# Theory of Side-Choosing Games to Create and Disseminate Knowledge in Formal Science Domains

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#### Abstract

How do we create knowledge? We use the language of side-choosing games to instruct humans about which knowledge needs to be created, i.e., which problem needs solving. The language of side-choosing games becomes the domain-specific language for the human computation system. Our: side-choosing game (SCG) language uses a programming language to express game states and their transitions.

What is unique about our approach to create knowledge? To support a claim, a game is played. Playing a game only involves cleverly assigning values to variables and not knowledge about a formal proof system to support the claim. The side-choosing game approach supports a low key approach to defending a claim and is suitable for many skill levels. "Amateur Scientists" can help to gain insights into claims before they are passed on to the expert scientists.

How do we disseminate knowledge? Indirectly through curiosity! If a player loses a game although they predicted that they would win it, they become curious. They try to acquire the knowledge that the winning player has.

What is our theory: We study how to map side-choosing game results into ranking relations between players with guaranteed and desirables properties. We borrow ideas from social choice theory instead of using heuristics. Our theory informs the design of socio-technical systems for problem solving and teaching.

Our main contributions are (1) the concept of a side-choosing game with an illustration of its usefulness, (2) a representation theorem for an axiomatic treatment of ranking relations for side-choosing games, and (3) a meritocracy theorem showing that quasi-perfect players will be top-ranked iff the critical property of collusion-resistance holds.

## 1 Introduction

A side-choosing game is about a claim C which has an associated two-player, win-lose game Game(C) between a proponent of C and an opponent of C such that a win of the proponent is an indication that C is true and a win of the opponent is an indication that C is false. Game(C) does not allow for draws. If a proponent of C consistently wins against opponents, the proponent is said to have a winning strategy for C.

The first move in a side-choosing game is to choose a side for C: proponent or opponent. Player x(y) chooses side d(x)(d(y)) (d = design-time). The side-choosing move may be simultaneous or sequential. For simplicity, we assume it is simultaneous. The side-choosing game includes an agreement algorithm that maps x, y, d(x), d(y) into a set of games to be played where the design-time choices have been mapped into run-time choices r(x), r(y) so that  $r(x) \neq r(y)$ . This requires that at most one of the players will be forced because it might be that d(x) = d(y). A forced player is also called a devil's advocate especially when we think of a side-choosing game as a model for debates.

What is important to our theory is that for a claim C we get a table of game results (winner = x, loser = y, d(x), d(y), r(x), r(y)) for the games played between x and y. We simplify such a row to (winner = x, loser = y, forced = z), where z is either x, y or 0. We assume that the Players are 1, 2, 3, .... z = 0 means that none of the players is forced. The reason why this simplification works is because the only parameters of the game results

that the ranking depends on is who the winner and loser is in a game and if the players' design and run time side choices differ. It does not depend on the exact choice of sides.

## 1.1 Motivating Side-Choosing Games (SCGs)

SCG is a new concept that we introduce in this paper. Why is the concept important and worthy of study? Many real-life situations can be modeled with side-choosing games. Studying how to fairly evaluate tournaments of side-choosing games is very important because collusion between the players could distort the outcome. Rather than looking for collusion detection algorithms we design our system such that a dangerous kind of collusion is impossible. We use an axiomatic approach to ranking the players and postulate collusion-resistance as an axiom.

We motivate the importance of SCGs by describing applications, users and owners.

- SCG Applications
  - Formal Sciences

Formal sciences are disciplines concerned with formal systems, such as logic, mathematics, statistics, theoretical computer science, information theory, game theory, systems theory, and decision theory. A claim is defined using an interpreted predicate logic sentence. This is *not* an exercise in logic as the quantifiers are only used to define the tasks that the users must perform. The sentence is interpreted in a structure which might be defined by a complex program.

- Formal Claims based on Simulation Environments

Robotics and biological sciences, etc. fall into this category. The structure in which the claim is interpreted is the simulation environment.

• SCG Users

Users are problem solvers or learners and they operate directly or indirectly. In **direct mode**, the users perform the moves themselves, maybe using software. In **indirect mode**, the users produce software that plays the SCG on their behalf. There is a simple SCG-interface that the software has to follow. Of course, indirect users must have software development skills.

The indirect mode is of central interest to us because it is a novel approach to develop software for computational problems using a group of people. The quality control of the software is automated by running an online or offline tournament to determine the top-ranked software. The claim under consideration determines what quality means. Note that the SCG-interface implies that testing is an integral part of the solution.

Users of SCGs include:

- Students in high schools and universities.

They must understand the concept of a claim. Focus is on dissemination of knowledge through peer teaching and peer evaluation.

- Researchers

Focus is on creation of new knowledge and its peer evaluation. Researchers propose claim variations.

- Citizen Scientists

They might find innovative constructions that are imperfect. Experts might benefit from those ideas and correct them.

• SCG Owners

Owners define claims. Some users also play the role of owners. Owners don't need expertise how to solve the problems.

Owners include:

GRID	Winner	Loser	Forced
gr1	1	2	1
gr2	1	2	1

Table 1: A Table T of game results

- Teachers and Professors.
- Research Directors, Heads of Research Programs, Organizations like NSF, DARPA, ONR etc.
- Program Chairs of conferences and Journal Editors.
- Companies who need a specific computational problem solved for which no off-the-shelve solution is available.
- Companies who are looking for employees with skills in a specific domain. E.g., Facebook organized a competition on kaggle.com and the winner got the Facebook job.

### 1.2 Players and Game Results

Let P be the set of all the players involved in the competition. Each game result has three columns corresponding to the winner, loser and the player forced to choose a side, if any. To represent a table T of game results we use a unique identifier for each row, called GRID. This guarantees that T will have no duplicates. The table 1 represents two game results where 1 played against 2 and where 1 won although it was forced. The game result tables can grow to any size as we allow the same players to play again. Of course, the game history for gr1 and gr2 might be very different.

GR(P) is the set of the all possible game results without the unique identifier GRID. GR(P) contains  $n \cdot (n-1) \cdot 3$  rows where n is the number of players in P. G(P) is the set of all possible game results with unique identifiers.

## 1.3 Examples of Side-Choosing Games

The definition of a side-choosing game given above is abstract and only useful if we can give several interesting concrete versions.

- **Combinatorial Games** We choose a combinatorial game [5] and a position pos. The claim is: the position pos is a winning position.
- Semantic Games We choose a logic which supports semantic games. I.e., each sentence in the logic is mapped to a game between proponent and opponent so that the claim is true iff the proponent has a winning strategy. The sentences are interpreted in some structure. Most logics have semantic games. Some prominent examples are first and higher-order logics and independence-friendly logic [11].

Semantic games are a huge application domain for side-choosing games and we arrived at side-choosing games through the study of semantic games [7].

The connection between proofs and winning strategies is an active topic in logic [3]. One of the attractions of side-choosing games is that you don't need a proof for a claim to perform well in the side-choosing game for the claim. Side-choosing games are more easily accessible than formal proofs.

### 1.4 Applications of Side-Choosing Games

Our study of side-choosing games is motivated by their potential to organize problem-solving competitions and by their successful use in education at Northeastern University. We believe they are the foundation for platforms like TopCoder or Kaggle or scientific human-computation tools like Fold-It [4].

