



Which Criteria Qualify Power Indices for Applications? – A Comment on “The Story of the Poor Public Good Index”

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Abstract: We discuss possible criteria that may qualify or disqualify power indices for applications. Instead of providing final answers we merely ask questions that are relevant from our point of view and summarize some material from the literature.

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1. Introduction

Consider a committee that draws decisions via weighted voting. Given a heterogeneous committee, i.e., not all members have the same weight, the question for the relative distribution of power or influence within the committee naturally arises. The relative weight distribution comes first to mind. However, it is a very poor proxy in at least some situations. Consider a committee with three members drawing decisions by simple majority, where the weight distribution is given by $(47,36,17)$. The first two committee members seem to have a larger influence on the committee's decision than the third member. However, any two (or three) members can jointly implement a proposal.

Thus, all three committee members have arguably the very same influence on the group decision. The underlying mathematical reason for the poor approximation of power or influence by weights lies in the

variance of the possible weight vectors. I.e., our example might also be captured by weight vectors like (2,49,49), (30,40,30), or (40,15,45). Indeed, the set of weights representing such a weighted game is a full-dimensional polytope.

So, there is a need for measurements of power or influence that do not depend on a specific weighted representation but on the underlying *game*. (We will be more precise in the next section.) To this end so-called *power indices* were invented, see, e.g., Riker (1986) for a discussion about the introduction of the first power index. We remark that there is some discussion about what *power* precisely means, see, e.g., Riker (1964) and the citations thereof. However, we will not go into that here. The issue at stake is that several variants of power indices were proposed so far and still are, see, e.g., Casajus and Huettner (2018), so that one needs criteria to decide which power index to use. The discussion is quite old, see, e.g., Holler and Packel (1983) and the references therein. The current occasion is a comment Holler (2019), on a conjecture of Reinhard Selten, arguing that in some cases the choice or the exclusion of a certain power index is related to the fame and influence of its proposer. Of course, I agree that this should not be a relevant criterion and should be prevented in science. Here I would like to comment on the Public Good Index but mainly I would like to use the possibility to stimulate a broader discussion on reasonable criteria that qualify a power index for a given application. As this paper is also a comment and not a pure research paper, it contains many personal opinions and the selection of topics and literature is rather biased.

The remaining part of this comment is structured as follows. The necessary preliminaries on simple and weighted games as well as on power indices are given in Section 2. The main discussion on selection criteria for power indices is located in Section 3. The problem of whether we are still missing some important indices is addressed in Section 4. We draw a conclusion in Section 5.

2. Preliminaries

For a positive integer n let $N = \{1, \dots, n\}$ be the set of players. A *simple game* is a mapping $v: 2^N \rightarrow \{0, 1\}$ from the subsets of N to binary outcomes satisfying $v(\{\emptyset\}) = 0$, $v(N) = 1$, and $v(S) \leq v(T)$ for all $\{\emptyset\} \subseteq S \subseteq T \subseteq N$. Here, a subset $S \subseteq N$ is considered as the set of players that are in favor of a proposal, i.e., which vote *yes*. If $v(S) = 1$ we call coalition S *winning* and

losing otherwise. Given a simple game, by W we denote the set of winning and by L the set of losing coalitions. If a coalition S is winning but each proper subset is losing, then we call S *minimal winning*. Similarly, if S is losing but each proper superset of S is winning, then we call S *maximal losing*. If $v(S) = v(S \cup \{i\})$ for all $S \subseteq N$, then we call player i a *null player*. Two players i and j are *equivalent* if $v(S \cup \{i\}) = v(S \cup \{j\})$ for all $S \subseteq N \setminus \{i, j\}$. A simple game v is called *weighted* if there exist *weights* $w \in \mathbb{R}_{\geq 0}^n$ and a *quota* $q \in \mathbb{R}_{> 0}$ such that $v(S) = 1$ if and only if $w(S) := \sum_{i \in S} w_i \geq q$. As notation we use $v = [q; w_1, \dots, w_n]$ for a weighted game.

