpha_f^*$  corresponding to  $K'$ ,  $K_f'$  and  $K_f'^{*}$ , respectively. Now the parameter  $q$  represents the dimensionless differential energy  $Q$ ,  $Q_f$  and  $Q_f^*$  corresponding to  $KN_c$ ,  $K_f N_c$  and  $K_f^* N_c^*$ , respectively. According to Eq. (8),  $q_0 = \ln k_0 = 0$  because the proportionality constant  $(kN_c)_0 = k_0 = 1$  (see Section 3).

Figure 9 shows the data of  $Q = \ln K' = \ln(KN_c)$ ,  $Q_f = \ln K_f' = \ln(K_f N_c)$  and  $Q_f^{ef} = \ln K_f'^{ef} = \ln(K_f^{ef} N_c^{ef})$  against  $\ln(\alpha - 1)$ ,  $\ln(\alpha_f - 1)$  and  $\ln(\alpha_f^{ef} - 1)$ , respectively, for different authors according to Eq. (8). The values of different quantities were taken from Tables 1, 3 and 5. As expected from Eq. (8), one observes from Figure 9 a practically linearly decreasing plot of the data of  $Q$ ,  $Q_f$  and  $Q_f^*$ , with a slope of unity and an intercept of zero, against increasing  $\ln(\alpha - 1)$ ,  $\ln(\alpha_f - 1)$  and  $\ln(\alpha_f^{ef} - 1)$ , respectively, for the distribution of citations to the papers published by different authors. Since the effectiveness parameters  $\alpha$ ,  $\alpha_f$  and  $\alpha_f^{ef}$  are related to  $KN_c$ ,  $K_f N_c$  and  $K_f^{ef} N_c^{ef}$  by Eq. (8), it can be argued that the latter parameters, and the related dimensionless differential energies  $Q$ ,  $Q_f$  and  $Q_f^{ef}$ , also characterize the publication output of an author.

From the above discussion it may be concluded that pairs of an author's mean citations  $\langle L \rangle$  and dimensionless differential energy  $Q$  (where  $Q = \ln(KN_c)$ ) and  $\langle L_f \rangle$  and  $Q_f$  (where  $Q_f = \ln(K_f N_c)$ ) are possible measures of characterization (and comparison) of his/her publication output with that of other authors from the distribution of cumulative citations  $l_n$  of their  $N_c$  cited papers published during their entire publication career. When contributions of coauthors to the citation  $l_n$  of the papers of an author are counted as  $l_{nf}$  and their ranking is arranged as effective rank  $n_{eff}$ , the relevant parameters obtained from the distribution of  $l_{nf}$  of their  $N_c^{ef}$  papers are:  $\langle L_f \rangle$  and  $Q_f^{ef} = \ln(K_f^{ef} N_c^{ef})$ .

The main problem with the above analysis is that the pair of parameters cannot be combined into a single index for the comparison of the publication output of different authors.

#### 4.4. Comparison of various single citation indices

Based on his stochastic model [55], Burrell [56] proposed a simple geometric distribution involving the number  $N$  of papers receiving  $L$  citations for an author to calculate his/her so-called quasi  $h$  index ( $h'$ ). Using

the published data of the number of papers  $N$  and citations  $L$  of 15 authors, Burrell [56] showed that, if one or more outliers in the upper tail of the citation distribution of an author are omitted, his approach gives good estimate of their  $h$  index. It may be noted that the values of this  $h'$  index, estimated by Burrell, of the 15 authors are comparable with the values of their citation radius  $R = (L/\pi)^{1/2}$  (cf. ref. [57]).