• Education in Formal Sciences Our favorite way of summarizing learning objectives for a formal science domain is to say that learners must demonstrate the skill of judging claims in the domain, choosing their side on the claim and then defending their side choice through game play against other students. The resulting peer-teaching and peer-grading is very attractive.

A claim is representing a lab in which students learn and is chosen in such a way that solving the problem requires skills that students should have.

• Improving Evaluation in Problem-Solving Competitions for Computational Problems A significant advantage of our approach is that the evaluation of solutions is done by peers and not the competition organizer. The competition organizer only acts in a role as referee. Instead of static benchmarks, dynamic benchmarks are developed through game play.

The quality of the solutions produced depends on the skills of the participants who might not be motivated or not have the knowledge necessary to solve the problem. To attract strong participants either money or fame has to be given; a common theme in human computation.

## 1.5 Related Work

[7] defines an important class of binary side-choosing games called semantic games and relates it to the foundations of logic.

In [10], Rubinstein provides an axiomatic treatment of tournament ranking functions that bears some resemblance to ours. Rubinstein's treatment was developed in a primitive framework where "beating functions" are restricted to complete, asymmetric relations. Rubinstein showed that the points system, in which only the winner is rewarded with a single point is *completely* characterized by the following three *natural* axioms:

- anonymity which means that the ranks are independent of the names of participants,
- positive responsiveness to the winning relation which means that changing the results of a participant p from a loss to a win, guarantees that p would have a better rank than all other participants that used to have the same rank as p, and
- Independence of Irrelevant Matches (IIM) which means that the relative ranking of two participants is independent of those matches in which neither is involved.

Our LFB axiom is, in some sense, at least as strong as Rubinstein's IIM because, according to LFB, the relative rank of some participant  $p_x$  w.r.t. another participant  $p_y$  cannot be worsened by games that  $p_x$  does not participate in nor can it be improved by games that  $p_y$  does not participate in.

[3] discusses the connection between winning strategies for semantic games and proofs. A recursive winning strategy for a semantic game of a sentence is a constructive proof of that sentence. They introduce the notion of CGTS-truth (computable game-theoretical semantics truth): a sentence  $\phi$  is CGTS-true on a recursive model M exactly when there is a computable winning strategy for Verifier in the semantical game played with  $\phi$  on M.

They focus on the special case of Peano Arithmetic (PA). They investigate the following questions

- From proofs to winning strategies Do proofs in PA yield CGTS-truth?
- From winning strategies to proofs Can the CGTS-truth of a sentence be interpreted as a proof?

Side-choosing games with backward moves are important in the study of those questions. The backward moves allow for many more winning strategies.

Rating methods can be used to rank tournament participants. There is a vast body of literature on the topic of *heuristic* [2] rating methods aiming to estimate the skill level of participants such as the Elo [6] rating method. [8] gives a recent comprehensive overview of rating methods used in sports tournaments. Our work differs from this vast body of literature in two important aspects. First, our axioms and ranking method are the first to be developed for an extended framework that we developed specifically to capture some of the peculiarities of side-choosing game tournaments such as forcing. Second, our work is the *first* to be concerned with collusion resistance.

An early version of SCG, then called Scientific Community Game, was published in [9].

This paper is based on Ahmed Abdelmeged's dissertation [1]. The dissertation is based on semantic games and does not explicitly define side-choosing games. However, the proof of the representation theorem does not rely on a specific logic. Therefore, we introduced side-choosing games in this paper to have an appropriate context for formulating and proving the representation theorem. The proofs in this paper have been simplified through the systematic use of monotonicity constraints.

## 2 Model

During SCGs many confusing events can happen: true claims might be refuted and false claims might be defended. In all this noise we would like to find order and look for quasi-perfect players and quasi equilibria.

## 2.1 Basic Predicates and Operations

 $(\forall p_x \in P, \forall r \in G(P))[particpant(p_x, r) \Leftrightarrow p_x \text{ is a participant in the game } r] \\ (\forall p_x \in P, \forall r \in G(P))[win(p_x, r) \Leftrightarrow p_x \text{ won the game } r] \\ (\forall p_x \in P, \forall r \in G(P))[loss(p_x, r) \Leftrightarrow p_x \text{ lost the game } r] \\ (\forall p_x \in P, \forall r \in G(P))[forced(p_x, r) \Leftrightarrow p_x \text{ is forced to choose a side}] \\ (\forall p_x \in P, \forall r \in G(P))[\neg control(p_x, r) \Leftrightarrow \neg participant(p_x, r) \lor (loss(p_x, r) \land forced(p_x, r))] \\ (\forall p_x \in P, \forall r \in G(P))[fault(p_x, r) \Leftrightarrow loss(p_x, r) \land \neg forced(p_x, r)] \\ (\forall p_x \in P, \forall T \subseteq G(P))[wf^T(p_x) = the win count of p_x in T in a forced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[wu^T(p_x) = the loss count of p_x in T in a forced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the loss count of p_x in T in a nunforced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the loss count of p_x in T in a nunforced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the loss count of p_x in T in a nunforced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the loss count of p_x in T in a nunforced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the loss count of p_x in T in a nunforced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the loss count of p_x in T in a nunforced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the loss count of p_x in T in a nunforced position] \\ (\forall p_x \in P, \forall T \subseteq G(P))[lu^T(p_x) = the number of games in T where p_x was not a participant] \\ (\forall p_x \in P, \forall T \subseteq G(P))[np^T(p_x) = the number of games in T where p_x was not a participant] \\ (\forall p_x \in P, \forall T \subseteq G(P))[np^T(p_x) = the number of games in T where p_x was not a participant] \\ (\forall p_x \in P, \forall T \subseteq G(P))[np^T(p_x) = the number of games in T where p_x was not a participant] \\ (\forall p_x \in P, \forall T \subseteq G(P))[np^T(p_x) = the number of games in T where p_x was not a participant] \\ (\forall p_x \in P, \forall T \subseteq G(P))[np^T(p_x) = the number of games in T where P_x was not a participant] \\ (\forall p_x \in P, \forall T \subseteq G(P))[np^T(p_x) = the number of games in T where P_x was not a participant] \\ (\forall p_x \in P, \forall T \subseteq G(P))[np^T(p_x) = the p_x (p_x) \in P_x (p_x) \in P_x (p_x) \in P_x (p_x) \in P_x$ 

## 3 Ranking

In this section, we discuss ranking the players.

## 3.1 Ranking Relation

We define a preorder  $\preceq_{U}^{T}$  called the weakly better relation  $\forall T \subseteq G$  based on the scoring function  $U : \mathbb{N} \times \mathbb{N} \times \mathbb{N} \times \mathbb{N} \to \mathbb{R}$ . For convenience, we drop the subscript and refer to it simply as  $\preceq^{T}$ .