An example of a non-weighted simple game v is given by a family consisting of the parents $\{F, M\}$ and two kids $\{A, B\}$ jointly deciding on the next weekend trip. Assume that a proposal is accepted if at least one member of every group, i.e., parents and children, agrees. Since $\{F, M\}$ and $\{A, B\}$ are two losing coalitions but $\{F, A\}$ and $\{M, B\}$ are two winning coalitions consisting of the same set of players, the underlying simple game is not weighted. In our example players F and M as well as players A and B are equivalent. The minimal winning coalitions are given by $\{F, A\}$, $\{F, B\}$, $\{M, A\}$, and $\{M, B\}$. The *Public Good Index* $\text{PGI}(v)_i$ of a player i in N is given by the number of minimal winning coalitions that contain player i divided by the total number of players in all minimal winning coalitions. I.e., in our example the Public Good Index assigns equal influence to all four players.

The Public Good Index is just one example of a *power index*. Here, we understand by a power index a parametric family of mappings from the set of simple games on n players¹ into \mathbb{R}^n , i.e., to each player of a simple game we assign a real number. By that definition we allow a large variety of possible power measures but also exclude constructions that depend on the representation of a (weighted) simple game like, e.g., the Colomer index, see Colomer and Martinez (1995). Instead of restricting the class of power indices, we introduce properties of power indices and argue that it is quite natural to expect some of these properties to be satisfied for a “reasonable” power index. We call a power index g *positive* if $g_i(v) \geq 0$ and $g(v) \neq 0$ for every simple game v and all players i in v . If $\sum_{i \in N} g_i(v) = 1$ for every simple game v , then g is called *efficient*. In our context efficiency is a relevant

¹ It is of course also possible to define a power index just on special subclasses of simple games like, e.g., weighted games. Examples for the latter are given by the power indices based on weighted representations from Kaniowski and Kurz (2015).

property if we want to measure the *relative* distribution of power or influence. However, given any positive power index \hat{g} we can construct an efficient version via normalization, i.e., $g_i(v) = \hat{g}_i(v) / \sum_{j \in N} \hat{g}_j(v)$, see e.g. Kurz (2016, Lemma 3.4). We say that a power index g has the *null player property* if we have $g_i(v) = 0$ for every null player i in an arbitrary simple game v . For any bijection $\tau: N \rightarrow N$ we write τv for the simple game given by $\tau v(S) = v(\tau(S))$ for any coalition $S \subseteq N$.

With this, we call a power index g *symmetric* if we have $g_{(\tau(i))}(\tau v) = g_i(v)$ for every simple game v , every player $i \in N$, and every permutation τ of N . If we always have $g_i([q; w_1, \dots, w_n]) \geq g_j([q; w_1, \dots, w_n])$ for all indices i, j with $w_i \geq w_j$, we speak of *local monotonicity*. In order to define local monotonicity for non-weighted games, we need a bit more notation. Let v be an arbitrary simple game. If $v(S \cup \{i\}) \geq v(S \cup \{j\})$ for all $S \subseteq N \setminus \{i, j\}$, we write $i \succsim j$. With this, we call a power index g locally monotonic for v if $g_i(v) \geq g_j(v)$ whenever $i \succsim j$. If the relation \succsim is a complete, i.e., if we always have $i \succsim j$ or $j \succsim i$, we call v *complete simple game*, see Isbell (1958) for more details on Isbell's desirability relation. With this, a power index g is locally monotonic if it is locally monotonic for all complete simple games.²

A *TU game* is a mapping $v: 2^N \rightarrow \mathbb{R}$, i.e., each coalition is associated with a real number. Several power indices have a generalization to TU games. In that case one speaks of a *value*. We remark that, e.g., the Shapley value was invented first and then later specialized to the Shapley-Shubik index for simple games.

3. Selection criteria for power indices

In this section we would like to collect some criteria that may guide a user to select an appropriate power index for a given application.

