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by László Csató

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László Csató*

Department of Operations Research and Actuarial Sciences Corvinus University of Budapest MTA-BCE "Lendület" Strategic Interactions Research Group Budapest, Hungary

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Abstract

The paper uses paired comparison-based scoring procedures for ranking the participants of a Swiss system chess team tournament. We present the main challenges of ranking in Swiss system, the features of individual and team competitions as well as the failures of official lexicographical orders. The tournament is represented as a ranking problem, our model is discussed with respect to the properties of the score, generalized row sum and least squares methods. The proposed procedure is illustrated with a detailed analysis of the two recent chess team European championships. Final rankings are compared by their distances and visualized with multidimensional scaling (MDS). Differences to official ranking are revealed by the decomposition of least squares method. Rankings are evaluated by prediction accuracy, retrodictive performance, and stability. The paper argues for the use of least squares method with a results matrix favoring match points.

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^{*} e-mail: laszlo.csato@uni-corvinus.hu

1 Introduction

Sport is a classical field of paired comparison-based ranking, early works were often inspired by chess tournaments (Landau, 1895, 1914; Zermelo, 1929). In the paper we deal with ranking in Swiss system chess team tournaments. This issue were partly discussed by Csató (2013), here a deeper methodological foundation will be given for the problem and the evaluation of rankings will be revisited. However, we do not discuss the issue of pairing in Swiss system tournaments.

The paper considers a parametric family of scoring methods, the generalized row sum (Chebotarev, 1989, 1994) as well as the least squares method. We do not know any application of the former procedure, while the latter was extensively used for sport rankings (Leeflang and van Praag, 1971; Stefani, 1980). Our analysis is based on some recent results: González-Díaz et al. (2014) have presented the axiomatic properties of generalized row sum and least squares, Csató (2014a) has given an interpretation for the least squares method, and Can (2014) has contributed to the choice of distance functions between rankings. Brozos-Vázquez et al. (2010) argues for the use of recursive methods as a tie-breaking rule in Swiss system chess tournaments.

The paper is structured as follows. Section 2 shortly outlines the ranking problem, ranking methods and their relevant properties. Section 3 aims to incorporate Swiss system chess team tournaments into this framework. We present the main challenges of ranking in these type of tournaments, the features of individual and team competitions as well as the failures of official lexicographical orders.

The proposed model is applied in Section 4 to ranking the participants in the 2011 and 2013 European Team Chess Championship open tournaments. We introduce twelve rankings distinguished by the role of opponents and match versus table points. Rankings are compared on the basis of their distances and visualized with multidimensional scaling (MDS). Differences to official ranking are revealed by the decomposition of least squares method.

On the basis of these examples, we argue for the use of least squares method with a generalized result matrix favoring match points. The proposal is based on a lot of findings, variance with respect to the chosen results matrix as well as prediction accuracy, retrodictive performance (the ability to match the outcomes of matches already played) and robustness (stability of the ranking between two subsequent rounds).

Finally, Section 5 summarize our findings and review possible extensions of the model. Some results of the calculations are detailed in the Appendix. A reader familiar with ranking problems (González-Díaz et al., 2014; Csató, 2014a) may skip Section 2, and knowledge on Swiss system chess tournaments may save from the study of Subsection 3.1.

Most results mentioned above are our contribution. We do not know any formal discussion of ranking in Swiss system tournaments (suggestions by Brozos-Vázquez et al. (2010) are more or less based on intuition) together with investigations through examples, despite the latter was given, for instance, by Jeremic and Radojicic (2010), Csató (2012), and Csató (2013). MDS has been applied first for the comparison of rankings in Csató (2013). According to our knowledge, we are the first to use the weighted distance of Can (2014). Stability is also a new idea in the evaluation of Swiss system tournament rankings.

2 The ranking problem and its solution

In the following a model of paired comparison-based ranking is presented. It is a simpler version of Csató (2014a), a detailed derivation can be found there.

2.1 The ranking problem

Let $N = \{1, 2, ..., n\}$, $n \in \mathbb{N}$ be a set of objects. The matches matrix $M = (m_{ij}) \in \mathbb{N}^{n \times n}$ contains the number of comparisons between the objects, and is symmetric $(M^{\top} = M)^{1}$. Diagonal elements m_{ii} are supposed to be 0 for all i = 1, 2, ..., n, anyway they will not be used. Let $d_i = \sum_{j=1}^{n} m_{ij}$ be the total number of comparisons of object i and $\mathfrak{d} = \max\{d_i : i \in N\}$ be the maximal number of comparisons with the other objects. Let $m = \max\{m_{ij} : i, j \in N\}$.

The results matrix $R = (r_{ij}) \in \mathbb{R}^{n \times n}$ contains the outcome of comparisons between the objects, and is skew-symmetric $(R^{\top} = -R)$. All elements are limited by $r_{ij} \in [-m_{ij}, m_{ij}]$. $(r_{ij} + m_{ij})/(2m_{ij}) \in [0, 1]$ may be regarded as the likelihood that object i defeats j. Then $r_{ij} = m_{ij}$ means that i is perfectly better than j, and $r_{ij} = 0$ corresponds to an undefined relation (if $m_{ij} = 0$) or the lack of preference (if $m_{ij} > 0$) between the two objects. A ranking problem is given by the triplet (N, R, M). Let \mathcal{R} be the class of ranking problems and \mathcal{R}^n be the class of ranking problems with |N| = n.

A ranking problem is called round-robin if $m_{ij} = 1$ for all $i \neq j$, that is, every object has been compared exactly once with all of the others. A round-robin ranking problem is more general than the binary tournaments of Rubinstein (1980) as it allows for ties $(r_{ij} = r_{ji} = 0)$ and arbitrary preference intensities $(r_{ij}$ is not necessarily -1 or 1). A ranking problem is called unweighted if $m_{ij} \in \{0,1\}$ for all $i \neq j$, namely, every paired comparison is carried out at most once. A ranking problem is called balanced if $d_i = d_j$ for all $i, j = 1, 2, \ldots, n$, that is, every object has the same number of comparisons.

2.2 Ranking methods

Matches matrix M can be represented by an undirected multigraph G := (V, E) where vertex set V corresponds to the object set N, and the number of edges between objects i and j is equal to m_{ij} . The number of edges adjacent to i is the degree d_i of node i. A path from object k_1 to object k_t is a sequence of objects k_1, k_2, \ldots, k_t such that $m_{k_{\ell}k_{\ell+1}} > 0$ for all $\ell = 1, 2, \ldots, t-1$. Two vertices are connected if G contains a path between them. A graph is said to be connected if every pair of vertices is connected.

Graph G is called the *comparison multigraph* associated with the ranking problem (N, R, M), and is independent of the results of paired comparisons. The *Laplacian matrix* $L = (\ell_{ij}) \in \mathbb{R}^{n \times n}$ of graph G is given by $\ell_{ij} = -m_{ij}$ for all $i \neq j$ and $\ell_{ii} = d_i$ for all $i = 1, 2, \ldots, n$.

Vectors are denoted by bold fonts, and assumed to be column vectors. Let $\mathbf{e} \in \mathbb{R}^n$ be given by $e_i = 1$ for all i = 1, 2, ..., n and $I \in \mathbb{R}^{n \times n}$ be the matrix with $I_{ij} = 1$ for all i, j = 1, 2, ..., n.

A rating (scoring) method f is an $\mathbb{R}^n \to \mathbb{R}^n$ function, $f_i = f_i(N, R, M)$ is the rating of object i. It defines a ranking method by i weakly above j in the ranking problem (N, R, M)

¹ In most practical applications (including ours) the condition $m_{ij} \in \mathbb{N}$ means no restriction. Modification of the domain to \mathbb{R}_+ has no impact on the results but the discussion becomes more complicated. This generalization has some significance for example in the case of forecasting sport results when the latest comparisons give more information about the current form of a player.

if and only if $f_i(N, R, M) \ge f_j(N, R, M)$. Throughout the paper, the notions of rating and ranking methods will be used analogously since all ranking procedures discussed are based on rating vectors. Rating methods f^1 and f^2 are called *equivalent* if they result in the same ranking for any ranking problem (N, R, M).

Now we introduce some rating methods for a ranking problem $(N, R, M) \in \mathbb{R}^n$.

Definition 1. Row sum rating method: $\mathbf{s}: \mathbb{R}^n \to \mathbb{R}^n$ such that $\mathbf{s} = R\mathbf{e}$.

Row sum will also be referred to as scores, **s** is sometimes called the scores vector. It does not take the comparison structure into account.

The following parametric rating procedure was constructed axiomatically by Chebotarev (1989) and thoroughly analyzed in Chebotarev (1994).

Definition 2. Generalized row sum rating method:

 $\mathbf{x}(\varepsilon): \mathcal{R}^n \to \mathbb{R}^n$ such that $(I + \varepsilon L)\mathbf{x}(\varepsilon) = (1 + \varepsilon mn)\mathbf{s}$, where $\varepsilon > 0$ is a parameter.

It follows from the definition that $\lim_{\varepsilon\to 0} \mathbf{x}(\varepsilon) = \mathbf{s}$. Generalized row sum adjusts the standard scores of objects by accounting for the performance of objects compared with it, and so on. ε indicates the importance attributed to this correction.

In our model the outcome of paired comparisons is restricted by $-m \le r_{ij} \le m$ for all $i, j \in N$. Then we have some results about the choice of ε .

Definition 3. Reasonable choice of ε (Chebotarev, 1994, Proposition 5.1): Let $(N, R, M) \in \mathbb{R}^n$ be a ranking problem. The value of parameter ε of generalized row sum is reasonable if

$$0 < \varepsilon \le \frac{1}{m(n-2)}.$$

The reasonable upper bound of ε is 1/[m(n-2)].

 $n \geq 3$ can be assumed implicitly since the solution becomes trivial for n = 2.

Proposition 1. If ε is reasonable, then $-m(n-1) \le x_i(\varepsilon) \le m(n-1)$ for all $i \in N$.

Proof. See Chebotarev (1994, Property 13).

Note that $-m(n-1) \leq x_i(\varepsilon) \leq m(n-1)$ for all $i \in N$ in a round-robin ranking problem $(N, R, M) \in \mathbb{R}^n$.

Both the score and the generalized row sum ratings are well-defined and can be obtained from a system of linear equations for all ranking problems.

The subsequent method is well-known in a lot of fields, a review about its origin is given by González-Díaz et al. (2014) and Csató (2014a).

Definition 4. Least squares rating method: $\mathbf{q}: \mathcal{R}^n \to \mathbb{R}^n$ such that $L\mathbf{q} = \mathbf{s}$ and $\mathbf{e}^{\mathsf{T}}\mathbf{q} = 0$.

It has strong connections to generalized row sum.

Lemma 1. The least squares method is equivalent to the other limit of generalized row sum $(\varepsilon \to \infty)$, moreover, $\lim_{\varepsilon \to \infty} \mathbf{x}(\varepsilon) = mn\mathbf{q}$.

Proof. See Chebotarev and Shamis (1998, p. 326). $\varepsilon \to \infty$ means that expressions with a constant coefficient in the equation system $(I + \varepsilon L)\mathbf{x}(\varepsilon)(N, R, M) = (1 + \varepsilon mn)\mathbf{s}$ become negligible.

Proposition 2. The least squares rating \mathbf{q} is unique if and only if comparison multigraph G is connected.

Proof. In the unweighted case, see Bozóki et al. (2010, Theorem 4). The same theorem was proved by Kaiser and Serlin (1978, p. 426) in a different way.

The general weighted case is examined in Bozóki et al. (2014) and González-Díaz et al. (2014). Chebotarev and Shamis (1999, p. 220) mention this fact without further discussion. \Box

Proposition 2 causes no problem as in the case of an unconnected comparison multigraph we have independent ranking problems.

A graph-theoretic interpretation of the generalized row sum method is given by Shamis (1994). An iterative decomposition of least squares is provided by Csató (2014a).