We want to assign each player a score solely based on the players' demonstration of ability. We use the 4 statistics based on wins and losses of the player calculate the players' score. We formally define the ranking relation as,

$$\begin{aligned} (\forall p_x, p_y \in P, \forall T \subseteq G(P) : (U : \mathbb{N} \times \mathbb{N} \times \mathbb{N} \times \mathbb{N} \to \mathbb{R}))[p_x \preceq^T p_y \Leftrightarrow \\ U(wf^{\mathsf{T}}(p_x), wu^{\mathsf{T}}(p_x), wf^{\mathsf{T}}(p_x), \mathfrak{lu}^{\mathsf{T}}(p_x)) \leq U(wf^{\mathsf{T}}(p_y), wu^{\mathsf{T}}(p_y), wu^{\mathsf{T}}(p_y), \mathfrak{lu}^{\mathsf{T}}(p_y))] \end{aligned}$$
(1)

We want the ranking relation to have the following properties:

- NNEW:  $(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : win(p_x, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$
- NPEL:  $(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : loss(p_y, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$
- CR:  $(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : \neg control(p_x, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$

## 3.2 Universal Domain

From equation 1, it is clear that for every logically possible game result table T, we have a valid preorder. This implies that our ranking relaton satisfies the Universal Domain property.

### 3.3 Anonymity

From equation 1 it is clear that the scoring function ignores the identity of the player in calculating the score. Hence, the ranking relation  $\leq^{T}$  is unaffected by changing labels and therefore anonymous.

## 3.4 Montonicity of U and Notation

At the heart, NNEW and NPEL are monotonicity conditions. As we score the player solely based on the players' wins and losses, NNEW and NPEL imply that the function U is monotonic. One interesting thing about the parameters of U for a particular player is that when we add a new game to the existing game result table T, atmost one parameter increments. This allows us to use a notation that mimics the partial differential operator. The notation will come handy to prove some interesting results.

 $\partial_x U \ge 0$ : U is monotonically non-decreasing on the parameter x  $\partial_x U > 0$ : U is monotonically increasing on the parameter x  $\partial_x U \le 0$ : U is monotonically non-increasing on the parameter x  $\partial_x U <:$  U is monotonically decreasing on the parameter x  $\partial_x U = 0$ : U is indifferent on the parameter x

## 4 Properties of Ranking Relations

In this section, we formulate properties in predicate logic and dervice their equilvalent monotonicity constraints.

## 4.1 Collusion Resistance (CR)

$$CR: (\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : \neg control(p_x, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$$

Here we have 2 cases, game results where  $p_x$  did not participate and game results where  $p_x$  lost when forced.For the first case,  $p_y$  may have won or lost in a forced or unforced position against some third player  $p_z$ . Let us consider the case where  $p_y$  wins over  $p_z$  in a forced position, we have,

$$U(wf^{\mathsf{T}}(p_x), wu^{\mathsf{T}}(p_x), lf^{\mathsf{T}}(p_x), lu^{\mathsf{T}}(p_x)) \le U(wf^{\mathsf{T}}(p_y) + 1, wu^{\mathsf{T}}(p_y), lf^{\mathsf{T}}(p_y), lu^{\mathsf{T}}(p_y))$$
(2)

From equations 1 and 2, we get the monotonicity constraint,

$$\partial_{wf} U \ge 0$$
 (3)

Let us consider the case where  $p_y$  wins over  $p_z$  in an unforced position, we have,

$$U(wf^{\mathsf{T}}(\mathfrak{p}_{x}),wu^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{x})) \leq U(wf^{\mathsf{T}}(\mathfrak{p}_{y}),wu^{\mathsf{T}}(\mathfrak{p}_{y})+1,\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{y}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{y}))$$
(4)

From equations 1 and 4, we get the monotonicity constraint,

$$\partial_{wu} U \ge 0$$
 (5)

Let us consider the case where  $p_y$  loses over  $p_z$  in a forced position, we have,

$$U(wf^{\mathsf{T}}(\mathfrak{p}_{x}),wu^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{x})) \leq U(wf^{\mathsf{T}}(\mathfrak{p}_{y}),wu^{\mathsf{T}}(\mathfrak{p}_{y}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{y})+1,\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{y}))$$
(6)

From equations 1 and 6, we get the monotonicity constraint,

$$\partial_{lf} U \ge 0$$
 (7)

Let the consider the case where  $p_y$  loses over  $p_z$  in an unforced position, we have,

$$\mathbb{U}(wf^{\mathsf{T}}(p_{x}),wu^{\mathsf{T}}(p_{x}),\mathfrak{l}f^{\mathsf{T}}(p_{x}),\mathfrak{l}u^{\mathsf{T}}(p_{x})) \leq \mathbb{U}(wf^{\mathsf{T}}(p_{y}),wu^{\mathsf{T}}(p_{y}),\mathfrak{l}f^{\mathsf{T}}(p_{y}),\mathfrak{l}u^{\mathsf{T}}(p_{y})+1)$$
(8)

From equations 1 and 8, we get the montonicity constraint,

$$\partial_{\mathrm{lu}} \mathbf{U} \ge 0$$
 (9)

Now we consider game results where  $p_x$  was forced to lose against some third player  $p_z$ ,

$$U(wf^{\mathsf{T}}(p_{x}),wu^{\mathsf{T}}(p_{x}),\mathfrak{l}f^{\mathsf{T}}(p_{x})+1,\mathfrak{l}u^{\mathsf{T}}(p_{x})) \leq U(wf^{\mathsf{T}}(p_{y}),wu^{\mathsf{T}}(p_{y}),\mathfrak{l}f^{\mathsf{T}}(p_{y}),\mathfrak{l}u^{\mathsf{T}}(p_{y}))$$
(10)

From equations 1 and 10, we get the motonicity constraint,

$$\partial_{lf} U \le 0$$
 (11)

Now, CR can be summarised in terms of monotonicity constraints as,

$$\partial_{wf} U \ge 0 \land \partial_{wu} U \ge 0 \land \partial_{lf} U = 0 \land \partial_{lu} U \ge 0$$
<sup>(12)</sup>

## 4.2 Non Negative Effect of Winning (NNEW)

NNEW: 
$$(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : win(p_x, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$$

Let us consider a game result r where  $p_x$  won against a third player  $p_z$ .  $p_x$  could have won either in a forced or unforced position.

Let us consider the case where  $p_x$  wins over  $p_z$  in a forced position, we have,

$$U(wf^{\mathsf{T}}(p_{x})+1,wu^{\mathsf{T}}(p_{x}),\mathfrak{l}f^{\mathsf{T}}(p_{x}),\mathfrak{l}u^{\mathsf{T}}(p_{x})) \leq U(wf^{\mathsf{T}}(p_{y}),wu^{\mathsf{T}}(p_{y}),\mathfrak{l}f^{\mathsf{T}}(p_{y}),\mathfrak{l}u^{\mathsf{T}}(p_{y}))$$
(13)

From equations 1 and 13, we get the monotnicity constaint,

$$\partial_{wf} U \le 0$$
 (14)

Let us consider the case where  $p_x$  wins over  $p_z$  in an unforced position, we have:

$$U(wf^{\mathsf{T}}(\mathfrak{p}_{x}),wu^{\mathsf{T}}(\mathfrak{p}_{x})+1,lf^{\mathsf{T}}(\mathfrak{p}_{x}),lu^{\mathsf{T}}(\mathfrak{p}_{x})) \leq U(wf^{\mathsf{T}}(\mathfrak{p}_{y}),wu^{\mathsf{T}}(\mathfrak{p}_{y}),lf^{\mathsf{T}}(\mathfrak{p}_{y}),lu^{\mathsf{T}}(\mathfrak{p}_{y}))$$
(15)

From equations 1 and 15, we get the monotnicity constaint,

$$\partial_{wu} \mathbf{U} \le \mathbf{0}$$
 (16)

Summarising the monotonicty constraints, we have,

$$\partial_{wf} U \le 0 \land \partial_{wu} U \le 0$$
 (17)

## 4.3 Non Positive Effect of Losing (NPEL)

NPEL: 
$$(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : loss(p_y, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$$

Let us consider a game result r where  $p_y$  lost against a third player  $p_z$ .  $p_y$  could have lost either in a forced or unforced position.