From the distributions of citations  $l_n(n)$ ,  $l_{nf}(n)$  and  $l_{nf}(n_{\text{eff}})$  data of the different authors their Hirsch index  $h$ , the new index  $h_f$  and the Hirsch-type index  $h_m$ , respectively, were determined using the procedures mentioned above. Following the proposal of Batista et al. [18], the so-called  $h_1$  index was calculated from the relation:  $h_1 = h^2/A_h$ , where  $A_h$  is the total number of coauthors of a particular author in the  $h$ -core. Excluding the citations of the outliers, the citation radii  $R$  and  $R_f$  of the authors were also calculated from their cumulative citations  $L$  and  $L_f$  (cf. ref. [57]). The calculated values of the  $h$ ,  $h_f$ ,  $h_m$  and  $h_1$  indices and the citation radii  $R$  and  $R_f$  of the authors are included in Table 1. The values of the number  $A_h$  of authors in the  $h$ -core, the number of cumulative citations  $L$  of the authors without their outliers, the number  $N_c$  of papers without outliers, and the number  $N_m$  of the papers involved in the  $h_m$  index of the authors are given in Table 1 in the parentheses.

From Table 1 it may be noted that the value of the  $h$  index of different authors is related directly neither to their cumulative citations  $L$  nor to the number of papers published by them. For example, Felsenstein, with  $L = 46478$  citations, has an  $h$  index equal to 51 whereas Becke, with citations twice the citations of Felsenstein, has  $h$  equal to 48 only. Another example is that of TJe and MCy having  $h$  index equal to 18 but the latter's papers received citations about 40% higher than that of the former. Similarly, Becke with 70 cited papers has a higher  $h$  index than that of Southern and Shannon with 110 and 152 cited papers, respectively.

As in the case of the  $h$  index of different highly-cited authors, their  $h_f$  index is also related neither to their cumulative citations  $L_f$  nor to the number of papers published by them (Table 1). For example, Laemmler and Becke have  $h_f = 40$  but Becke has  $L_f$  twice higher than that of Laemmler. Similarly, although Shannon has about 40% higher cited papers than Southern, both have the same  $h_f = 28$ . In the case of moderately-cited Polish professors the above trends are not so clear. However, as judged from the number  $A_h$  of coauthors in the  $h$ -core and the number  $N_c$  of cited papers of an author, the value of his/her  $h_f$  index is determined by the number of coauthors of the high-ranked (i.e. more cited) papers and the number of his/her published papers.

As seen from Table 1, the estimated citation radius  $R$  for different moderately-cited Polish authors are comparable with their  $h$  index. Similarly, the values of  $R_f$  for these authors are also comparable with their  $h_f$  index. In contrast to this, the estimated values of  $R$  for the highly-cited authors are much higher than their  $h$  index even when citations from outliers are excluded from cumulative citations. However, the values of their  $R_f$  are close

to their  $h_f$  in some cases or somewhat higher than their  $h_f$  in other cases. These observations suggest that  $R \approx h$  and  $R_f \approx h_f$  when the distribution of citations  $l_n$  and  $l_{nf}$  of succeeding papers in the range of more cited papers (i.e.  $n < h$ ) is a smoothly, rather than a steeply, decreasing function of lowering rank  $n$  of the papers. This is the situation in the case of moderately-cited Polish professors. However, the values of  $R$  and  $R_f$  are higher than  $h$  and  $h_f$ , respectively, when the papers of rank  $n < h$  in the citation distributions receive relatively high citations  $l_n$  and  $l_{nf}$ . This is the situation in the case of highly-cited authors (see Table 1). While calculating his  $h'$  index of different authors from their cumulative citations  $L$  and papers  $N$ , Burrell [56] also attributed the estimated high values of the  $h'$  index of some of the authors than those of their  $h$  index to the citations of highly cited papers.

Table 1 reveals that the  $h_1$  index is not a suitable citation-based measure of comparison of the research output of different authors. For example, Laemmler, with citations five times higher than that of Felsenstein, has  $h_1$  roughly one-half of the  $h_1$  of Felsenstein. Similarly, although MBa's papers received more citations than MCy's papers, MBa has  $h_1$  lower than that of MCy by a factor of 7.5. This anomalous behavior of the  $h_1$  index is associated with the total number  $A_h$  of coauthors considered in calculating it from the  $h$  index. A similar behavior was reported by Schreiber [42].