Proposition 3. Let the comparison multigraph be connected and not regular bipartite. The unique solution of the least squares problem is $\mathbf{q} = \lim_{k \to \infty} \mathbf{q}^{(k)}$ where

$$\mathbf{q}^{(0)} = (1/\mathfrak{d})\mathbf{s},$$

$$\mathbf{q}^{(k)} = \mathbf{q}^{(k-1)} + \frac{1}{\mathfrak{d}} \left[\frac{1}{\mathfrak{d}} (\mathfrak{d}I - L) \right]^k \mathbf{s} \quad (k = 1, 2, \dots).$$

2.3 Some properties of ranking methods

In order to argue for the use of these methods we need to discuss a number of axioms.

Definition 5. Admissible transformation of the results (Csató, 2014b): Let $(N, R, M) \in \mathbb{R}^n$ be a ranking problem. An admissible transformation of the results provides a ranking problem $(N, kR, M) \in \mathbb{R}^n$ such that k > 0, $k \in \mathbb{R}$ and $ka_{ij} \in [-m_{ij}, m_{ij}]$ for all $i \in N$.

Multiplier k cannot be too large since $-m_{ij} \leq kr_{ij} \leq m_{ij}$ should be satisfied for all $i \in N$ according to the definition of the results matrix. $k \leq 1$ is always allowed.

Definition 6. Scale invariance (SI) (Csató, 2014b): Let $(N, R, M), (N, kR, M) \in \mathbb{R}^n$ be two ranking problems such that (N, kR, M) is obtained from (N, R, M) through an admissible transformation of the results. Scoring procedure $f : \mathbb{R}^n \to \mathbb{R}^n$ is scale invariant if $f_i(N, R, M) \geq f_i(N, R, M) \leq f_i(N, kR, M) \geq f_i(N, kR, M)$ for all $i, j \in N$.

Scale invariance implies that the ranking is invariant to a proportional modification of wins $(r_{ij} > 0)$ and losses $(r_{ij} < 0)$. It seems to be important for applications. If the paired comparison outcomes cannot be measured on a continuous scale, it is not trivial how to transform them into r_{ij} values. SI provides that it is not a problem in several cases. For example, if only three outcomes are possible, the coding $(r_{ij} = \kappa \text{ for wins}; r_{ij} = 0 \text{ for draws}; r_{ij} = -\kappa \text{ for losses})$ makes the ranking independent from $\kappa > 0$. It may also be advantageous when relative intensities are known such as a regular win is two times better than an overtime triumph.

Lemma 2. The score, generalized row sum and least squares methods satisfy SI.

Proof. See Csató (2014b, Lemma 4.3). It is the immediate consequence of $\mathbf{s}(N, kR, M) = k\mathbf{s}(N, R, M)$.

One disadvantage of the score procedure is that it is independent of irrelevant matches (González-Díaz et al., 2014). However, it does not cause problems on the class of roundrobin ranking problems, so it makes sense to preserve the attributes of score on this set.

Definition 7. Score consistency (SCC) (González-Díaz et al., 2014): Scoring procedure $f: \mathbb{R}^n \to \mathbb{R}^n$ is score consistent if $f_i(N, R, M) \geq f_j(N, R, M) \Leftrightarrow s_i(N, R, M) \geq s_j(N, R, M)$ for all $i, j \in N$ and round-robin ranking problem $(N, R, M) \in \mathbb{R}^n$.

A score consistent method is equivalent to the score in the case of round-robin ranking problems. A similar requirement is mentioned by Zermelo (1929) and David (1987, Property 3).

Remark 1. Regarding the generalized row sum method, Chebotarev (1994, Property 3) introduces a more general axiom called agreement: if $(N, R, M) \in \mathcal{R}^n$ is a round-robin ranking problem, then $\mathbf{x}(\varepsilon)(N, R, M) = \mathbf{s}(N, R, M)$.

Lemma 3. Score, generalized row sum and least squares methods satisfy SCC.

Proof. For generalized row sum see Remark 1. In the case of least squares the proof is given by González-Díaz et al. (2014, Proposition 5.3).

Further properties of the scoring procedures are discussed by González-Díaz et al. (2014) and Csató (2014b).

3 Modelling of the problem

Now we are able to discuss ranking in Swiss system chess competitions in the framework presented above.

3.1 Main features of Swiss system chess tournaments

Chess tournaments are often organized in the Swiss system. They go for a predetermined number of rounds, in each round two players compete head-to-head. All of them participate in the entire tournament, none are eliminated. The system is used when there are too many players to play a round-robin tournament consequently there are pairs of players without a match between them. However, it is more efficient than a knock-out tournament as more matches can be played at the same time.

Two emerging issues are how to pair the players and how to rank the participants on the basis of their respective results. The pairing algorithm aims to pair players with a similar performance as measured by the number of their wins and draws (see FIDE (2014) for details). Some proposals have been made to improve them by weighted (Ólafsson, 1990) or stable matchings (Kujansuu et al., 1999) but it is out of the scope of this paper.

A match in chess can have three different results: white wins, black wins or draw. The winner gets one point, the loser gets zero points, a draw means half-half points for both players. There are some competitions where a win results in three points and a draw in one point, however, they not fit into our model since then the number of allocated points depends on the result, a win and a loss is not equal to two draws, which violates the skew-symmetricity of the results matrix.

Let us denote the number of rounds by c and the number of players by n.

The final ranking of the players is determined by lexicographical orders such that the first rule is the number of points scored. However, it is usually not enough to get a linear order (complete, transitive and antisymmetric binary relation) of the participants: in c rounds the number of points is an integer between 0 and 2c so there always will be players with equal score if n > 2c + 1. Ties are eliminated by the sequential application of various tie-breaking rules (FIDE, 2014).

The difficulties in ranking are caused by different schedules as players with weaker opponents can score the same number of points more easily. A pairing algorithm based on the concept above and lexicographical orders are not able to solve this problem (Csató, 2012, 2013; Brozos-Vázquez et al., 2010; Jeremic and Radojicic, 2010). Actually, it prefers players with an improving performance during the tournament contrary to players with a declining one. Take two players i and j with equal number of points after playing some rounds. Player i is said to on the inner circle if it scored more points in the first rounds relative to player j who is said to be on the *outer circle*. Since they have played against opponents with a similar number of points in each round because of the pairing algorithm, it is probable that player j has met with weaker opponents. Tie-breaking rules may take the performance of opponents into account but a similar problem may arise if player j has a bit more points than player i as a lexicographical order is not continuous. Naturally, it is not a precise mathematical argument, although we hope it highlights the main problem with official rankings. It can be argued that an improving performance is better than a declining one, however, it contains a subjective judgment strange to the positive approach of scientific research.

besides individual competitions, there are also team tournaments in chess. They seem to be preferable from a theoretical point of view since in individual championships color allocation has a prominent role, the first-mover with white have an inherent advantage in the game. In team tournaments a match is played on 2t boards such that t players of a team play with white and the other t players of the team play with black. Therefore it can be accepted that color allocation does not influence the outcome of any matches.

In team championships there is a difference between board points and match points scored. The winner of a game on a board gets 1 board point, the loser 0 points, and the draw yields 0.5 points for both teams, thus 2t board points are allocated in a given match. The winner team achieving more (at least t + 0.5) board points scores 2 match points, the loser 0, while a draw results in 1 match point for both team. Lexicographical orders are usually based on the number of board or match points. Recently the use of match points is preferred as in chess olympiads and team European championships.

Other details on Swiss-system chess team tournaments can be found in Csató (2012, 2013).

3.2 Definition as a ranking problem

Paired comparison-based ranking of the objects involves three main challenges. The first one is the possible appearance of *circular triads* when object i is better than object j ($r_{ij} > r_{ji}$), object j is better than object k, but object k is better than object i. Circular triads generate difficulties in all paired comparison settings, but, if preference intensities also count, other triplets may cause a problem. The second issue, the *varied calibre of the opposition* encountered by each object, arises as the consequence of incomplete and multiple comparisons. For example, if object i was compared only with object j, then its rating certainly should depend on the results of object j. We have seen that this

argument can be continued infinitely. The third problem is the possibly different numbers of comparisons involving the objects, that is, $d_i \neq d_i$.

According to David (1987), 'it must be realized that there can be no entirely satisfactory way of ranking if the number of replications of each object varies appreciably'. In Swiss system competitions this question does not emerge. The other two will be dealt with the methods presented in Section 2, after any chess team tournament is presented as a ranking problem. Since data are given by sport results, we do not discuss the question whether inherent inconsistency allows to provide a meaningful ranking (Jiang et al., 2011).

Set of objects N consists of the teams of the competition. Matches matrix M is given by $m_{ij} = 1$ if teams i and j have played against each other and $m_{ij} = 0$ otherwise. For the sake of simplicity it is assumed that n is even, so it is possible that all teams play exactly c matches (there are no byes or unplayed matches). First we suggest two extreme possibilities for the choice of results matrix.

Notation 1. MP_{ij} and BP_{ij} is the number of match points and board points of team i against team j, respectively.

mp and **gp** is the vector of match points and board points, respectively.

Rankings derived from **mp** and **bp** are the same as the official lexicographical orders based on match points and board points without tie-breaking rules.

Definition 8. Match points based results matrix: Results matrix of ranking problem $(N, R^{MP}, M) \in \mathbb{R}^n$ is based on match points if $r_{ij}^{MP} = MP_{ij} - 1$ for all $i, j \in N$.

Definition 9. Board points based results matrix: Results matrix of ranking problem $(N, R^{BP}, M) \in \mathcal{R}^n$ is based on board points if $r_{ij}^{BP} = BP_{ij} - t$ for all $i, j \in N$.

The two concepts can be integrated.

Definition 10. Generalized results matrix: Results matrix of ranking problem $(N, R^P(\lambda), M) \in \mathcal{R}^n$ is generalized if $r_{ij}^P(\lambda) = (1 - \lambda)(MP_{ij} - 1) + \lambda(BP_{ij} - t)/t$ for all $i, j \in N$ such that $\lambda \in [0, 1]$.

Lemma 4.
$$R^{P}(\lambda = 0) = R^{MP}$$
 and $R^{P}(\lambda = 1) = R^{BP}$.

Ranking according to the score procedure are closely related to the official rankings.

Lemma 5. Score method on R^{MP} is equivalent to mp.

Proof.
$$d_i = c$$
 for all $i \in N$, hence $\mathbf{s}(N, R^{MP}, M) = \mathbf{mp} - c\mathbf{e}$.

Lemma 6. Score method on R^{BP} is equivalent to bp.

Proof.
$$d_i = c$$
 for all $i \in N$, hence $\mathbf{s}(N, R^{BP}, M) = \mathbf{bp} - ct\mathbf{e}$.

Our main result is the following.

Theorem 1. Let $(N, R, M) \in \mathbb{R}^n$ be a round-robin ranking problem. Generalized row sum and least squares methods on R^{MP} are equivalent to \mathbf{mp} , and on R^{BP} they are equivalent to \mathbf{bp} .

Proof. In case of round-robin problems, generalized row sum and least squares are equivalent to the score method due to axiom SCC (Lemma 3), hence Lemmata 5 and 6 provide the result.

Generalized row sum and least squares methods address the lack of matches by accounting for the opponents of each team. Due to Theorem 1, they result in the official ranking without tie-breaking rules in the ideal round-robin case. When the lexicographical order is based on match points, the transformation R^{MP} is recommended. Generalized results matrix with a small (i.e. close to 0) parameter λ gives a similar outcome but it reflects the number of board points, the magnitude of wins and losses. This effect becomes more significant as λ increases and R^{BP} extends the ranking based on board points to Swiss system competitions.

Proposition 4. Let $(N, R, M) \in \mathcal{R}^n$ be a ranking problem, and $k \in (0, 1]$. Rankings derived from generalized row sum and least squares methods on R^{MP} and kR^{MP} , on R^{BP} and kR^{BP} as well as on $R^P(\lambda)$ and $kR^P(\lambda)$ are the same.

Proof. It is the consequence of property SI (Lemma 1).