Let us consider the case where  $p_y$  loses over  $p_z$  in a forced position, we have,

$$\mathcal{U}(wf^{\mathsf{T}}(p_{x}),wu^{\mathsf{T}}(p_{x}),\mathfrak{l}f^{\mathsf{T}}(p_{x}),\mathfrak{l}u^{\mathsf{T}}(p_{x})) \leq \mathcal{U}(wf^{\mathsf{T}}(p_{y}),wu^{\mathsf{T}}(p_{y}),\mathfrak{l}f^{\mathsf{T}}(p_{y})+1,\mathfrak{l}u^{\mathsf{T}}(p_{y}))$$
(18)

From equations 1 and 18, we get the monotnicity constaint,

$$\partial_{lf} U \ge 0$$
 (19)

Let us consider the case where  $p_y$  loses over  $p_z$  in an unforced position, we have,

$$U(wf^{\mathsf{T}}(\mathfrak{p}_{x}),wu^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{x})) \leq U(wf^{\mathsf{T}}(\mathfrak{p}_{y}),wu^{\mathsf{T}}(\mathfrak{p}_{y}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{y}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{y})+1)$$
(20)

From equations 1 and 20, we get the monotnicity constaint,

$$\partial_{lu} U \ge 0$$
 (21)

Summarising the monotonicty constraints, we have,

$$\partial_{lf} U \ge 0 \land \partial_{lu} U \ge 0 \tag{22}$$

## 5 Discussion

As we want the ranking relation to satisfy all the three properties NNEW, NPEL and CR, from equations 12, 17 and 22, we get the monotonicity constraints,

$$\partial_{wf} U = 0 \land \partial_{wu} U = 0 \land \partial_{lf} U = 0 \land \partial_{lu} U \ge 0$$
<sup>(23)</sup>

This tells us that the scoring function should be monotonically non-decreasing on faults and indifferent on other parameters. We call the ranking relation that uses a scoring function that satisfies equation 23 as Local Fault Based (LFB). The monotonicity constraints in equation 23 can be easily reformulated in predicate logic. The reformulation is given in section 5.1. Also, we define a so far not covered property called Independent of Irrelevant Games (IIG) in section 5.2. IIG is well-known in the Social Choice literature

#### 5.1 Local Fault Based (LFB)

$$LFB:(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : \neg fault(p_x, r) \land \neg fault(p_y, r))[p_x \preceq^T p_y \Leftrightarrow p_x \preceq^{T \cup \{r\}} p_y]$$

The monotonicity constraints are the same as equation 23. Repeating here, we have,

$$\partial_{wf} U = 0 \land \partial_{wu} U = 0 \land \partial_{lf} U = 0 \land \partial_{lu} U \ge 0$$
<sup>(24)</sup>

## 5.2 Independent of Irrelevant Games (IIG)

$$\begin{split} \text{IIG:} (\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : \neg participant(p_x, r) \land \neg participant(p_y, r))[p_x \preceq^T p_y \Leftrightarrow p_x \preceq^{T \cup \{r\}} p_y] \end{split}$$

This property just means that relative ranking does not depend on the games where neither  $p_x$  nor  $p_y$  has participated. From the definitions of LFB and IIG, it is simple to deduce that,

$$LFB \Rightarrow IIG$$
 (25)

But,

$$IIG \neq LFB$$
(26)

This leads us to the conclusion that LFB is at least as strong as IIG.

## 6 Representation theorem

In this section, we prove an interesting result that will aid us in exploring the appropriate set of scoring functions. Let us first summarise the properties in monotonicity constraints

## 6.1 Summary of Monotonicity Constraints

$$\begin{split} \text{CR:} \ \partial_{wf} U &\geq 0 \ \land \ \partial_{wu} U \geq 0 \ \land \ \partial_{lf} U = 0 \ \land \ \partial_{lu} U \geq 0 \\ \text{LFB:} \ \partial_{wf} U &= 0 \ \land \ \partial_{wu} U = 0 \ \land \ \partial_{lf} U = 0 \ \land \ \partial_{lu} U \geq 0 \\ \text{NNEW:} \ \partial_{wf} U &\leq 0 \ \land \ \partial_{wu} U \leq 0 \\ \text{NPEL:} \ \partial_{lf} U &> 0 \ \land \ \partial_{lu} U > 0 \end{split}$$

### 6.2 The Theorem : NNEW $\land$ NPEL $\Rightarrow$ (CR $\Leftrightarrow$ LFB)

It is easy to derive the following relations from the monotonicity constraints summarised above,

$$NNEW \land CR \Rightarrow LFB \tag{27}$$

$$NPEL \wedge LFB \Rightarrow CR \tag{28}$$

From equations 27 and 28, we deduce that,

$$NNEW \land NPEL \Rightarrow (CR \Leftrightarrow LFB)$$
<sup>(29)</sup>

## 7 Ramifications of the Representation Theorem

### 7.1 IIG and Representation theorem

We discuss if non participation as a parameter in the scoring function U would have any effect on the monotonicity constraints we have derived so far. For that, we have to derive the monotonicity constraint for IIG. The number of games  $p_x$  has not participated in is defined as,

$$np^{\mathsf{T}}(p_{\mathsf{x}}) = |\mathsf{T}| - wf^{\mathsf{T}}(p_{\mathsf{x}}) - wu^{\mathsf{T}}(p_{\mathsf{x}}) - \mathfrak{l}f^{\mathsf{T}}(p_{\mathsf{x}}) - \mathfrak{l}u^{\mathsf{T}}(p_{\mathsf{x}})$$
(30)

From equations 1 and 30, it is clear that we can calculate  $np^{T}(p_{x})$  from |T| and existing 4 parameters of U. To account for non participation, we can redefine the ranking relation as,

$$(\forall p_x, p_y \in P, T \subseteq G(P) : (U : \mathbb{N} \times \mathbb{N} \times \mathbb{N} \times \mathbb{N} \times \mathbb{N} \to \mathbb{R}))[p_x \preceq^{I} p_y \Leftrightarrow U(wf^{\mathsf{T}}(p_x), wu^{\mathsf{T}}(p_x), wf^{\mathsf{T}}(p_x), \mathfrak{lu}^{\mathsf{T}}(p_x), |\mathsf{I}|) \leq U(wf^{\mathsf{T}}(p_y), wu^{\mathsf{T}}(p_y), wu^{\mathsf{T}}(p_y), [\mathsf{I}|)]$$
(31)