It is interesting to note the difference in the number of papers included in the calculation of citation radii  $R$  and  $R_f$  and Hirsch and Hirsch-type indices  $h$ ,  $h_f$  and  $h_m$  of different authors. While the citations received by all cited papers  $N_c$  of an author are taken into account in the calculation of his/her citation radii  $R$  and  $R_f$ , counting of  $h$  index is based on cited papers  $n_c \leq h < N_c$  and that of  $h_f$  index is based on even a lower number of cited papers (see Table 1). For example, in the case of Laemmler, the counting of his  $h$  index involves 58 papers but that of  $h_f$  index based on fractions of citations of his papers with coauthors is just 40. The deficiencies of the  $h$  and  $h_f$  indices of different authors mentioned above are overcome by the  $h_m$  index, which is determined by fractions  $n_{\text{eff}}$  of the rank of a higher number of their papers. The determination of this  $h_m$  index of an author involves the number of papers comparable with that involved in determining his/her  $h$  index (see Table 1). In the case of Laemmler for example, the number  $N_m$  of the cited papers involved in the calculation of  $h_m$  index is 55 in comparison with  $n_c = 58$  cited papers in determining the  $h$  index. These observations suggest that  $h_m$  index is superior to  $h$  and  $h_f$  for comparison of the publication output of different authors because it takes into account the number of coauthors of their papers as well as the number of cited papers comparable with those involved in the calculation of the classical  $h$  index.

From the data of cumulative fraction  $L_f$  of citations of the authors given in Table 1 one finds empirically that, with the exception of Felsenstein and MBa,  $h_m \approx (2L_f)^{1/3}$ . The estimated value of  $h_m$  of 26.70 is much lower than the calculated 41.92 for Felsenstein whereas

Table 6: Comparison of different scaling parameters for citations analysis of various authors

Author	$t$ (yr)	$N_c$	$\langle L \rangle$	$\langle L_f \rangle$	$b$	$b_f$	$b_m$
Laemmli UK	45	84	166.40 (2)	65.99 (3)	1.29 (2)	0.89 (2)	0.476 (4)
Becke AD	36	70	232.88 (1)	178.41 (1)	1.33 (1)	1.11 (1)	0.8728 (2)
Southern EM	56	110	60.66 (5)	31.75 (4)	0.73 (7)	0.50 (6)	0.341 (7)
Felsenstein J	48	99	130.98 (3)	101.21 (2)	1.06 (5)	0.625 (4)	0.8733 (1)
Shannon RD	45	152	41.66 (6)	15.98 (6)	1.00 (6)	0.622 (5)	0.407 (5)
Scatchard G	68	73	78.54 (4)	38.90 (5)	0.485 (10)	0.368 (8)	0.236 (9)
MBa	15	70	12.19 (10)	3.39 (11)	1.133 (4)	0.467 (7)	0.349 (6)
MCy	35	68	16.43 (7)	4.56 (9)	0.514 (8)	0.257 (10)	0.230 (10)
TJe	15	92	9.17 (11)	4.24 (10)	1.20 (3)	0.667 (3)	0.537 (3)
BBo	41	74	13.01 (9)	5.32 (8)	0.415 (11)	0.244 (11)	0.203 (11)
BPa	32	44	13.79 (8)	9.69 (7)	0.50 (9)	0.344 (9)	0.3225 (8)

that of  $h_m$  of 7.80 is higher than the calculated 5.24 for MBa. As seen from Table 1, these anomalies are associated with differences in the number of coauthors of the top-cited papers. The number of coauthors per paper in the former case is relatively low in comparison with those in the latter case.