Proposition 4 implies that there exists only one ranking on the basis of match points after accepting that wins are more valuable than losses. Analogously there exists a unique ranking based on board points. In the lack of scale invariance the ranking may depend on the results matrix chosen such as wins are represented by $r_{ij} = 0.5$ or $r_{ij} = 1$, for example.

We have also investigated the meaning of some other properties discussed in González-Díaz et al. (2014) for Swiss-system chess team tournaments. The short conclusion is that they support the use of generalized row sum and least squares.

These methods use all information of the tournament (about the opponents, opponents of opponents and so on) to break the ties. Therefore it is very unlikely that teams remain tied after applying generalized row sum or least squares, unless the tied teams have exactly the same opponents and in such a case it seems reasonable do not break the tie. No need for arbitrary tie-breaking rules is certainly an advantage compared to lexicographical orders.

4 Application: European chess team championships

In the following we will scrutinize the theoretical model suggested in Section 3 in practice.

4.1 Examples and implementation

We illustrate the method proposed in Section 3 with an extensive analysis of two chess team tournaments:

• 18th European Team Chess Championship (ETCC) open tournament, 3rd-11th November 2011, Porto Carras, Greece.

Webpage: http://euro2011.chessdom.com/

Tournament rules: ECU (2012)

Detailed results: http://chess-results.com/tnr57856.aspx

• 19th European Team Chess Championship open tournament, 7th-18th November 2013, Warsaw, Poland.

Webpage: http://etcc2013.com/ Tournament rules: ECU (2013)

Detailed results: http://chess-results.com/tnr114411.aspx

In both tournaments the number of competing teams is n=38 playing on t=4 tables during c=9 rounds. Results are known for about the quarter of possible pairs, $9 \times 19 = 171$ from n(n-1)/2 = 703.

Number of board points achieved by the team in the corresponding row against the team in the corresponding column are presented in Tables A.1 (2011) and A.2 (2013) in the Appendix. At least 2.5 board points means a win, 2 means a draw, while at most 1.5 means a loss. Unplayed matches are indicated by –.

The first element of the official lexicographical order was the number of match points in both cases but tie-breaking rules were different. They certainly should be used since in 9 matches at most 18 match points can be achieved and the number of participants is 38. The first tie-breaking rule was number of board points in ETCC 2011 and Olympiad-Sonneborn-Berger points without lowest result (i.e. match points of each opponent, excluding the opponent who scored the lowest number of match points, multiplied by the number of game points achieved against this opponent) in ETCC 2013, therefore teams have had an incentive to achieve more points. It is especially relevant for middle teams. The pairing algorithm provides that a team scoring 9 wins will be the first, however, such a feat is almost impossible. To conclude, teams are interested in scoring more match points and board points, which count through the tie-breaking rules.²

In the 2013 competition application of the first tie-breaking rule (Olympiad-Sonneborn-Berger points) was enough, while in 2011 a second tie-breaking rule (aggregated board points of the opponents) should be used in some cases.

Tables A.3 (2011) and A.4 (2013) in the Appendix focus on match outcomes: \checkmark indicates a win for the team in the corresponding row, = and \checkmark indicate a draw and a loss, respectively. Match points aggregate them by giving 2 for wins, 1 for draws and 0 for losses. Teams are ordered according to the official ranking. Wins are usually above the diagonal and played matches tend to be placed close to the diagonal because of the concept of the pairing algorithm.

Distribution of match results for ETCC 2013 is drawn in Figure 1. Minimal victory (2.5 : 1.5) is the mode, so incorporating board points probably will not influence the rankings much.

We have two exogenous rankings called *Official* according to the tournament rules and *Start* based on Élő points of players, reflecting the past performance of team members. Further 12 rankings have been calculated from the ranking problem representation. Four results matrices have been considered: R^{MP} , $R^{MB} = R^P(1/4) = 3/4 R^{MP} + 1/4 R^{BP}$, $R^{BM} = R^P(2/3) = 1/3 R^{MP} + 2/3 R^{BP}$ and R^{BP} . We have chosen three methods, least squares (*LS*) and generalized row sum with $\varepsilon_1 = 1/324$ (*GRS*₁) and $\varepsilon_2 = 1/6$ (*GRS*₂). Note that ε_1 is smaller and ε_2 is larger than the reasonable upper bound of 1/36 when m = 1 and n = 38.

Existence of a unique least squares solution requires connectedness of the comparison multigraph (Proposition 2), which is provided after the third round. Rankings in the first two rounds are highly unreliable, therefore they were eliminated. From the third round all methods give one, thus we have $7 \times 13 + 1 = 92$ rankings as Start remains unchanged.

Notation 2. The 14 final rankings are denoted by Start, Official; $GRS_1(R^{MP})$, $GRS_1(R^{MB})$, $GRS_1(R^{BM})$, $GRS_1(R^{BP})$; $GRS_2(R^{MP})$, $GRS_2(R^{MB})$, $GRS_2(R^{BM})$, $GRS_2(R^{BP})$; and

² Sometimes leading teams can secure a prize by a draw in the final round or certain teams may lose their spirit to compete. These issues emerge in all sports, note that soccer teams in national competitions have usually weak incentives to win by a lot of goals.

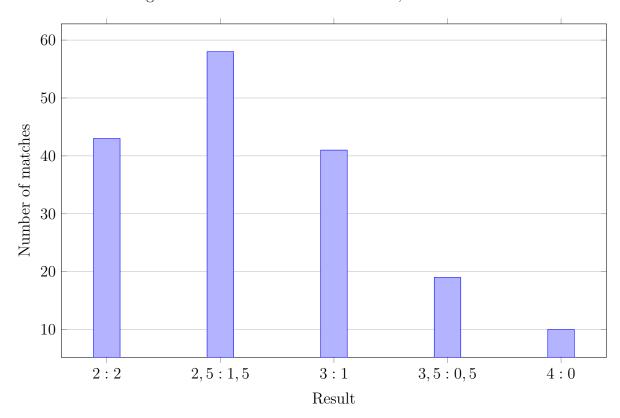


Figure 1: Distribution of match results, ETCC 2013

 $LS(R^{MP})$, $LS(R^{MB})$, $LS(R^{BM})$, $LS(R^{BP})$. In the figures they are abbreviated by Start, Off; G1, G2, G3, G4; S1, S2, S3, S4; and L1, L2, L3, L4, respectively.

Start and Official rankings are strict, that is, they do not allow for ties by definition. It can be checked that the other rankings also give a linear order of teams in all cases. Rankings by different methods are displayed in Tables A.5 (2011) and A.6 (2013) in the Appendix.

4.2 Visualisation of the rankings

For the comparison of final rankings their distances have been calculated. We have chosen the well-known $Kemeny\ distance\ (Kemeny, 1959)$ and its weighted version proposed by Can (2014). Both distances are defined on the domain of strict rankings, i.e. ties are not allowed. Our rankings satisfy this condition. Kemeny distance was characterized by Kemeny and Snell (1962), however, Can and Storcken (2013) achieved the same result without one condition. Can and Storcken (2013) also provides an extensive overview about the origin of this measure. It is the number of pair of alternatives ranked oppositely in the two rankings examined. For instance, Kemeny distance of $a \succ b \succ c$ and $b \succ a \succ c$ is 1, because they only disagree on how to order a and b. Similarly, Kemeny distance of $a \succ b \succ c$ and $a \succ c \succ b$ is 1 since the disagreement on how to order b and c.

Thus the dissimilarity between the former two and between the latter two seems to be identical according to the Kemeny distance. However, in our chess example a disagreement at the top of the rankings may be more significant than a disagreement at the bottom of them: the audience is interested in the first three, five or ten places but people are not bothered much whether a team is the 31th or 34th. For this purpose, Can (2014) proposes some functions on strict rankings in the spirit of Kemeny metric, which are

respectful to the number of swaps but allow for variation in the treatment of different pairs of disagreements.

It has some price since the calculation will depend on the order of swaps between the two rankings. Can (2012, Theorem 1) shows that only the path-minimizing function satisfies the triangular inequality condition for all possible weight vectors. Finding the path-minimizing metric is not trivial, it is equivalent to solving a short-path problem. A way out is that if weights are monotonically decreasing (increasing) from the upper parts of a ranking to the lower parts, then the Lehmer function (the inverse Lehmer function) is equivalent to the path-minimizing metric (Can, 2014, Corollaries 1 and 2).

These results have inspired us to choose a monotonically decreasing weight vector meaning that swaps in the first places are more important than changes at the bottom of the rankings. Our weight vector is given by $\omega_i = 1/i$ for all i = 1, 2, ..., n-1. Then the distance between a > b > c and b > a > c is 1 (a swap at the first position), while the distance between a > b > c and a > c > b is 1/2 (a swap at the second position). The measure reaches its maximum of n-1 if and only if the two rankings are entirely opposite. We do not know about any other application of Can (2014)'s novel method.

Distances of rankings of ETCC 2011 competition is presented in Table A.7 in the Appendix. All Kemeny distances are significantly smaller than its maximum of n(n-1)/2 = 703 for entirely opposite rankings. Largest values usually occur in comparison with Start since it is not influenced by the results. However, rankings based on match points and board points are also relatively far from each other. Official coincides with $GRS_1(R^{MB})$.

Weighted distances are presented in Table A.7.b. Its maximum is n-1=37. Ratio of Kemeny and weighted distances are between 8.73 and 17.44 for ETCC 2011, and between 5.81 and 18.73 for ETCC 2013. In the second case accounting for swaps' positions has a larger effect but the discrepancy of the two distances remains smaller than expected. It implies that variations are more or less equally distributed along the rankings.

It is worth to note here that $GRS_1(R^{\tilde{M}P})$ means a kind of tie-breaking rule for match points both in ETCC 2011 and ETCC 2013. If $\varepsilon = 0$ then generalized row sum gives the ranking of match points, while a small ε ranks tied teams by the strength of their opponents. Official method also aims to eliminate ties, it uses a different approach though.

Table A.7 gives some information, however, it does not much simplify the comparison of the rankings. We want to achieve this by a graphical representation. The pairwise distances of 14 rankings can be plotted in a 13-dimensional space without loss of information but it still seems to be unmanageable. Therefore, similarly to Csató (2013), multidimensional scaling (Kruskal and Wish, 1978) have been applied. It is a statistical method in information visualization for exploring similarities or dissimilarities in data: a textbook application of MDS is to draw cities on a map from the matrix consisting of their air distances.

Kemeny and weighted distances mean a ratio scale due to the existence of a natural minimum and maximum. Then discrepancies of the reduced dimensional map are linear functions of the original distances. Both Stress and RSQ tests for validity strengthen that two dimensions are sufficient to plot the 14 rankings, but one is too restrictive. The method gives a map where only the position of objects count, more similar rankings are closer to each other. Only the distances of points representing the rankings yield information, we do not know what is the meaning of the axes.³

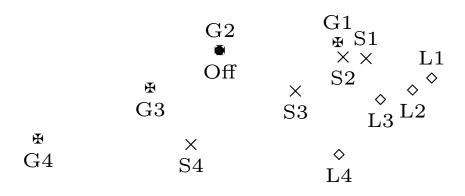
Figure 2 shows MDS maps for the 2011 tournament. Figure 2.a supports the view that Start is far away from all other rankings, thus it is omitted from further analysis (which improves the mapping, too).

³ Note the change of direction of the vertical axis on Figures 2 and 3.

Figure 2: MDS maps of the European Team Chess Championship 2011 rankings

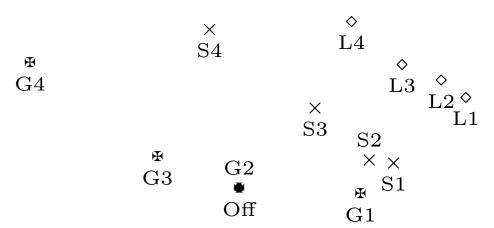
Official ranking (Off) is the same as one from generalized row sum (G2), their distances are zero. There is a minimal difference between the coordinates of corresponding points, probably due to computational errors.