Now let us add a game result r where neither  $p_x$  nor  $p_y$  participate. From the definition of IIG we have,

$$U(wf^{T}(p_{x}), wu^{T}(p_{x}), lf^{T}(p_{x}), lu^{T}(p_{x}), |T|+1) \leq U(wf^{T}(p_{y}), wu^{T}(p_{y}), lf^{T}(p_{y}), lu^{T}(p_{y}), |T|+1)$$
(32)

For equations 31 and 32 to hold together, we need that equations 33 and 34 to hold. First, we focus on  $p_x$  and we need that,

$$U(wf^{T}(p_{x}), wu^{T}(p_{x}), lf^{T}(p_{x}), lu^{T}(p_{x}), |T|+1) \leq U(wf^{T}(p_{x}), wu^{T}(p_{x}), lf^{T}(p_{x}), lu^{T}(p_{x}), |T|)$$
(33)

Now, we focus on  $p_y$  and we need that,

$$\mathbb{U}(wf^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),wu^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),|\mathsf{T}|+1) \geq \mathbb{U}(wf^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),wu^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{\mathfrak{y}}),|\mathsf{T}|)$$
(34)

This gives us the monotonicity constraints,

$$\partial_{|\mathsf{T}|} U \le 0 \land \partial_{|\mathsf{T}|} U \ge 0 \tag{35}$$

This is the same as,

$$\partial_{|\mathsf{T}|} \mathsf{U} = 0 \tag{36}$$

From equation 36, it is clear that the IIG is the same as the scoring function U being indifferent to |T|. From equations 25 and 29, we have,

$$CR \Rightarrow IIG$$
 (37)

From equations 36 and 37, it is clear that when CR holds, our initial formulation of not choosing |T| as a parameter in U is reasonable. This means that we need not revise the monotonicity constraints in section 6.1.

### 7.2 Incentive Compatibility (IC)

IC: 
$$(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : fault(p_y, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$$

This is equivalent to incentivising not making faults. Let us first consider the game where  $p_y$  made a fault with a third player  $p_z$ . In that case,

$$U(wf^{\mathsf{T}}(p_x), wu^{\mathsf{T}}(p_x), lf^{\mathsf{T}}(p_x), lu^{\mathsf{T}}(p_x)) \le U(wf^{\mathsf{T}}(p_y), wu^{\mathsf{T}}(p_y), lf^{\mathsf{T}}(p_y), lu^{\mathsf{T}}(p_y) + 1)$$
(38)

From equations 1 and 38, we get the monotnicity constraint,

$$\partial_{lu} U \ge 0$$
 (39)

Now, let us consider the game where  $p_y$  made a fault in a game with  $p_x$ . In this case, there are 2 distinct possibilities. The first is  $p_x$  won the game and was forced, we have

$$U(wf^{\mathsf{T}}(p_{x})+1,wu^{\mathsf{T}}(p_{x}),lf^{\mathsf{T}}(p_{x}),lu^{\mathsf{T}}(p_{x})) \leq U(wf^{\mathsf{T}}(p_{y}),wu^{\mathsf{T}}(p_{y}),lf^{\mathsf{T}}(p_{y}),lu^{\mathsf{T}}(p_{y})+1)$$
(40)

From equations 38 and 40, we get the monotnicity constraint,

$$\partial_{wf} U \le 0$$
 (41)

Let us consider the case where  $p_x$  won in an unforced position.

$$U(wf^{T}(p_{x}), wu^{T}(p_{x}) + 1, lf^{T}(p_{x}), lu^{T}(p_{x})) \le U(wf^{T}(p_{y}), wu^{T}(p_{y}), lf^{T}(p_{y}), lu^{T}(p_{y}) + 1)$$
(42)

From equations 38 and 42, we get the monotnicity constraint,

$$\partial_{wu} U \le 0$$
 (43)

Summarising the monotonicty constraints for IC, we have,

$$\partial_{wf} U \le 0 \land \partial_{wu} U \le 0 \land \partial_{lu} U \ge 0 \tag{44}$$

From equations 24 and 44, we have that,

$$LFB \Rightarrow IC$$
 (45)

From equations 17 and 44, we have that,

$$IC \Rightarrow NNEW$$
 (46)

## 7.3 Example Scoring functions that are LFB

The representation theorem motivates us to explore the set of scoring functions that are LFB. Here, we list a set of 3 representative examples. It is useful to have families of LFB ranking functions to choose an appropriate member for a given competition.

#### 7.3.1 Everyone get the same score

The simplest example of a LFB scoring sunction is where every player gets the same score.

$$U(wf^{\mathsf{T}}(p_{x}), wu^{\mathsf{T}}(p_{x}), lf^{\mathsf{T}}(p_{x}), lu^{\mathsf{T}}(p_{x})) = 0$$
(47)

It is easy to see that this scoring function satisfies the following monotonicity constraints,

$$\partial_{wf} U = 0 \land \partial_{wu} U = 0 \land \partial_{lf} U = 0 \land \partial_{lu} U = 0$$
(48)

From equations 24 and 48, it is clear that this scoring function is LFB.

#### 7.3.2 Regular fault counting

Another example would be to count faults.

$$\mathcal{U}(wf^{\mathsf{T}}(\mathfrak{p}_{x}),w\mathfrak{u}^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}\mathfrak{u}^{\mathsf{T}}(\mathfrak{p}_{x})) = \mathfrak{l}\mathfrak{u}^{\mathsf{T}}(\mathfrak{p}_{x})$$

$$\tag{49}$$

This scoring function satisfies the following monotonicity constraints,

$$\partial_{wf} U = 0 \land \partial_{wu} U = 0 \land \partial_{lf} U = 0 \land \partial_{lu} U > 0$$
(50)

From equations 24 and 50, it is clear that this scoring function is LFB.

## 7.3.3 Weighted fault counting

Now, we explore a more general version of fault counting. We consider positive weights assignment to fault classes where:

- The winner is a forced opponent, weakness in proponent ( $\alpha$  fault): Weight =  $\alpha$ .
- The winner is a forced proponent, weakness in opponent ( $\beta$  fault): Weight =  $\beta$ .
- The winner is a non-forced opponent, weakness in proponent ( $\gamma$  fault): Weight =  $\gamma$
- The winner is a non-forced proponent, weakness in opponent ( $\delta$  fault): Weight =  $\delta$

At this juncture, we need to define a few functions,

$$(\forall p_x \in P, \forall T \subseteq G(P))[lu_{\alpha}^T(p_x)] = the number of \alpha faults of p_x in T]$$

- $(\forall p_x \in P, \forall T \subseteq G(P))[\iota u_{\beta}^T(p_x) = \text{the number of } \beta \text{ faults of } p_x \text{ in } T]$
- $(\forall p_x \in P, \forall T \subseteq G(P))[lu_{\gamma}^T(p_x)] = the number of \gamma faults of p_x in T]$
- $(\forall p_x \in P, \forall T \subseteq G(P))[\iota u_{\delta}^T(p_x) = \text{the number of } \delta \text{ faults of } p_x \text{ in } T]$