Finally, it should be noted from Tables 1 and 2 that the  $h$ ,  $h_f$  and  $h_m$  indices of different authors are, in general, related to their mean citations  $\langle L \rangle$  and  $\langle L_f \rangle$ . Consequently, all highly-cited authors with high  $\langle L \rangle$  and  $\langle L_f \rangle$  are in the top six positions whereas the moderately-cited authors with the low of  $\langle L \rangle$  and  $\langle L_f \rangle$  occupy positions lower than those of the highly-cited authors.

#### 4.5. Scaling parameters for research output of different authors

The  $h$ ,  $h_f$  and  $h_m$  indices and the pairs of characteristic parameters  $\langle L \rangle$  and  $Q$ , and  $\langle L_f \rangle$  and  $Q_f$  of an author, discussed above, are related to the distributions  $l_n(n)$ ,  $l_{nf}(n)$  and  $l_{nf}(n_{\text{eff}})$ , respectively, constructed from his/her bibliometric data. The inherent disadvantage with all of these measures of the publication output of an author is that their values do not take into account the length of publication career of the author. It is difficult to calculate career-length independent characteristic parameters from Langmuir-type function for individual authors, but this factor can be considered in the  $h$ ,  $h_f$  and  $h_m$  indices using the ideas used before [58].

The relationship between cumulative citations  $L(t)$  and Hirsch index  $h$  is given by [1]

$$L(t) = Ah^2(t), \quad (9)$$

whereas according to progressive nucleation mechanism [57,58] and stochastic model [55]

$$L(t) = at^2. \quad (10)$$

In the above equations  $A$  is an empirical constant lying between 3 and 5, and  $a$  is the so-called citation acceleration related, among others, to the average number of papers published per year by an author. From the above relations one obtains

$$h = bt, \quad (11)$$

where the proportionality constant  $b = (a/A)^{1/2}$ , with units year<sup>-1</sup>.

Relation (11) means that the average  $h$  of an author increases linearly with publication career  $t$ . Since other

Hirsch-related indices like  $h_f$  and  $h_m$  are based on similar concept, it can be argued that these indices also increase linearly with  $t$ . The calculated values of the parameter  $b$ , denoted as  $b$ ,  $b_f$  and  $b_m$  corresponding to  $h$ ,  $h_f$  and  $h_m$ , respectively, are given in Table 6.

From Table 6 it may be noted that the parameters  $b$ ,  $b_f$  and  $b_m$  for different authors lead to a major change in their ranking. When the contribution of coauthors is taken into account for a comparison of the publication of different authors, the ranking of highly-cited authors is drastically changed, and highly-cited authors like Southern EM and Scatchard G are shifted downward but moderately-cited authors like TJe and MBa of short publication career are shifted upward to 3<sup>rd</sup> and 6<sup>th</sup> ranks, respectively.

## 5. Summary and conclusions

The real data of cumulative citations  $l_n$  of  $n$ th paper of individual  $N$  papers published by selected authors are analyzed without and with consideration of the number  $A_n$  of coauthors of the paper, the normalization of citations  $l_n$  and cumulative fraction  $l_{nf}$  of citation of the  $n$ th paper by mean and median citations of the citations  $l_n$  of all  $N_c$  cited papers and the determination of cumulative fraction  $n_{\text{eff}}$  of the rank of the  $l_{nf}$  citations. In view of different authorship patterns used in the lists of authors of the papers considered in this study and enormously high number of coauthors in many cases,  $l_{nf}$  and  $n_{\text{eff}}$  were calculated on the assumption of equal contributions of  $A_n$  coauthors of the  $n$ th-ranked paper fetching  $l_n$  citations.

It was found that Langmuir-type function (3) is not adequate for comparison of the publication output of different authors because it describes the rank-order distribution patterns satisfactorily in terms of two parameters. However, when equal contribution of coauthors is taken into account for the comparison of their publication output, the  $h_m$  index is more consistent than other Hirsch-type indices. To account for the length of their publication career  $t$ , it is suggested to use scaling parameters  $h/t$ ,  $h_f/t$  and  $h_m/t$  for a comparison of the publication output of different authors

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