(a) Kemeny distance, with Start



Start

(b) Kemeny distance, without Start

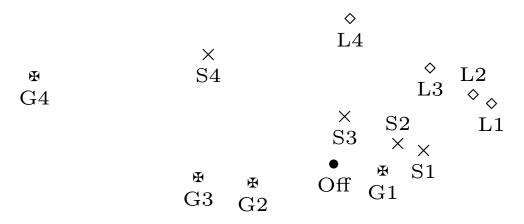


There is not much difference between the four charts (ETCC 2011 vs. 2013, Kemeny vs. weighted distances) as Figure 3 is similar to Figure 2.b. MDS maps of ETCC 2013 an Kemeny distances have more favorable validity measures than MDS maps of ETCC 2011 and weighted distances. They suggest the following:

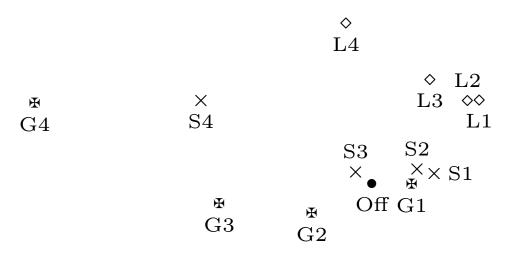
1. Start significantly differs from the other rankings since it does not depend on the

Figure 3: MDS maps of the European Team Chess Championship 2013 rankings

(a) Kemeny distance, without Start



(b) Weighted distance, without Start



results of the tournament;

- 2. Generalized row sum rankings (with low λ) are more similar to the official one than least squares;
- 3. The order of results matrices by variance is $R^{MP} < R^{MB} < R^{BM} < R^{BP}$, a greater role of match points stabilize the rankings;
- 4. The order of scoring procedures by variance is $LS < GRS_2 < GRS_1$, a greater role of opponents stabilize the rankings.
- 5. Choice of tie-breaking rule for match points has a surprisingly large effect, especially in the case of ETCC 2011 as rankings Off and G1 are relatively far from each other.

On the basis of these observations, we propose to use least squares with a generalized results matrix favoring match points (a low λ , for example, 1/4 as in R^{MB}) for ranking in Swiss-system chess team tournaments as it gives incentives for teams to score more board points but still prefers match points against them.

4.3 Analysis of a ranking

Another approach to compare the rankings is offered by the decomposition of the least squares rating (Csató, 2014a). The ranking problem is balanced, the comparison multigraph is regular. Therefore it gives a ranking according to \mathbf{mp} (the official ranking without the application of tie-breaking rules) in the zeroth step ($\mathbf{q}^{(0)}$) as Proposition 3 states. After that, it reflects the strength of neighbors, neighbors of neighbors and so on by accounting for their average match points since $\mathfrak{d}I - L = M$. Ranking according to $\mathbf{q}(R^{MP})$ is obtained after the seventh (from $\mathbf{q}^{(7)}(R^{MP})$) and after the twelfth step (from $\mathbf{q}^{(12)}(R^{MP})$) for ETCC 2011 and ETCC 2013, respectively.

Table 1 shows the changes of teams' positions in each step of the iterative decomposition of the ranking $LS(R^{MP})$ for ETCC 2013. In the second column ties are broken according to the official rules, so it coincides with the official ranking. In subsequent steps there are no ties. Position improvements and declines are indicated by the \uparrow and \downarrow arrows, respectively. Lack of change is indicated by \neg .

Correction according to neighbors' strength results in seven positions improvement for Slovenia together with a four positions decline for Romania and six for Netherlands. Hence Slovenia overtakes Netherlands despite it has a two match points disadvantage. Official tie-breaking rule TB4 (number of board points of the opponents) shows a similar direction of adjustment. Subsequent steps of the iteration usually lead to a similar sign of change in positions, however, in a more moderated extent. A notable exception is Romania, which regains some positions due to indirect opponents. Monotonicity of absolute adjustments are violated only by Lithuania.

There are two changes among the top six teams. After k=2 France becomes the winner of the tournament instead of Azerbaijan. It can be debated since the latter team has no loss, however, the schedule of France was more difficult. The swap of Russia and Armenia may be explained by the advance on an outer circle of the former team. Note the lack of match between Azerbaijan and Russia (Table A.4).

The last change is a swap of Turkey and Montenegro in the twelfth step of the iteration. As it was mentioned, least squares method is not only a tie-breaking rule for match points (contrary to generalized row sum with $\varepsilon = 1/324$), it makes possible that a team overtakes another one despite its disadvantage of two match points.

Imperfection of the official ranking is highlighted by ETCC 2011, for which Table A.8 in the Appendix contains the positional changes according to the iterative decomposition of $LS(R^{MP})$. Here France scored three wins and three draws in the first six rounds but it has been defeated in the last three matches. It is an extreme example of advance on an inner circle, France has had a more challenging schedule compared to teams with the same number of match points. It is reflected in the significant adjustment by the least squares method. On the other side, Serbia loses nine, and Georgia loses 14 positions. They had luck with the opponents, for example, Georgia had not played against a better team according to the official ranking. We think it is a surprising fact for a team at the 13th place. You can also see that both Serbia and Georgia significantly benefits from decreasing ε or increasing the role of board points.

The strange phenomenon is also remarked by a Hungarian commentator who speaks about 'the curse of the Swiss system'. However, we think it is not necessarily the mistake of Swiss system rather a failure of the official ranking, which can be improved significantly

 $^{^4~{}m See}~{
m at~http://sakkblog.postr.hu/sokan-palyaznak-dobogos-helyezesre-izgalmas-utolsofordulo-dont.}$

Table 1: Positional changes in decomposition of the ranking $LS(\mathbb{R}^{MP})$, ETCC 2013

Team	Off (0)	1	2	3	4	5	6	9	12	Cumulated	LS (∞)
Azerbaijan	1	_	Ψ	_	_	_	_	_	_	4	2
France	2	_	1	_	_	_	_	_	_	↑	1
Russia	3	Ψ	_	_	_	_	_	_	_	4	4
Armenia	4	1	_	_	_	_	_	_	_	↑	3
Hungary	5	_	_	_	_	_	_	_	_	_	5
Georgia	6	-	_	_	_	_	_	_	_	-	6
Greece	7	_	_	_	_	_	1	_	_	4	8
Czech Rep.	8	4	T	_	_	_	_	_	_	11	10
Ukraine	9	↑	_	_	_	_	1	_	_	个 个	7
England	10	-	1	_	_	_	_	_	_	↑	9
Netherlands	11	↓ (6)	_	_	_	_	_	_	_	↓ (6)	17
Italy	12	1	_	_	_	1	_	_	_	<u> </u>	12
Serbia	13	111	44	_	_	\downarrow	_	_	_	↓ (6)	19
Romania	14	↓ (4)	个个	_	1	_	_	_	_	J	15
Belarus	15	个个个	_	_	_	1	_	_	_	↑ (4)	11
Poland	16	个个个	_	_	_	1	_	_	_	个个	14
Croatia	17	个个	_	_	1	_	_	_	_	1	16
Montenegro	18	4	_	1	_	_	_	_	\downarrow	111	21
Spain	19	1 1	_	_	_	_	1	_	_	111	22
Germany	20	-	_	1	_	1	_	_	_	个 个	18
Slovenia	21	1 (7)	_	_	_	1	_	_	_	1 (8)	13
Poland Futures	22	1	_	1	_	1	_	_	_	↓ (4)	26
Lithuania	23	$\downarrow \downarrow$	↓ (4)	-	-	-	1	_	_	↓ (7)	30
Turkey	24	个个	_	_	_	_	1	_	1	1 (4)	20
Bulgaria	25	个个	_	_	-	-	_	_	_	1	23
Sweden	26	1	_	1	-	-	_	_	_	11	28
Denmark	27	111	4	_	_	_	_	↓	_	↓ (5)	32
Israel	28	个个	1	1	-	-	_	_	_	1 (4)	24
Iceland	29	111	_	-	-	-	_	1	_	11	31
Austria	30	个个	个个	_	_	1	_	_	_	1 (5)	25
Poland Goldies	31	_	1	_	_	_	1	_	_	个 个	29
Switzerland	32	个个个	↑	1	-	-	-	_	_	↑ (5)	27
Belgium	33	-	_	↓	_	_	_	_	_	J	34
Finland	34	-	_	1	-	-	-	_	_	↑	33
Norway	35	_	_	-	-	-	-	-	_	_	35
Scotland	36	_	_	_	_	_	_	_	_	_	36
FYR Macedonia	37	_	_	_	-	-	-	_	_	_	37
Wales	38	-	_	_	_	_	_	_	_	_	38

by accounting for the strength of opponents.

4.4 Assessment of the rankings

For evaluating the 14 rankings, three approaches have been applied:

• Predictive performance: ability to forecast the outcomes of future matches;

- Retrodictive performance: ability to match the results of contests already played;
- Robustness between subsequent rounds.

The first two are the proposals of Pasteur (2010) for the classification of mathematical ranking models. The third seems to be important because of (at least) two causes. First, both the participants and the audience feel strange if the positions of teams are not stable, they are largely determined by a certain match result. Naturally, extreme stability is not favorable, too, but it is usually not a problem in a Swiss system tournament. The second argument for robustness is that the number of rounds is often determined arbitrarily, for instance, it was 13 in the 2006 and 11 in the 2013 chess olympiads with 148 and 146 teams, respectively.

The first two have been measured by the number of match and board points scored by an underdog against a better team. It does not take into account the difference of positions, only its sign. Some results are presented in the Appendix. They are qualitatively equivalent, the methods applied behave similarly in all cases.

Figure A.1 shows the number of match and board points scored by a weaker opponent in later rounds according to the appropriate ranking after each round. It can be calculated from the third round when the least squares ranking is unique. Start has the most favorable forecasting performance, especially in the first rounds, match outcomes are determined by teams' ability rather than by their results in the competition. As Figure A.2 reveals, there is no difference among the methods in forecasting power if only the next round is scrutinized, too.

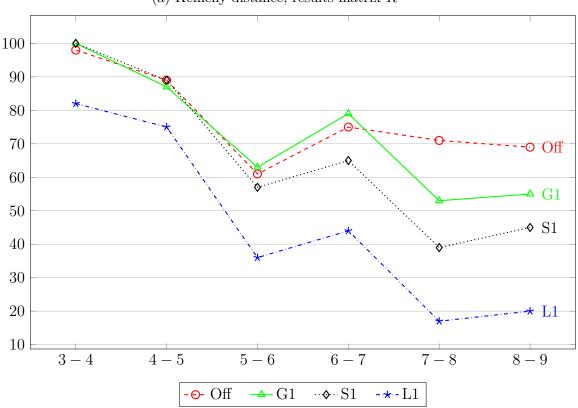
Forecasting can be regarded as out-of-sample fit. Another approach is how a ranking describes the results of matches already played, that is, in-sample fit. Figure A.3 shows the number of match and board points in earlier rounds scored by a weaker opponent according to the appropriate ranking after each round. It is calculated from the third round, however, it has a meaning after the last round when forecasting power is not defined. Least squares method has the best retrodictive performance but it remains dubious whether it is statistically significant. Generalized row sum is placed between the least squares and official rankings. Choice of the results matrix and the tournament does not influence these findings.

Stability has been defined as the distance of rankings in subsequent rounds. It has no meaning for Start but can be calculated for all other rankings from the third round. Figure 4 illustrates the robustness of some rankings in ETCC 2011. Volatility is not monotonically decreasing, however, a stable decline is observed as the actual round gives relatively fewer and fewer information. Ranking $LS(R^{MP})$ is the most robust according to both definitions of the distance, which is followed by $GRS_2(R^{MP})$, then $GRS_1(R^{MP})$ and Official. Therefore rankings become less volatile by taking into account the performance of opponents. Difference of absolute values is more significant in the case of weighted distance, the least squares method is more robust in the first, critical places. The order $LS < GRS_2 < GRS_1$ is valid for other result matrices R^{MB} , R^{BM} and R^{BP} , however, GRS_1 is sometimes worse than the official ranking.