It is also very clear that,

$$lu^{\mathsf{T}}(\mathbf{p}_{\mathbf{x}}) = lu^{\mathsf{T}}_{\alpha}(\mathbf{p}_{\mathbf{x}}) + lu^{\mathsf{T}}_{\beta}(\mathbf{p}_{\mathbf{x}}) + lu^{\mathsf{T}}_{\gamma}(\mathbf{p}_{\mathbf{x}}) + lu^{\mathsf{T}}_{\delta}(\mathbf{p}_{\mathbf{x}})$$
(51)

Now, we define the scoring function as,

$$U(wf^{\mathsf{T}}(\mathbf{p}_{x}), wu^{\mathsf{T}}(\mathbf{p}_{x}), lf^{\mathsf{T}}(\mathbf{p}_{x}), lu^{\mathsf{T}}(\mathbf{p}_{x})) = \alpha \cdot lu_{\alpha}^{\mathsf{T}}(\mathbf{p}_{x}) + \beta \cdot lu_{\beta}^{\mathsf{T}}(\mathbf{p}_{x}) + \gamma \cdot lu_{\gamma}^{\mathsf{T}}(\mathbf{p}_{x}) + \delta \cdot lu_{\delta}^{\mathsf{T}}(\mathbf{p}_{x})$$
(52)

 $\forall \alpha, \beta, \gamma, \delta \in \mathbb{R}^+$ , it is easy to observe that this scoring function satisfies the following monotonicity constraints,

$$\partial_{wf} U = 0 \land \partial_{wu} U = 0 \land \partial_{lf} U = 0 \land \partial_{lu} U > 0$$
(53)

From equations 24 and 53, it is clear that this scoring function is LFB.

#### 7.3.4 Insights on weighted fault counting

The game result abstraction that we have used so far (see section 1) works because we don't know beforehand which side is the winning side as we are exploring the truth of the claim C. So, it's inherently unfair to penalize using weights for different kind of faults. A related question is that, in the case of weighted fault counting, the table T is inadequate as we won't be able to decipher the exact type of fault. Another way to put it would be to say that the simplified game result is inherently lossy. To overcome this, we need to add another column in the game result table that lists the proponent. Now, for convenience, we redefine the scoring function as,

$$U(\iota u_{\alpha}^{\mathsf{T}}(\mathfrak{p}_{x}), \iota u_{\beta}^{\mathsf{T}}(\mathfrak{p}_{x}), \iota u_{\gamma}^{\mathsf{T}}(\mathfrak{p}_{x}), \iota u_{\delta}^{\mathsf{T}}(\mathfrak{p}_{x})) = \alpha \cdot \iota u_{\alpha}^{\mathsf{T}}(\mathfrak{p}_{x}) + \beta \cdot \iota u_{\beta}^{\mathsf{T}}(\mathfrak{p}_{x}) + \gamma \cdot \iota u_{\gamma}^{\mathsf{T}}(\mathfrak{p}_{x}) + \delta \cdot \iota u_{\delta}^{\mathsf{T}}(\mathfrak{p}_{x})$$
(54)

From equation 54,  $\forall \alpha, \beta, \gamma, \delta \in \mathbb{R}^+$ 

$$\partial_{\iota u_{\alpha}} U > 0 \land \partial_{\iota u_{\beta}} U > 0 \land \partial_{\iota u_{\gamma}} U > 0 \land \partial_{\iota u_{\delta}} U > 0$$
(55)

But,

$$\mathfrak{lu}^{\mathsf{T}}(\mathfrak{p}_{\mathsf{x}}) = \mathfrak{lu}_{\alpha}^{\mathsf{T}}(\mathfrak{p}_{\mathsf{x}}) + \mathfrak{lu}_{\beta}^{\mathsf{T}}(\mathfrak{p}_{\mathsf{x}}) + \mathfrak{lu}_{\gamma}^{\mathsf{T}}(\mathfrak{p}_{\mathsf{x}}) + \mathfrak{lu}_{\delta}^{\mathsf{T}}(\mathfrak{p}_{\mathsf{x}})$$
(56)

From equations 55 and 56, it is clear that,

$$\partial_{\iota u_{\alpha}} U > 0 \land \partial_{\iota u_{\beta}} U > 0 \land \partial_{\iota u_{\gamma}} U > 0 \land \partial_{\iota u_{\delta}} U > 0 \Rightarrow \partial_{\iota u} U > 0$$
(57)

From equation 57, it is clear that weighted fault counting is LFB.

#### 7.3.5 Application of weighted fault counting

Now, we switch to exploring an application of weighted fault counting. In tournaments with claims of unknown correctness, it is unfair to penalise faults differentialy. But, in games designed for peer learning, where the correctness of the claims are known beforehand, it makes sense to penalise faults differentially. This has the desirable outcome of sorting the better players and also encouraging the weaker players to learn from the stronger players on outcomes of specific claims thereby having an effect similar to learning by example.

Karl:

A high  $\alpha$  encourages forced opponents to try to win. Tests agreement on proponent.

A high  $\beta$  encourages forced proponents to try to win. Tests agreement on opponent.

A high  $\gamma$  encourages non-forced opponents to try to win. Tests non-agreement or agreement on opponent.

A high  $\delta$  encourages non-forced proponents to try to win. Tests non-agreement or agreement on proponent.

All four might lead to a better quasi equilibrium.

## 8 Top Ranking and Meritocracy

In this section we show a desirable implication of collusion-resistance. We introduce the concept of quasi-perfect player and show that quasi-perfect players are top-ranked iff the ranking relation is collusion-resistant. The quasiperfect players are the players which have the minimum number of faults among all players. A quasi-perfect player may defend false claims and refute true claims and make "wrong" side choices. This differs from a perfect player who always makes the correct side-choices and successfully defends her choice.

To talk about top ranking, we need to first define the strictly better relation  $\prec^{T}$ .

$$(\forall p_x, p_y \in P, \forall T \subseteq G(P) : (U : \mathbb{N} \times \mathbb{N} \times \mathbb{N} \times \mathbb{N} \to \mathbb{R}))[p_x \prec^T p_y \Leftrightarrow U(wf^T(p_x), wu^T(p_x), wf^T(p_x), u^T(p_x)) < U(wf^T(p_y), wu^T(p_y), u^T(p_y))]$$
(58)

## 8.1 Top Ranking

A player p in a set of players P is said to be top-ranked  $TR^{T}(p)$  in a set of game results T, if there is no player that is strictly better than p. More generally, it is defined in predicate logic as,

$$(\forall \mathbf{p}, \mathbf{p}_{\mathbf{x}} \in \mathbf{P}, \forall \mathbf{T} \subseteq \mathbf{G}(\mathbf{P}))[\mathsf{TR}^{\mathsf{T}}(\mathbf{p}) \Leftrightarrow \neg(\mathbf{p}_{\mathbf{x}} \prec^{\mathsf{T}} \mathbf{p})]$$
(59)

#### 8.2 Quasi Perfection

A quasi-perfect player for a set of players is a player who makes the least number of faults within the set of players. A perfect player always chooses the correct side and always wins the defense and therefore is quasi-perfect. Such a player makes no faults.