3.1 The axiomatic approach

The basic idea of the axiomatic approach is very appealing. In principle one looks for simple properties of a power index, called axioms. For a

² Of course, this definition may be restricted to the class of weighted games.

given practical problem then one can check, which axioms have to be satisfied. Since some of those axioms are violated by some power indices such an analysis can help to limit the set of “reasonable” power indices for the given application. This kind of reasoning was e.g. be applied in Napel and Welter (2017) for the selection of value, for the allocation of cartel damages. That approach calls for a large list of easy to evaluate and well justified axioms. Of course, it is helpful if the axioms are disjunctive enough so that one finally ends up with a rather small set of possibilities. Indeed, the ultimate goal is an axiomatization of a given power index, i.e., a set of inclusion-minimal axioms that uniquely characterizes a power index in the class of all theoretically possible power indices.

Of course, it is good to have a unique answer, but on the other hand this request ends up in a search for axioms that exactly do this job and hopefully can be motivated in a more or less reasonable way. The large literature on axiomatizations teaches us that it seems to be not that hard to come up with some axiomatization for a large variety of power indices. This is just a personal opinion, but in most axiomatizations in the literature there is one axiom that is not as convincing as the others and looks somehow “constructed” for the purpose of getting an axiomatization. (Admittedly, there are exceptions like, e.g., Youngs axiomatization of the Shapley value Young (1985).) Conceptionally, starting from a given power index and searching for reasonable axioms seems not to be the right direction from our point of view. Moreover, I would say that the (temporary) absence of an axiomatization should not be a disqualifier for a reasonable power index.

What about the other direction? Which axioms may be seen as rather essential for nearly every application? My personal list consists of positivity, symmetry, efficiency, and the null player property. Being a mathematician, I of course like linearity, i.e., $g(\alpha u + \beta v) = \alpha g(u) + \beta g(v)$, or the reformulation and restriction to the class of simple games. However, I am not convinced that linearity is inherent in every application of power indices. As pointed out in Holler (2019), the violation of local monotonicity was, e.g., used in Felsenthal and Machover (1995) to disqualify the Public Good Index as a reasonable power index. As well as Holler, we do not agree on that point. My own answer on that issue is a bit indirect and goes as follows. If we say that symmetry, efficiency, the null player property and local monotonicity are essential for a reasonable power index, then have a look at the classes of power indices based on the representation polytope of weighted games in Kaniovski and Kurz (2015,

2018). Either these indices are also reasonable power indices or we are missing further “essential” axioms. Moreover, as a mathematician, I see little reason why the requested local monotonicity should be restricted to simple games. We can make the same kind of comparisons for complete simple games and, partially, also for simple games. Is it also natural to require local monotonicity in that stronger sense? Anyway, the violation of local monotonicity is just one example in a long list of possible voting paradoxes, see, e.g., Nurmi (1999).

3.2 Qualitative properties

As mentioned, the possibility to verify axioms in a practical application is very appealing. If one weakens the requirements of a formal axiom one might look for some qualitative behavior. If predictions are made within a model based on a power index, different power indices may be evaluated using econometric analysis. As a continuation of Kauppi and Widgrén (2004) such a comparison was performed, e.g., in Zaporozhets et al. (2016). Apart from that, the idea of qualitative properties is rather vague, but I want to give two examples. Consider a game with many players like a publicly traded stock company. What can we say about the power distribution of the major stock holders? Let us look at the extreme case of one stock holder owning a relatively large share. Mathematical analysis of the possible power of the largest player in a weighted game gives a rather clear picture.

Theorem (Kurz (2018, Theorem 8))

Let g be the Nucleolus, the Public Good, the Deegan-Packel, the minimum sum representation, the average weight, or the average representation index, then for each $\varepsilon > 0$ there exists an integer $N(\varepsilon)$ such that either $g_i(v) = 1$ or $g_i(v) \leq \frac{1}{2} + \varepsilon$ for each simple game v on $n \geq N(\varepsilon)$ players and an arbitrary player $1 \leq i \leq n$.

In contrast to that, the Shapley-Shubik, the Penrose-Banzhaf, and the Johnston index permit the existence of simple games such that $g_i(v)$ is arbitrarily close to any number in $(\frac{1}{2}, 1]$.