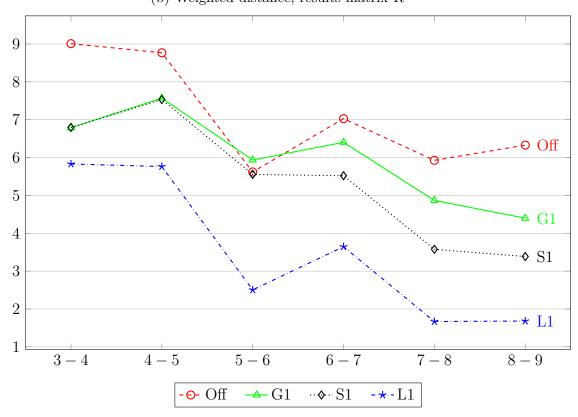
Results for ETCC 2013 are presented on Figure A.4 in the Appendix. Now the conclusions are more uncertain but least squares is the most stable with the exception of first rounds. To summarize, application of the least squares method is recommended if the organizers want to mitigate the effects of the (predetermined) number of rounds on the ranking.

Figure 4: Stability between rounds, ETCC 2011

(a) Kemeny distance, results matrix ${\cal R}^{MP}$



(b) Weighted distance, results matrix ${\cal R}^{MP}$



5 Discussion

The paper has given an axiomatic analysis of ranking in Swiss system chess team tournaments. We have applied the paired-comparison based ranking methodology in order to build an appropriate model for these competitions, which reveals the failure of official lexicographical rankings. The framework is flexible with respect to the role of the opponents (parameter ε) and the influence of match and board points (choice of the results matrix). The main theoretical advantages of the methods proposed are that they are close to the concept of official rankings (in fact they coincide in the case of round-robin tournaments), can be calculated iteratively or by solving a system of linear equations and have a clear interpretation on the comparison multigraph. They also do not call for arbitrary tie-breaking rules.

It is tested on the results of the 2011 and 2013 European Team Chess Championship open tournaments. Our observations support the use of least squares method. However, it is an opportunity to take into account the number of board points scored by a generalized results matrix favoring match points (small λ close to zero). The findings suggest that official lexicographical orders have significant disadvantages, and recursive methods similar to generalized row sum and least squares are worth to consider for ranking purposes. Brozos-Vázquez et al. (2010) recommend them as tie-breaking rules in Swiss system tournaments, achievable by the choice of a small ε . Brozos-Vázquez et al. (2010) summarizes their favorable properties as using all available information of the tournament to break the ties and that it is difficult players remain tied after their application.

We have presented that the idea of recursive methods can be extended and they can serve not only as a tie-breaking rule but as a unique ranking procedure. In this case the ranking will be less dependent on the designation of table or board points for the benchmark (actually, middle paths can be chosen), and will be more robust with respect to new results, increasing the reliability of the final ranking. These advantages over lexicographical methods are far less significant if generalized row sum is only used for tie-breaking with a small ε .

Brozos-Vázquez et al. (2010) list three main disadvantages of recursive tie-breaking methods:

- Lot of people criticizes the fact that a computer is needed in order to calculate the tie-break in the tournament.
- In the same lines, it is also criticized that it will be difficult for the players to verify (and understand) the tie-breaks at the end of the tournament.
- Up to 4 or 5 rounds might be needed for the methods to be convergent. Hence, intermediate standings prior to that round cannot incorporate the tie-break.

According to our view, the third point does not mean such a serious problem since rankings in the first rounds are obviously not reliable and other tie-breaking rules may be applied, e.g. Élő points. In the tournaments examined, connectedness of the comparison multigraph is provided after the third round. We have also seen that the rankings after one or two iteration steps are not very far from the final ranking and they can be calculated by hand. Naturally, the least squares method is a bit more complicated than usual tie-breaking rules but its graph interpretation (Csató, 2014a) and its core concept close to Buchholz helps in the understanding. Anyway, there usually exists a trade-off between simplicity and other favorable properties (like sample fit, robustness), and we think it is worth to

use more developed methods in the case of Swiss system tournaments in order to avoid anomalies of the ranking.⁵

There are some plausible area of further research. In the analysis we have neglected some complications observed in practice like matches played with black or white (an unavoidable issue in individual tournaments) or different number of matches due to byes or unplayed games. The choice of parameter ε also requires further investigation. Our findings can be strengthened or falsified by the examination of other competitions and some simulations of Swiss system tournaments.

Finally we mention two possible use of the proposed ranking method. First, it can be incorporated into the pairing algorithm, which may lead to more balanced schedules. Second, extensive analysis of the stability of a ranking between subsequent rounds may contribute to the choice of the number of rounds: it can be made endogenous as a function of the number of participants and other restrictions.

Acknowledgements

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⁵ An excellent example is Georgia's 13th place in ETCC 2011 such that it have not played any teams better according to the official ranking.

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Appendix

Table A.1: Results of the European Team Chess Championship open tournament 2011

	Armenia	Austria	Azerbaijan	Bulgaria	Croatia	Cyprus	Czech Rep.	Denmark	England	Finland	France	FYROM	Georgia	Germany	Greece	Hungary	Iceland	Israel	Italy
Armenia		3.5	1	-	3	_	-	3.5	2	_	2.5	_	-	1.5	-	_	-	_	_
Austria	0.5		_	_	_	-	_	2	_	2.5	_	-	2	_	_	-	_	-	_
Azerbaijan	3	_		3.5	_	_	_	_	_	_	2	_	_	1.5	3	_	_	_	2.5
Bulgaria	_	_	0.5		_	-	_	_	_	_	2	_	_	3	_	0	_	-	3
Croatia	1	_	_	_		_	_	_	_	_	_	_	2	_	_	2	_	_	_
Cyprus	_	_	_	_	_		_	0	_	0	_	0	0	-	0	-	_	-	_
Czech Rep.	_	_	_	_	_	_		_	2	_	_	_	_	_	_	2	_	2.5	_
Denmark	0.5	2	_	-	_	4	_		_	-	_	-	_	-	_	1	_	0.5	_
England	2	_	_	_	_	_	2	_		3.5	_	_	_	_	1.5	_	_	1.5	_
Finland	_	1.5	-	-	-	4	_	_	0.5		_	_	_	_	_	_	_	_	_
France	1.5	_	2	2	_	_	_	_	_	_		_	_	_	_	_	_	2.5	_
FYROM	_	_	_	-	_	4	_	_	_	-	_		_	-	_	1	1.5	1	_
Georgia	_	2		_	2	4	_	_	_	_	_	_		_	1.5	_	3	_	_
Germany	2.5	_	2.5	1	_	_	_	_	_	-	_	-	_		_	2.5	_	2	3
Greece	_	_	1	_	_	4	_	_	2.5	_	_	_	2.5	_			_	_	1.5
Hungary	_	_	_	4	2	_	2	3	_	-	_	3	_	1.5	_		_	-	_
Iceland	_	_	_		_	_	_	_	_	_	_	2.5	1	_	_	_		_	_
Israel	_	_	_	-	_	_	1.5	3.5	2.5	_	1.5	3	_	2	-	_	_		1.5
Italy	_	_	1.5	1	_	_	_	_	_	_	_	_	_	1	2.5		_	2.5	
Latvia	_	3	_	_	_	_	2	1.5	1.5	-	-	3	_	_	_	1.5	_	_	_
Lithuania	_	_	_	_	_	_	_	_	1	_	0.5	_	_	_	_	_	-	_	_
Luxembourg	_	-	_	_	- 1 F	2.5	-	-	_	0.5	- 1 F	2	_	-	_	_	1	_	1.5
Moldova	_	2.5	_	_	1.5	_	2	3	_	_	1.5	-	_	- 1	_	_	- 1 F	_	1.5
Montenegro	_ 1	2	_	_	_	_	_ 2.5	_	_	-	_	2.5	_	1	- 2.5	_	1.5	_	_
Netherlands	1	_	_	_	_	_	$\frac{2.5}{0.5}$	0.5	_	2	_	_	_	_	2.5	_	_	_	_
Norway Poland	_	- 2	_	- 1.5	$\frac{-}{3}$	_		0.5	-3	3	_	_	_	-	$\frac{-}{2}$	_	_	_	_
Romania	_	3	1	-	3	_	_	_	3	4	_	_	_	1.5	$\frac{2}{2.5}$	$\frac{-}{2}$	_	_	_
Russia	_	_	1.5		_	_	-3.5	_	_	_	-2.5	_	_	1.0	∠.5 _			_	_
Scotland	_	_	1.0	1		3	3.3 -	2	_	1	2.5 –	_	0.5	_	_	_	0	_	_
Serbia	_	_	_	_	1	- -	1.5		_	_	_	_	0.5	_	_	_	$\frac{0}{2.5}$	_	_
Slovenia							1.0						2.5			1	3		$\frac{}{2}$
Spain	1.5	_	$\frac{-}{2}$	_	_	_	_	_		_	-2.5	_	2.0	_	1.5	_	$\frac{3}{2.5}$		
Sweden	1.0	_	_	_	1.5	_	_	_		-2.5	2.5	_	1	_	1.5 –	_	2.5 —	_	-1.5
Switzerland	_			1.5	2	_		_		2.9	_	_	_	_	_	_	_	1.5	-
Turkey		_		-	_	3	_	_		_	_	1.5	2.5	_	_	_		1.0	
Ukraine	_			2	3	_		_	2.5	_	_	-	Z.9 —	0.5	_	_	3	2	
							_	_		_	_		_				- -		0.5
Wales	-	0	-	_	_	2	-	_	-	-	-	0	-	-	_	-	_	-	0.5

Table A.1: Results of the European Team Chess Championship open tournament 2011 (continued)

	Latvia	Lithuania	Luxembourg	Moldova	Montenegro	Netherlands	Norway	Poland	Romania	Russia	Scotland	Serbia	Slovenia	Spain	Sweden	Switzerland	Turkey	Ukraine	Wales
Armenia	_	_	_	_	_	3	_	_	_	_	_	_	_	2.5	_	_	_	_	_
Austria	1	-	-	1.5	2	_	-	1	_	-	_	-	_	_	-	-	_	-	4
Azerbaijan	_	_	_	_	_	_	_	_	3	2.5	_	_	_	2	_	_	_	_	_
Bulgaria	_	-	-	-	_	_	-	2.5	_	3	_	-	_	_	-	2.5	_	2	_
Croatia	_	_	_	2.5	_	_	_	1	_	_	3	_	_	_	2.5	2	_	1	_
Cyprus	_	-	1.5	_	_	_	_	_	_	-	1	_	_	_	_	-	1	-	2
Czech Rep.	2	_	_	2	_	1.5	3.5	_	_	0.5	_	2.5	_	_	_	_	_	_	_
Denmark	2.5	_	_	1	_	_	3.5	_	_	_	2	_	_	_	_	_	_	_	_
England	2.5	3	_	_	_	_	_	1	_	_	_	_	_	_	_	_	_	1.5	_
Finland	_	_	3.5	_	_	2	1	0	_	_	3	_	_	_	1.5	_	_	_	_
France	_	3.5	_	2.5	_	_	_	_	_	1.5	_	_	_	1.5	2	_	_	_	_
FYROM	1	-	2	-	1.5	-	_	-	_	-	_	-	_	-	-	-	2.5	-	4
Georgia	_	_	_	_	_	_	_	_	_	_	3.5	_	1.5	_	3	_	1.5	_	_
Germany	_	-	_	-	3	-	_	-	2.5	-	_	-	_	-	-	-	_	3.5	-
Greece	_	_	_	_	_	1.5	_	2	1.5	_	_	_	_	2.5	_	_	_	_	_
Hungary	2.5	-	_	-	_	-	_	-	2	-	_	-	3	-	-	-	_	-	-
Iceland	_	_	3	_	2.5	_	_	_	_	_	4	1.5	1	1.5	_	_	_	1	_
Israel	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	2.5	_	2	_
Italy	_	_	_	2.5	_	_	_	_	_	_	_	_	2	_	2.5	_	_	_	3.5
Latvia		2	_	_	_	_	2.5	_	_	_	_	_	_	1	_	_	_	_	_
Lithuania	2		_	_	_	_	2	2	1.5	_	3	1	_	_	_	3	_	_	_
Luxembourg	_	_		0	0.5	_	_	_	_	_	_	0	_	_	1	_	_	_	2
Moldova	_	_	4		3	_	_	_	_	1.5	_	_	_	_	_	_	_	_	_
Montenegro	_	_	3.5	1		_	3	_	_	_	_	1.5	_	_	2	_	_	_	_
Netherlands	_	_	_	_	_		_	2.5	1.5	2	_	2.5	_	_	2.5	_	_	_	_
Norway	1.5	2	_	_	1	_		_	_	_	2.5	_	_	_	_	2	2.5	_	_
Poland	_	2	_	_	_	1.5	_		_	_	_	_	2	_	_	_	_	_	_
Romania	_	2.5	_	_	_	2.5	_	_		_	_	_	_	1	_	_	3	_	4
Russia	_	_	_	2.5	_	2	_	_	_		_	_	3	3	_	_	_	2.5	_
Scotland	_	1	_	_	_	_	1.5	_	_	_		_	_	_	_	_	_	_	3.5
Serbia	_	3	4	_	2.5	1.5	_	_	_	_	_		1.5	1.5	_	_	4	_	_
Slovenia	_	_	_	_	_	_	_	2	_	1	_	2.5		_	_	3	_	0.5	_
Spain	3	_	_	_	_	_	_	_	3	1	_	2.5	_		_	_	_	_	-
Sweden	_	-	3	_	2	1.5	_	_	_	_	-	_	_	-		_	2.5	_	-
Switzerland	_	1	_	_	_	_	2	_	_	_	_	_	1	_	_		2.5	3	4
Turkey	-	_	_	_	-	_	1.5	_	1	_	_	0	_	_	1.5	1.5		_	3.5
Ukraine	-	_	_	_	-	_	_	_	_	1.5	_	_	3.5	_	_	1	_		_
Wales	_	_	2	-	_	_	-	-	0	_	0.5	-	_	_	-	0	0.5	-	