#### 8.3 Meritocracy Theorem

To Ruiyang:

There is an issue with the proof that CR is necessary for quasi-perfect players to be top-ranked. A ranking relation R has the quasi-top property quasiTop(P, R), for a set of players P if all quasi-perfect players in P are top-ranked. Can you show that if a ranking relation for P is not CR than it is not quasiTop, i.e.,

$$\forall P \forall R(P) : quasiTop(P, R(P)) \Rightarrow CR(P, R(P)).$$

I was looking for a constructive proof which constructs for a ranking-relation that is not CR a set of games where there exists a quasi-perfect player that is not top-ranked.

Raghav was suggesting that there is an other proof based on monotonicity constraints which shows

$$\forall P \forall R(P) : quasiTop(P, R(P)) \Rightarrow CR(P, R(P)).$$

Can you help us to complete the proof of the Meritocracy theorem?

- CR is necessary: If the ranking relation is not collusion-resistant (CR) but NNEW  $\land$  NPEL, there exists a set of games where a quasi-perfect player is not top-ranked.
- CR is sufficient: NNEW  $\land$  NPEL  $\land$  CR imply that all quasi-perfect players are top-ranked.

Let us prove the first part of the theorem. First, we write down the monotonicty contraints for  $\neg CR$  and NNEW  $\land$  NPEL. We have,

$$\neg CR: \partial_{wf} U < 0 \lor \partial_{wu} U < 0 \lor \partial_{lf} U > 0 \lor \partial_{lf} U < 0 \lor \partial_{lu} U < 0$$
(60)

NNEW 
$$\wedge$$
 NPEL:  $\partial_{wf} U \leq 0 \wedge \partial_{wu} U \leq 0 \wedge \partial_{lu} U \geq 0 \wedge \partial_{lf} U \geq 0$  (61)

The equations 60 and 61 give us a clue into exploring a scoring function for our ranking relation that is  $\neg$ CR, but NNEW  $\land$  NPEL. One proposal for such a scoring function is,

$$U(wf^{\mathsf{T}}(p_{x}), wu^{\mathsf{T}}(p_{x}), lf^{\mathsf{T}}(p_{x}), lu^{\mathsf{T}}(p_{x})) = -(wf^{\mathsf{T}}(p_{x}) + wu^{\mathsf{T}}(p_{x}))$$
(62)

With the scoring function as specified by equation 62 (which is basically counting the total number of wins for a particular player), consider the table 2 of game results. Here, player 1 is top ranked with the 4 wins and 2 faults. But, player 2, the quasi perfect player with no faults is not top ranked. This proves the first part of the meritocracy theorem.

To prove the second part of the theorem, we use the meritocracy theorem. From equation 29, we know that with NNEW  $\land$ NPEL, CR is the same as LFB. From the very definition of a quasi perfect player being the one with the least faults and LFB just being a scoring function that is non decreasing on faults and being non responsive to other parameters, it is clear that the quasi perfect player will be top ranked.

A small observation we need to make is that NNEW  $\land$  NPEL impose monotonicity on the scoring function  $U : \mathbb{N} \times \mathbb{N} \times \mathbb{N} \times \mathbb{N} \to \mathbb{R}$ . This justifies our approach of expressing  $\neg CR$  in terms of monotonicity constraints. This is important as CR has a universal quantifier (see section 4.1), making  $\neg CR$  have an existential quantifier. So, a possible choice for a  $\neg CR$  scoring function is a non monotonic one, but such a function would not guarantee NNEW  $\land$  NPEL.

GRID	Winner	Loser	Forced
gr1	1	2	2
gr2	1	3	-
gr3	1	2	2
gr4	2	1	-
gr5	2	3	2
gr6	2	3	-
gr6 gr7	3	1	-
gr8	1	3	1

Table 2: A Table T of game results for 3 players

#### 8.4 A try at a Non Constructive Proof

We need that a quasi perfect player should be top ranked. Say,  $p_x$  made k faults and other players made more than k faults. We need to explore the monotonicity conditions for  $p_X$  to be top ranked. This requires that, If  $lu^T(p_x) \leq lu^T(p_y), \forall p_y \in P \setminus \{p_x\}$ , we need that,

$$U(wf^{\mathsf{T}}(\mathfrak{p}_{x}),wu^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{x}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{x})) \leq U(wf^{\mathsf{T}}(\mathfrak{p}_{y}),wu^{\mathsf{T}}(\mathfrak{p}_{y}),\mathfrak{l}f^{\mathsf{T}}(\mathfrak{p}_{y}),\mathfrak{l}u^{\mathsf{T}}(\mathfrak{p}_{y}))$$
(63)

As equation 63 should be true for any choice of the other 3 parameters of U, except for the constraint on faults, we can conclude that the only monotonicity constraint is that the scoring function should be non-decreasing on faults. So, the monotonicity contraint for quasi-perfect players to be top ranked is,

$$\partial_{wf} U = 0 \land \partial_{wu} U = 0 \land \partial_{lf} U = 0 \land \partial_{lu} U \ge 0$$
(64)

From equations 24 and 64, it is clear that,

Quasi Perfect player being Top Ranked 
$$\Leftrightarrow$$
 LFB (65)

From equations 29 (The Representation Theorem) and 65, we get,

Quasi Perfect player being Top Ranked 
$$\Leftrightarrow LFB \Leftrightarrow CR$$
 (66)

From equation 66, we can see that ¬CR implies that Quasi Perfect player might not be top ranked.

## 9 Skype Call Summaries

## 9.1 Dec. 12, 2014

NNEW and NPEL imply monotonicity of Scoring function U.

Introduce independence of irrelevant games (IIG) as additional axiom. CR implies IIG.

Definition of independence of irrelevant games: The ranking of two players only depends on the games in which at least one participates.

What can we say about NNEW and NPEL and IIG? Table-size is irrelevant.

Is collusion possible? Yes.

Introduce collusion resistance. Provides a useful form of anonymity. Introduces another kind of row that is irrelevant: a player p who is forced and loses: such a row cannot lower the rank of p. Affinity to NNEW.

### 9.2 Dec. 16, 2014

Where is the Universal Domain property?

No neutrality: Side-choosing games don't support neutrality because it does not make sense to change sidechoices (in analogy to changing votes).

Introduce two names for game results: with and without the game result identifier. GR(P): without game result identifier. G(P): with game result identifier.

There are two kinds of anonymity: scoring function/ranking relation based and non-anonymity to influence game results.

Introduce family of LFB ranking functions.

Add section 8 to discuss extensions: independence of table size.

In introduction discuss problem with sybils and collusion.

#### 9.2.1 Short Proof: LFB implies CR

We provide a short proof

CR:  $(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : \neg control(p_x, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$ 

 $LFB: (\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : \neg fault(p_x, r) \land \neg fault(p_y, r))[p_x \preceq^T p_y \Leftrightarrow p_x \preceq^{T \cup \{r\}} p_y]$ 

We assume that LFB holds. if both  $p_x$  and  $p_y$  have not made a fault, there are two cases:

• Case 1

Both don't participate. This implies that both did not make a fault and therefore both are not in control. From the LFB side we know that adding such a row does not change the ranking. Therefore CR is implied.