In a practical application, do we have this latter “continuum” of possible power values for the largest player or is there a clear cut (between 1 and $\frac{1}{2}$)? This is certainly a different qualitative behavior, that may be observed in practice?

A second example was initiated by Alon and Edelman (2010). Suppose we have some power index g and some weighted game v with player set N . If there exists a subset $I \subseteq N$ of the players such that $\sum_{j \in N \setminus I} g_j(v) \leq \varepsilon$ for some small $\varepsilon \in \mathbb{R}_{>0}$, does there always exist a simple game ϑ with player set I such that

$$\|g(v) - g(\vartheta)\|_1 \leq f(|I|)\varepsilon, \quad (1)$$

where f is a general function just depending on the cardinality of I ? As shown in Alon and Edelman (2010), such a result exists for the Penrose-Banzhaf index. In words we may reformulate the technical statement as follows. If for a simple game on n players the power is concentrated on just $k < n$ players, then there exists a k -player simple game whose power distribution does not deviate too much from the one of the original simple game. In Kurz (2016) it was, e.g., shown that also the Public Good Index allows such an Alon-Edelman type result while, e.g., the Johnston index does not. Again, we have some kind of qualitative behavior that is different for different power indices. Admittedly, the second example is significantly harder to grasp than the first one.

Further such examples might be rather useful. In Dubey and Shapley (1979) a lot of mathematical properties of the Penrose-Banzhaf index are mentioned. It might be worthwhile to compare them to similar results for other power indices. Starting with a purely mathematical motivation, one then has to check which of the phenomena can be verified in practical applications.

3.3 Beauty and generalizability

It is interesting to know if for a given power index a generalization to a value, i.e., an extension to the class of TU games, exists. This is, e.g., the case for the Shapley-Shubik and the Penrose-Banzhaf index, as well as the Nucleolus, but not for the Public Good Index. The first two mentioned power indices also allow a generalization to non-binary decisions -- either discrete or non-discrete, see, e.g., Kurz (2014, to appear). Continuous or interval decisions are not completely uncommon. In the context of a "fair" allocation of voting weights for differently sized groups this model has been studied, e.g., in Kurz et al. (2017). The existence of a generalization of a concept to a large class of structures may be seen as an indication that

the concept is somehow meaningful. Unfortunately, this does not answer the question for *what* purpose it is meaningful.

If we consider weighted games with many players where just a few have a non-vanishing weight, then some power indices allow so-called *limit results*. I.e., if the number of minor players increases but their total weight sum is fixed and the relative weights go to zero, then there is a stable power distribution of the major players. As shown in Dubey and Shapley (1979, Section 10) such kind of a limit result exists for the Penrose-Banzhaf index only if further assumptions on the weight ratios of the minor players are made. For the Shapley-Shubik index such an assumption is not necessary, which is the more “beautiful” result. For the nucleolus there exists a very simple and explicit upper bound on the deviation between power and weights for finite weighted games, see Kurz et al. (2014, Lemma 1). Compared to the known situation for the Shapley-Shubik index, see Neyman (1982), we would call this more “beautiful.” However, this depends on our current state of knowledge and the argument of beautiful theories has failed badly in, e.g., physics; see Brumfiel (2011).

3.4 Undesirable criteria

We completely agree with Holler (2019) that the fame and influence of the proposer of a power index should not have a significant impact on its usage. However, we have nothing to say whether that happened to the Public Good Index. We go a step further. When selecting the “best” index, we should also not be limited to the already published power indices. In principle it may be the case that we have missed the best power index for some applications so far. We will try to address this issue in Section 4.

As argued in Kurz et al. (2015, Section 4) the availability of easy-to-use software packages to compute power indices can limit their application, e.g., for the nucleolus. While this is understandable from a practical point of view, this should not be a desirable selection criterion for the choice of an appropriate power index.

4. Have we missed an index?

It seems natural that the selection of the best alternative may be limited to the set of the known alternatives. But this is not the case. New alternatives may be invented or even determined using optimization techniques. In this

section we would like to address the question whether we have missed an index and also give a further justification for the Public Good Index.