Table A.2: Results of the European Team Chess Championship open tournament 2013 I.

	Armenia	Austria	Azerbaijan	Belarus	Belgium	Bulgaria	Croatia	Czech Republic	Denmark	England	Finland	France	FYR Macedonia	Georgia	Germany	Greece	Hungary	Iceland	Israel
Armenia		2.5	2	_	_	2	_	_	_	l –	_	2	_		_	l –	2.5	_	_
Austria	1.5		_	_	_	1	_	_	_	_	2.5	_	_	_	_	_	_	_	0.5
Azerbaijan	2	_		_	_	2.5	_	2.5	_	_	_	2	_	3	_	2.5	2	_	_
Belarus	_	_	_		_	_	_	2	3	_	_	1.5	_	_	_	1	1	_	_
Belgium	_	_	_	_		_	_	_	1.5	_	_	_	3	1.5	_	_	_	1.5	_
Bulgaria	2	3	1.5	_	_		_	_	_	_	3.5	_	_	_	_	_	_	2.5	_
Croatia	_	_	_	_	_	_		_	_	_	_	_	2.5	_	_	1	_	_	2
Czech Republic	_	_	1.5	2	_	_	-		-	_	_	1.5	_	2	_	_	_	2.5	_
Denmark	_	_	_	1	2.5	_	_	_		-	2	_	-	_	_	_	1	1.5	_
England	_	_	_	_	_	_	_	_	_		_	_	_	2	2.5	1	2	_	_
Finland	_	1.5	_	_	_	0.5	_	_	2	_		_	2.5	_	_	_	_	2	_
France	2	_	2	2.5	_	_	_	2.5	_	_	_		_	_	-	2.5	2	_	_
FYR Macedonia	-	_	_	_	1	-	1.5	_	_	_	1.5	_		_	_	_	_	_	_
Georgia	_	-	1	-	2.5	_	_	2	_	2	-	_	-		2.5	2	2	_	3.5
Germany	_	_	_	_	_	_	_	_	_	1.5	_	_	_	1.5		_	_	_	2.5
Greece	_	_	1.5	3	_	_	3	_	_	3	_	1.5	_	2	_		_	_	_
Hungary	1.5	_	2	3	_	_	_	_	3	2	_	2	_	2	_	_		_	_
Iceland	_	_	_	_	2.5	1.5	_	1.5	2.5	_	2	-	_	_	_	_	_		_
Israel	_	3.5	_	_	_	_	2	_	_	_	_	_	_	0.5	1.5	_	_	_	
Italy	_	_	_	_	_	2.5	_	1	_	_	3	_	_	_	_	2	_	_	3.5
Lithuania	_	_	_	_	3	_	_	_	2	_	2.5	_	4	_	1	1.5	_	_	_
Montenegro	1.5	_	_	_	_	-	_	_	_	0.5	2.5	_	_	_	_	_	_	_	_
Netherlands	_	1.5	_	_	_	3.5	_	2	3		_	_	-	_	_		_	_	1.5
Norway	_	-	_ 	1	0.5	_	-	_	0	-	_	_	2.5	_	-	_	_	-	_
Poland	_	_	1.5	_	_	_	2	_	_	2	_	_	-	_	2	_	_	3	-
Poland Futures	_	-	_	_	_	_	1	_	_	-	_	_	3.5	-	2	_	_	-	2.5
Poland Goldies Romania	_	$\frac{2}{2}$	_	_	_	_	$^ ^2$	1 5	_	1	_	_	_	_	_	- 2	_	2.5	_
Russia	- 1.5	$\frac{2}{4}$	_	_	_	_	2	1.5	_	$\frac{-}{2}$	_	-2.5	_	_	_	2	_	_	_
Scotland	1.0		_	_	$\frac{-}{2}$	_	_		_		_		1.5	_	_	_	_	0.5	_
Serbia	_	_	_	1.5	$\frac{2}{3.5}$	_	$\frac{-}{2}$	_	_	_	_	_	1.0 -	_	_	_	_	0.5	_
Slovenia	1	_	_	1.0	3.0	_	2	_	_	_	_	1.5			_	_	_	_	2.5
Spain	_	2	_				1.5					-	_		$\frac{}{2}$		1	2.5	2.0
Sweden	_		2	_	_	2	1.5					_	2.5	_	<u> </u>		1	2.0	
Switzerland	_	_	_	_	_	$\frac{2}{2.5}$	_						2.9 —	_	1		1		1
Turkey	_	_	_	1.5	_	Z.9 -	_	0.5				_	_	_	$\frac{1}{3.5}$		1		1
Ukraine	3	_	_	2	_	_	2.5	-	_	$\overline{2}$	_	1	_	1.5	- -	_	_		_
Wales	_	_	_	_	0	_	_	_	0.5	_	0	_	0	-	_	_	_	_	_
											-		-						

Table A.2: Results of the European Team Chess Championship open tournament 2013 II.

							60												
	Italy	Lithuania	Montenegro	Netherlands	Norway	Poland	Poland Futures	Poland Goldies	Romania	Russia	Scotland	Serbia	Slovenia	Spain	Sweden	Switzerland	Turkey	Ukraine	Wales
Armenia	_	_	2.5	_	_	_	_	_	_	2.5	_	_	3	_	_	_	_	1	-
Austria	_	_	_	2.5	_	-	_	2	2	0	_	_	_	2	_	-	_	-	_
Azerbaijan	_	_	_	_	_	2.5	_	_	_	_	_	_	_	_	2	_	_	_	_
Belarus	_	_	_	_	3	_	_	_	_	_	_	2.5	_	_	_	_	2.5	2	_
Belgium	_	1	_	_	3.5	_	_	-	_	_	2	0.5	_	_	_	_	_	_	4
Bulgaria	1.5	_	_	0.5	_	_	_	_	_	_	_	_	_	_	2	1.5	_	_	_
Croatia	_	_	_	_	_	2	3	_	2	_	_	2	_	2.5	_	_	_	1.5	_
Czech Republic	3	_	_	2	_	_	_	_	2.5	_	_	_	_	_	_	_	3.5	_	_
Denmark	_	2	_	1	4	_	_	_	_	_	_	_	_	_	_	_	_	_	3.5
England	_	_	3.5	_	_	2	_	3	_	2	_	_	_	_	_	_	_	2	_
Finland	1	1.5	1.5	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	4
France	_	_	_	_	_	_	_	_	_	1.5	_	_	2.5	_	_	_	_	3	_
FYR Macedonia	_	0	_	_	1.5	_	0.5	-	_	_	2.5	_	_	_	1.5	_	_	_	4
Georgia	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	2.5	_
Germany	_	3	_	_	_	2	2	_	_	_	_	_	_	2	_	3	0.5	_	_
Greece	2	2.5	_	_	_	_	_	_	2	_	_	_	_	_	_	_	_	_	_
Hungary	_	_	_	_	_	_	_	_	_	_	_	_	_	3	_	3	_	_	_
Iceland	_	_	_	_	_	1	_	1.5	_	_	3.5	_	_	1.5	_	_	_	_	_
Israel	0.5	_	_	2.5	_	_	1.5	-	_	_	_	_	1.5	_	_	3	_	_	_
Italy		_	_	_	_	_	_	-	_	0.5	_	2	2	-	_	-	2.5	_	_
Lithuania	_		_	_	2.5	_	1	1.5	_	_	_	_	_	_	_	_	_	_	_
Montenegro	_	_		_	_	_	_	2.5	_	-	3	2	1	2	2.5	-	_	-	_
Netherlands	_	_	_		_	_	_	3	_	1.5	_	_	3.5	_	_	-	_	-	4
Norway	_	1.5	_			_	_	_	_	_	3	_	1	_	_	1.5	_	_	3
Poland	_	_	_	_	_		_	_	_	_	_	-	1.5	2.5	_	3	2	_	_
Poland Futures	-	3	_	_	-	_		3	_	-	-	-	_	1	1	_	_	1	_
Poland Goldies	_	2.5	1.5	1	_	_	1		1	-	-	-	_	_	_	_	_	-	3.5
Romania	-	-	-	-	-	-	-	3		1.5	-	-	-	-	-	3.5	-	2	4
Russia	3.5	_	_	2.5	_	_	_	_	2.5		_	2.5	_	_	_	-	1.5	_	_
Scotland	-	-	1	_	1	-	-	-	-			2	-	-	0	-	1	_	4
Serbia	2	_	2	_	_	_	-	_	_	1.5	2		_	_	3.5	_	3	_	-
Slovenia	2	-	3	0.5	3	2.5	-	-	-	-	-	-		_	_	-	-	0.5	-
Spain	_	-	2	-	_	1.5	3	_	_	-	-	-	_		2.5	-	-	_	-
Sweden	-	-	1.5	-	-	-	3	-	-	-	4	0.5	_	1.5		1	-	-	-
Switzerland	_	-	-	-	2.5	1	-	_	0.5	-	-	-	_	-	3		2	_	-
Turkey	1.5	-	-	-	-	2	-	-	-	2.5	3	1	_	-	-	2		-	-
Ukraine	_	-	_	_	_	-	3	_	2	_	-	-	3.5	_	_	-	_		_
Wales	-	-	-	0	1	-	-	0.5	0	-	0	_	_	-	-	-	-	-	

															_		_		_		_		_		_				_											Match
Place	Team	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	points
1	Germany		~	~	~			X		~		~			=	~										~														15
2	Azerbaijan	Х			~	~		~		•	=	•								=	~																			14
3	Hungary	X						~		=							=	V				=			~				~		~									13
4	Armenia	Х	X				~				~									~		~	=						V				~							13
5	Russia		Х				=	X			~					~	V	V	~	~																				13
6	Netherlands				Х	=			~	X			~				~				V							~				=								12
7	Bulgaria	~	Х	X		~			~			•				=				=				~																12
8	Poland						Х	Х										=			=	~	~									~	~	=						11
9	Romania	X	Х	=			~				X										~													•	~			•		11
10	Spain		=		Х	X				~			~							~	X				~		~													11
11	Italy	X	X					X							~			=	~		~							~										•		11
12	Serbia						X				X						X	X								~	~							~	~		~			10
13	Georgia																	X			X	=					~	~					=		X	•			~	10
14	Israel	=										X				=	X			X			~	~					~		~									10
15	Ukraine	X				X		=							=			~				~	~	X			~													10
16	Czech Rep.			=		X	X						•		~				=				=		=					•										10
17	Slovenia			X		X			=			=	~	~		X								~			~													10
18	Moldova					X						X					=			Х		X				~			~				~				•			9
19	France		=		X	X		=			X				~				~									=						•						9
20	Greece		X				X		=	X	•	X		~									~																•	9
21	Croatia			=	X				X					=		X			~					=				~								•				9
22	England				=				X						X	X	=				X				~							~		~						8
23	Switzerland							X							X	~		X				=								=				X	~			•		8
24	Latvia			Х							X						=						Х						X	~	~		~	=						8
25	Montenegro	X											X						Х								Х	=		~	~		=				~			8
26	Iceland										X		X	X		X		Х								~					~					~	~			8
27	Sweden						Х					X		X						=		X				=						~			~		~			8
28	Denmark			X	X										X				X						~					'			=			=			~	8
29	Norway																X							=	X	X			X			~		=	~	~				8
30	FYROM			X											X										X	X	X								~		=	•	~	7
31	Finland						=		X														X					X		X			X			~	~		~	7
32	Austria				X				X					=					X						X	=			=			~						•		7
33	Lithuania								=	X			X							X			X	~	=					=						~				7
34	Turkey									X			X	~										X				X		X	X							•	~	6
35	Scotland													X								X					X		=	X		X		X				~	~	5
36	Luxembourg												X						X							X	X	X			=	X						=	•	4
37	Wales									X		X												X							X		X			X			=	2
38	Cyprus													X							X								X		X	X			X	X	X	=		1

Match

Table A.5: Rankings of the European Team Chess Championship open tournament 2011

			$GRS_1(R^{MP})$	$GRS_2(R^{MP})$	$^{(P)}$	$GRS_1(R^{MB})$	$GRS_2(R^{MB})$	$^{(B)}$	$GRS_1(R^{BM})$	$GRS_2(R^{BM})$	M	$GRS_1(R^{BP})$	$GRS_2(R^{BP})$	P
	r	Official	$S_1($	$S_2($	$(R^{M}$	$S_1($	$S_2($	$LS(R^{MB})$	$S_1($	$S_2($	$LS(R^{BM})$	$S_1($	$S_2($	(R^B)
Team	Start	90	GR	GR	$LS(R^{MP})$	GR	GR	TS	GR	GR	TS	GR	GR	$LS(R^{BP})$
Germany	10	1	1	1	2	1	1	2	1	1	2	3	2	2
Azerbaijan	3	2	2	2	1	2	2	1	2	2	1	1	1	1
Hungary	5	3	5	6	6	3	5	6	3	5	6	2	4	5
Armenia	4	4	4	4	5	4	4	5	4	3	4	4	3	4
Russia	1	5	3	3	3	5	3	3	5	4	3	8	5	3
Netherlands	9	6	7	7	8	6	7	8	9	9	9	13	13	12
Bulgaria	7	7	6	5	4	7	6	4	11	6	5	18	9	6
Poland	14	8	11	12	16	8	11	13	6	8	12	5	6	9
Romania	17	9	10	10	12	9	9	12	10	10	13	11	12	13
Spain	13	10	8	8	7	10	8	7	12	7	7	12	8	7
Italy	22	11	9	9	9	11	10	10	14	12	11	17	19	15
Serbia	18	12	16	18	21	12	17	21	7	15	19	6	7	16
Georgia	15	13	17	22	27	13	21	25	8	20	24	7	16	23
Israel	11	14	15	16	15	14	16	15	13	14	14	10	10	11
Ukraine	2	15	13	11	11	15	12	11	16	11	10	15	15	10
Czech Rep.	12	16	14	14	14	16	14	16	17	16	15	19	17	14
Slovenia	21	17	12	13	13	17	13	14	20	17	16	26	21	19
Moldova	20	18	21	20	20	18	19	20	15	19	20	9	14	20
France	6	19	18	15	10	19	15	9	18	13	8	14	11	8
Greece	19	20	19	17	17	20	18	17	19	18	17	16	18	18
Croatia	16	21	20	19	18	21	20	19	23	22	21	28	23	21
England	8	22	22	21	19	22	22	18	21	21	18	20	20	17
Switzerland	26	23	27	24	23	23	24	23	22	24	23	21	26	24
Latvia	27	24	23	23	22	24	23	22	24	23	22	23	22	22
Montenegro	29	25	25	26	29	25	26	29	25	25	28	24	24	27
Iceland	32	26	26	28	28	26	27	28	26	26	26	25	25	26
Sweden	25	27	24	25	25	27	25	26	27	27	27	27	27	28
Denmark	24	28	28	27	26	28	28	27	29	28	29	29	28	29
Norway	31	29	29	30	31	29	30	31	32	32	31	34	33	32
FYROM	30	30	33	33	33	30	33	33	28	31	33	22	31	31
Finland	28	31	32	32	32	31	32	32	30	33	32	30	32	33
Austria	23	32	31	31	30	32	31	30	31	30	30	31	30	30
Lithuania	33	33	30	29	24	33	29	24	33	29	25	32	29	25
Turkey	34	34	34	34	34	34	34	34	34	34	34	33	34	34
Scotland	35	35	35	35	35	35	35	35	35	35	35	35	35	35
Luxembourg	37	36	36	36	36	36	36	36	36	36	36	36	36	36
Wales	36	37	37	37	37	37	37	37	37	37	37	38	37	37
Cyprus	38	38	38	38	38	38	38	38	38	38	38	37	38	38

Table A.6: Rankings of the European Team Chess Championship open tournament 2013

		al	$GRS_1(R^{MP})$	$GRS_2(R^{MP})$	(MP)	$GRS_1(R^{MB})$	$GRS_2(R^{MB})$	(MB)	$GRS_1(R^{BM})$	$GRS_2(R^{BM})$	(BM)	$GRS_1(R^{BP})$	$GRS_2(R^{BP})$	(BP)
Team	Start	Official	GRS_1	GRS_2	$LS(R^{MP})$	GRS_1	GRS_2	$LS(R^{MB})$	GRS_1	GRS_2	$LS(R^{BM})$	GRS_1	GRS_2	$LS(R^{BP})$
Azerbaijan	6	1	1	1	2	1	1	2	2	1	2	5	2	3
France	3	2	2	2	1	3	2	1	4	3	1	7	4	1
Russia	1	3	4	4	4	2	4	4	1	2	3	2	1	2
Armenia	2	4	3	3	3	4	3	3	6	5	4	13	11	9
Hungary	7	5	5	5	5	5	5	5	5	4	5	3	3	4
Georgia	14	6	6	6	6	6	6	6	7	6	8	11	9	8
Greece	15	7	7	7	8	8	7	7	8	7	6	9	6	5
Czech Rep.	9	8	9	10	10	10	9	10	9	9	9	8	7	6
Ukraine	5	9	8	8	7	9	8	8	10	8	7	10	8	7
England	4	10	10	9	9	11	10	9	12	10	10	12	10	10
Netherlands	8	11	12	14	17	7	13	17	3	11	15	1	5	11
Italy	13	12	11	11	12	12	11	12	14	12	12	15	14	14
Serbia	20	13	16	18	19	14	16	18	13	14	16	6	12	15
Romania	19	14	17	17	15	13	15	15	11	13	14	4	13	13
Belarus	17	15	13	12	11	16	12	11	16	15	11	17	16	12
Poland	12	16	14	13	14	15	14	13	15	16	13	14	15	16
Croatia	16	17	15	15	16	17	17	16	17	17	18	18	17	17
Montenegro	30	18	18	19	21	18	19	22	19	21	23	27	27	25
Spain	11	19	21	21	22	21	21	21	21	20	21	23	20	22
Germany	10	20	20	20	18	20	20	19	20	18	19	22	18	19
Slovenia	22	21	19	16	13	23	18	14	26	19	17	29	25	20
Poland Futures	23	22	22	23	26	22	23	25	22	24	25	24	23	24
Lithuania	34	23	23	25	30	19	25	29	18	25	29	16	22	27
Turkey	18	24	24	22	20	27	22	20	27	22	20	26	21	18
Bulgaria	21	25	25	24	23	25	24	23	24	23	22	21	19	21
Sweden	25	26	26	27	28	26	26	28	25	26	27	25	24	26
Denmark	26	27	27	30	32	24	29	32	23	28	31	19	26	30
Israel	29	28	28	26	24	30	27	24	30	27	24	30	29	23
Iceland	28	29	32	32	31	29	32	31	29	29	30	28	28	28
Austria	27	30	29	28	25	33	28	26	34	30	26	34	33	29
Poland Goldies	24	31	31	31	29	31	31	30	31	32	32	32	31	32
Switzerland	31	32	30	29	27	32	30	27	33	31	28	33	34	31
Belgium	33	33	33	33	34	28	33	34	28	33	33	20	30	33
Finland	32	34	34	34	33	34	34	33	32	34	34	31	32	34
Norway	36	35	35	35	35	35	35	35	35	35	35	36	35	35
Scotland	37	36	36	36	36	37	36	36	37	37	36	37	37	37
FYR Macedonia	35	37	37	37	37	36	37	37	36	36	37	35	36	36
Wales	38	38	38	38	38	38	38	38	38	38	38	38	38	38

(a) Kemeny distance

	Start	Official	$GRS_1(R^{MP})$	$GRS_2(R^{MP})$	$LS(R^{MP})$	$\mathit{GRS}_1(R^{MB})$	$GRS_2(R^{MB})$	$LS(R^{MB})$	$\mathit{GRS}_1(R^{BM})$	$GRS_2(R^{BM})$	$LS(R^{BM})$	$\mathit{GRS}_1(R^{BP})$	$GRS_2(R^{BP})$	$LS(R^{BP})$
Start Official	107	107	100 37	98 45	100 73	107 0	99 38	96 69	110 25	93 34	93 60	130 71	99 52	85 60
$GRS_1(R^{MP})$ $GRS_2(R^{MP})$ $LS(R^{MP})$	100 98 100	37 45 73	16 44	16 28	44 28	37 45 73	13 7 35	42 26 8	62 70 94	31 27 47	43 29 21	108 114 130	61 67 81	53 45 41
$GRS_1(R^{MB})$ $GRS_2(R^{MB})$ $LS(R^{MB})$	107 99 96	0 38 69	37 13 42	45 7 26	73 35 8	38 69	38	69 33	25 63 88	34 20 41	60 32 13	71 107 122	52 60 73	60 40 33
$GRS_1(R^{BM})$ $GRS_2(R^{BM})$ $LS(R^{BM})$	110 93 93	25 34 60	62 31 43	70 27 29	94 47 21	25 34 60	63 20 32	88 41 13	49 79	30	79 30	46 87 111	41 40 60	71 26 20
$GRS_1(R^{BP})$ $GRS_2(R^{BP})$ $LS(R^{BP})$	130 99 85	71 52 60	108 61 53	114 67 45	130 81 41	71 52 60	107 60 40	122 73 33	46 41 71	87 40 26	111 60 20	57 97	57	97 44