4.1 Systematization of power indices

Since a large variety of power indices was introduced in the literature so far, it makes sense to try to catalogue them in a systematic way. Here we will stick to the systematization from Kurz (2016), where all the subsequently occurring power indices are defined and cited. One idea is to count coalitions of a certain type \mathcal{T} , i.e.,

$$S^{\mathcal{T}}_i(v) = \#\{U \in \mathcal{T} : \{i\} \subseteq U \subseteq N\}, \quad (2)$$

see Kurz (2016, Subsection 3.5). Afterwards we can normalize to an efficient version, so that scaling factors are irrelevant. So, ignoring scaling factors, the types of winning, swing or critical, and minimal winning coalitions lead to the *König-Bräuninger*,³ the Penrose-Banzhaf,⁴ and the Public Good Index, respectively. For complete simple games the tightening of a minimal winning coalition is called shift-minimal winning coalition and the corresponding power index based on $S^{\mathcal{T}}$ is called *Shift index*. Are there other types of coalitions that have a relation to power? Removing the Public Good Index from the above list (see, e.g., Nurmi 1997), would certainly leave some gap.

In the above construction a special coalition $U \in \mathcal{T}$ may be counted for several players. Another variant is to distribute the contribution of a coalition equally among the involved players. This concept is called *equal division* transform in Kurz (2016, Definition 3.22) and turns, e.g., the Penrose-Banzhaf and the Public Good Index into the *Johnston* and the *Deegan-Packel index*, respectively. For the Shift index the corresponding equal division variant is called *Shift-Deegan-Packel index*. For the König-Bräuninger index we are not aware of a published name of the corresponding equal division variant.

³ The König-Bräuninger index is proportional to the Public Help and the Chow parameter index and also known under the name inclusiveness and Zipke index.

⁴ For the Penrose-Banzhaf index we have the technical detail that a critical coalition is only counted for those contained players that are critical, i.e., $v(U) - v(U \setminus \{i\}) = 1$.

The Shapley-Shubik index arises similarly as the Penrose-Banzhaf index from counting swing coalitions. Additionally, the contribution of every swing coalition is weighted by some factor solely depending on the cardinality of that coalition. Those weighted versions might of course also be studied for the other mentioned types of “special” coalitions.

4.2 Design of new power indices

Widgrén (2001) relates the normalized Penrose-Banzhaf index and the Public Good Index via $PBI_i = (1 - \pi) PGI_i + \pi \varepsilon_i$, see also Holler (2019) for details and interpretation. Since the Penrose-Banzhaf index is locally monotonic, this relation can point to elements which are responsible for the PGI's violation of local monotonicity. This fact has motivated the research in Freixas and Kurz (2016), where the authors, e.g., considered convex combinations of the Penrose-Banzhaf and the Public Good Index and asked for the minimum possible weight of the Penrose-Banzhaf index that yields a power index that is locally monotonic.

From a general point of view, this is just an instance of an attempt to design a new power index with some desired properties. The restriction to convex combinations of established power indices reduces the complexity in the computational part and allows first analyses. However, the ultimate goal would be to design power indices in the entire class of all theoretically possible power indices just by prescribing desired properties. Currently, the list of broadly accepted properties is too short to end up with a manageable (parametric) class of power indices. In any case, integer linear programming techniques, as used by Freixas and Kurz (2016), seem to be very advantageous for the design aim.

5. Conclusion

We have argued that the Public Good Index should not be excluded from the list of reasonable power indices for several reasons. We completely agree with Holler (2019) that the fame and influence of the proposer of a power index should not have a significant impact on its usage. We partially agree that the violation of local monotonicity of the Public Good Index is not a bug it's a feature, i.e., the PGI may detect special games. However, we have so far not seen any convincing explanation of *what* is detected. More analyses are needed in that direction. Moreover, the Public

Good Index naturally occurs in a systematic treatment of known power indices.

Instead of providing answers, here we want to broaden the discussion on which criteria should qualify a reasonable power index. We have tried to collect some possible aspects and would like to see more discussion on that question. Especially, we would highly welcome any suggestions for desirable properties of power indices that may further localize the class of all “reasonable” power indices.

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