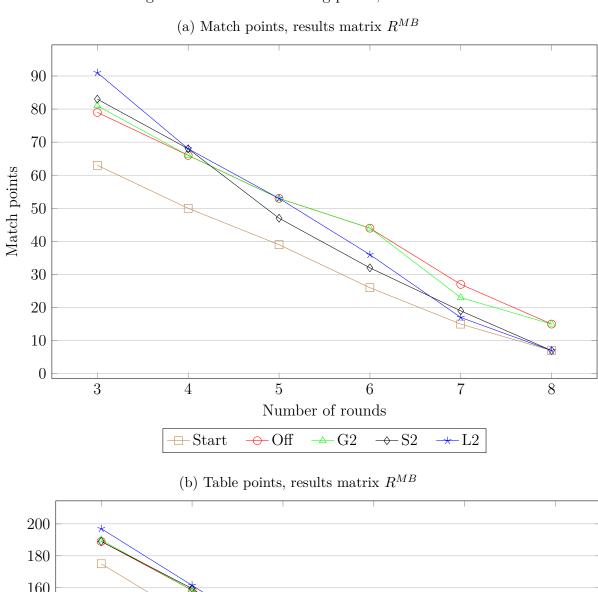
(b) Weighted distance

	Start	Official	$GRS_1(R^{MP})$	$GRS_2(R^{MP})$	$LS(R^{MP})$	$GRS_1(R^{MB})$	$GRS_2(R^{MB})$	$LS(R^{MB})$	$GRS_1(R^{BM})$	$GRS_2(R^{BM})$	$LS(R^{BM})$	$GRS_1(R^{BP})$	$GRS_2(R^{BP})$	$LS(R^{BP})$
Start Official	10.79	10.79	9.68 3.04	9.60 3.67	9.39 6.33	10.79 0.00	9.54 3.08	9.15 6.12	11.30 2.09	9.45 2.74	8.66 5.62	12.16 6.55	10.05 4.89	8.10 5.58
$GRS_1(R^{MP})$ $GRS_2(R^{MP})$ $LS(R^{MP})$	9.68 9.60 9.39	3.04 3.67 6.33	1.02 3.80	2.80	3.80 2.80	3.04 3.67 6.33	0.75 0.60 3.39	3.73 2.73 0.53	5.04 5.66 8.07	2.29 2.24 4.36	3.80 2.87 1.53	9.41 9.97 9.94	5.87 6.36 6.20	4.39 4.15 3.01
$GRS_1(R^{MB})$ $GRS_2(R^{MB})$ $LS(R^{MB})$	10.79 9.54 9.15	0.00 3.08 6.12	3.04 0.75 3.73	3.67 0.60 2.73	6.33 3.39 0.53	3.08 6.12	3.08	6.12 3.31	2.09 5.09 7.74	2.74 1.65 4.04	5.62 3.27 1.00	6.55 9.42 9.48	4.89 5.80 5.71	5.58 3.69 2.49
$GRS_1(R^{BM})$ $GRS_2(R^{BM})$ $LS(R^{BM})$	11.30 9.45 8.66	2.09 2.74 5.62	5.04 2.29 3.80	5.66 2.24 2.87	8.07 4.36 1.53	2.09 2.74 5.62	5.09 1.65 3.27	7.74 4.04 1.00	4.10 7.20	4.10 3.29	7.20 3.29	4.48 8.01 8.79	3.96 4.23 4.79	6.58 2.98 1.49
$GRS_1(R^{BP})$ $GRS_2(R^{BP})$ $LS(R^{BP})$	12.16 10.05 8.10	6.55 4.89 5.58	9.41 5.87 4.39	9.97 6.36 4.15	9.94 6.20 3.01	6.55 4.89 5.58	9.42 5.80 3.69	9.48 5.71 2.49	4.48 3.96 6.58	8.01 4.23 2.98	8.79 4.79 1.49	4.53 7.78	4.53 3.64	7.78 3.64

Table A.8: Positional changes in decomposition of the ranking $LS(\mathbb{R}^{MP})$, ETCC 2011

Team	Off (0)	1	2	3	4	5	7	8	Cumulated	LS (∞)
Germany	1	_	_	_	_		_	_	—	2
Azerbaijan	2	_	_	_	_	1	_	_	↑	1
Hungary	3	111	_	_	_	_	_	_	111	6
Armenia	4	1	_	_	_	_	_	_	4	5
Russia	5	↑↑	_	_	_	_	_	_	个 个	3
Netherlands	6	↓	_	1	_	_	_	_	11	8
Bulgaria	7	ተተተ	_	_	_	_	_	_	$\uparrow \uparrow \uparrow \uparrow$	4
Poland	8	↓ (6)	_	1	_	_	1	_	↓ (8)	16
Romania	9	_	Ψ	T	_	1	_	_	111	12
Spain	10	个个	_	1	_	_	_	_	$\uparrow\uparrow\uparrow$	7
Italy	11	1	1	_	_	_	_	_	个 个	9
Serbia	12	↓ (7)	_	_	$\uparrow \downarrow$	_	_	_	↓ (9)	21
Georgia	13	4 (9)	4	T	T	T	_	↓	↓ (14)	27
Israel	14	11	_	_	_	_	1	_	V	15
Ukraine	15	ተተተ	1	1	_	_	↓	_	1 (4)	11
Czech Rep.	16	个个个	$\downarrow \downarrow$	1	_	_	_	_	个个	14
Slovenia	17	1 (6)	$\downarrow \downarrow$	_	_	_	_	_	1 (4)	13
Moldova	18	11	_	_	-	_	_	_	11	20
France	19	1 (4)	ተተተ	_	_	1	1	-	1 (9)	10
Greece	20	个个个	_	_	-	_	_	_	个个个	17
Croatia	21	个个个	_	_	_	_	_	-	个个个	18
England	22	↑	_	_	个个	_	_	_	个个个	19
Switzerland	23	↓ (4)	ተተተ	1	_	_	_	-	_	23
Latvia	24	1	1	_	_	_	_	_	个个	22
Montenegro	25	_	Ψ	111	_	_	_	_	↓ (4)	29
Iceland	26	-	$\uparrow \uparrow$	_	_	_	_	_	11	28
Sweden	27	ተተተ	Ψ	_	1	_	\downarrow	_	个个	25
Denmark	28	_	1	1	\downarrow	_	_	1	个个	26
Norway	29	Ψ	Ψ	_	_	_	_	-	11	31
FYROM	30	111	_	_	_	_	_	_	111	33
Finland	31	Ψ	_	_	_	_	_	_	\	32
Austria	32	↑	1	_	_	_	_	_	个个	30
Lithuania	33	1 (4)	_	个个	1	1	1	-	1 (9)	24
Turkey	34	_	-	-	_	-	_	_	_	34
Scotland	35	_	_	-	_	-	-	-	_	35
Luxembourg	36	-	_	-	_	-	-	-	_	36
Wales	37	_	-	_	_	-	-	-	_	37
Cyprus	38	_	_	_	-	-	-	-	_	38

Figure A.1: Total forecasting power, ETCC 2011



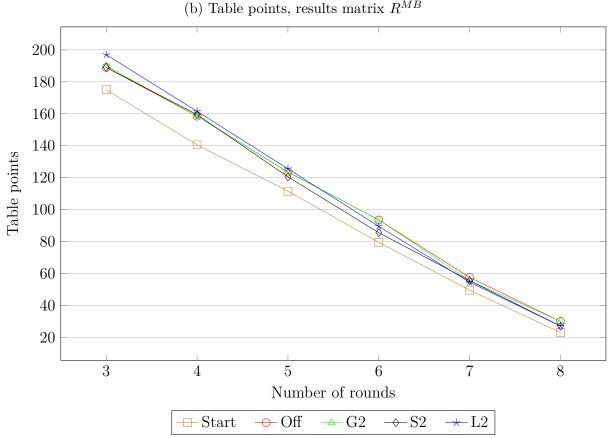
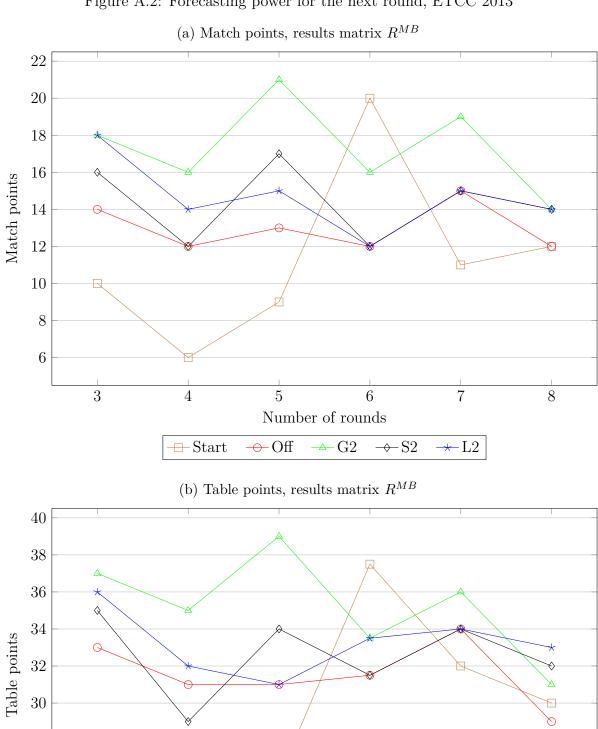


Figure A.2: Forecasting power for the next round, ETCC 2013



Number of rounds

<u></u> G2

 \rightarrow S2

7

<u></u> **L**2

8

5

 \longrightarrow Off

4

--- Start

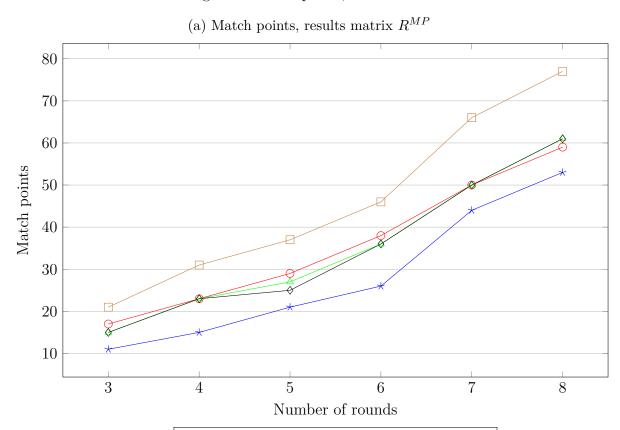
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24

3

Figure A.3: Sample fit, ETCC 2013



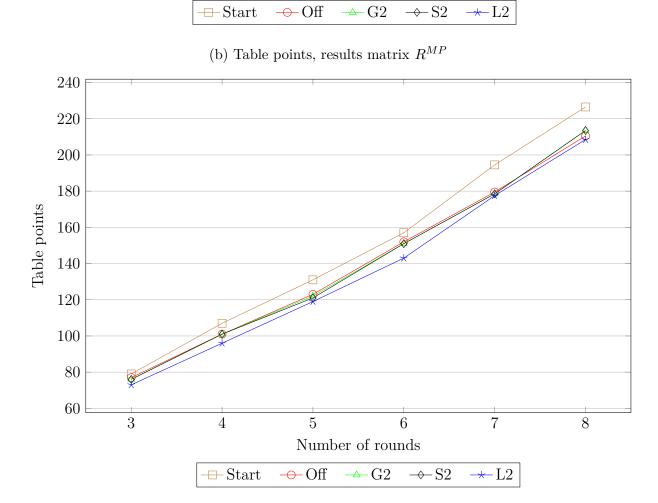
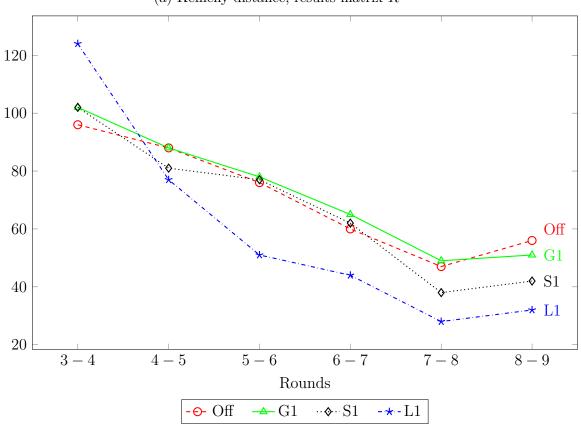


Figure A.4: Stability between rounds, ETCC 2013 $\,$

(a) Kemeny distance, results matrix ${\cal R}^{MP}$



(b) Weighted distance, results matrix ${\cal R}^{MP}$