• Case 2 One player must have been forced because the game only has a winner and loser. The winner, by definition, does not make a fault. The loser does not make a fault iff it is forced. The player who is forced is not in control. From the LFB side we know that adding a row where none made a fault does not change the ranking. Therefore LFB implies CR for the second case.

It is interesting that this direction does not require NNEW and NPEL.

For the opposite direction we need the proof based on monotonicity constraints. But LFB implies CR holds unconditionally. This can also be seen directly from the proof of the representation theorem.

### 9.2.2 Dec. 23

• Logical relationships between properties.

We have 4 Boolean properties: NNEW, NPEL, LFB, CR with the following relationships (1a) to (1d). This gives more information than only the representation theorem which is implied by (1c) and (1d).

- (1a) LFB implies NNEW
- (1b) LFB implies NPEL
- (1c) LFB implies CR
- (1d) (CR and NNEW and NPEL) implies LFB

Representation Theorem: (NNEW and NPEL) implies (LFB iff CR) (implied by (1c) and (1d))

• Logical relationships involving IIG.

CR implies IIG

LFB implies IIG

not (IIG implies LFB)

### 9.2.3 Dec. 28

Raghav uses the following to deincentivize faults:

IC: 
$$(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : fault(p_y, r))[p_x \preceq^T p_y \Rightarrow p_x \preceq^{T \cup \{r\}} p_y]$$

What if we use instead:

IC':  $(\forall p_x, p_y \in P, \forall T \subseteq G(P), \forall r \in G(P) \setminus T : fault(p_y, r))[p_x \preceq^T p_y \Rightarrow p_x \prec^{T \cup \{r\}} p_y]$ 

Note that the last "weakly better" is replaced by "better." IC' more strongly deincentivzes faults. IC implies NNEW. IC' implies NNEW.

We decided to use the following **definition of quasi-perfect:** A quasi-perfect player for a group of players is a player who makes the least number of faults within the group. (A perfect player always chooses the correct side and always wins the defense and therefore is quasi-perfect. She makes 0 faults.)

**Definition of top-ranked** for a set of players Ps: TR(p in Ps) = There is no player p1 (p1 != p) that is strictly better than p.

Equivalent?: For all p1 in Ps s.t. p1 != p: p is weakly better than p1. top-ranked is defined in terms of the total preorder.

We say that  $p_x$  is strictly better than  $p_y$  if  $p_y \not\preceq p_x$ .

Meritoracy Theorem

Part 1: [CR is necessary]: If ranking function is not collusion-resistant (CR) but NNEW and NPEL, there exists a set of games where a quasi-perfect player is not top-ranked. Part 2: [CR is sufficient] NNEW and NPEL and CR imply that all quasi-perfect players are top-ranked.

See 7.3 for set of monotonicity constraints that should be helpful to construct the set of games.

The proof of part 2 relies on representation theorem. We know that LFB holds.

**Space of LFB ranking functions** Give 3 representative examples? a) count faults b) give different weights to faults: other forced/unforced c) give all the same score.

#### 9.2.4 Dec. 29, 2014

Produce a Venn diagram that summarizes the results. Use www.lucidchart.com to conveniently draw it? Or just powerpoint?

We have 5 Boolean variables: NNEW,NPEL,CR,LFB,IC. If they are in general position, we have 32 different subsets. Because of the properties, such as (LFB implies CR), (IC implies NNEW), we have many fewer. How many? This venn diagrams should be acompanied by a legend which lists all properties we proved.

IC' implies IC.

not(LFB implies IC'). Counterexample: everybody gets same rank. Is LFB but not IC'.

Reviewing the definition of quasi-perfect: minimum number of faults (lu) and maximum number of wins when opponent is forced (waf = win against forced). A perfect player has lu=0 and waf=all. When no lu-events happen and all events are waf-events: quasi equilibrium. quasi equilibrium is equilibrium if players are perfect.

quasi-equilibrium: all players choose same side, only waf-events.

Table T, set of game results. T is at quasi-equilibrium if there are only waf events in T. A player p is quasi-perfect for T if p has made the minimum number of faults among all players in T.

#### WLF

1 2 2 win against forced event

1 2 1 not win against forced event

#### 9.2.5 Jan. 5, 2015

Raghav: definition of top-ranked needs to be generalized.

Raghav: NPEL and NNEW imply that U is monotonic.

Raghav: has a (non-constructive proof?) that (quasi-perfect implies top-ranked) is equivalent to LFB. If not LFB there exists a T where a quasi-perfect player is not top-ranked. We would like to have an algorithm for constructing such a table.

Raghav: Note that not CR means that U is still monotonic.

#### 9.2.6 Ahmed email Jan. 6, 2015

How to sell side-choosing games

First explain CR as a desirable property. Side-choice is an enabler of CR tournaments. What is a CR tournament? Needs a definition of "control"? CR tournament: There exists a ranking function U so that qp players for U are top-ranked.

Reputation systems for the players in tournaments have to overcome a significant challenge: collusion. Players might collude and artificially raise the score of one of their selected friends by intentionally losing against that friend. We have found a family of reputation systems for tournaments that are provably collusion-resistant (CR).

CR means that if a player is not in control of a game, the result of that game will not affect the ranking of the player. Our notion of control is based on the definition of side choice.

"score-based ranking function" -> "rating function"

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## 10 Appendix

## 10.1 Formal Definition of SCG

A side-choosing game is a triple (G, SC, AA), where G is a two-person, draw-free, combinatorial game, SC is a side-choice configuration and AA is an agreement algorithm. G, SC and AA are defined separately. The important component is the combinatorial game G; SC and AA offer variation possibilities to define the side-choosing games. We will use simple instances of SC and AA for our side-choosing games.

#### 10.1.1 Definition: Combinatorial Game

- 1. There are two players. The game is sequential (turn-based) and Perfect-Information. There are no chance moves or hidden information. (But players may hide their winning strategies.)
- 2. There is a finite set of possible positions of the game. There is a distinguished start position.
- 3. The rules of the game specify, for both players and each position, which moves to other positions are legal moves.
- 4. The game ends when a position is reached from which no moves are possible. A predicate on the final position determines who has won. There is an absolute winner: the first player to fulfill the winning condition. No ties or draws.
- 5. The game ends in a finite number of moves.

We use the following terminology: There is a design-time decision for P(roponent)/O(pponent). This is the design time for the winning strategy to demonstrate that the start position is winning or not. The side choice P says that the start position is winning; O that it is not winning. There is a run-time decision for P(roponent)/O(pponent). This is the decision used when the game executes and might involve forcing at most one participant.

The side-choosing game SCG(G, x, y, dx, dy, rx, ry) is a game between x and y, where x makes design-time choice dx and y makes design-time choice dy. The run-time choices are rx and ry. If x is forced then rx = !dx and ry = dy. If y is forced then rx = dx and ry = !dy. The claim is: in the start position of G the player in the P role (d\* = P) has a winning strategy. dx, dy, rx, ry have values in  $\{P, O\}$ . z has values in  $\{x, y\}$ . !z = x if z = y. !z = y if z = x. !P = O, !O = P.

#### 10.1.2 Side-Choice Configuration Definition

The side choices are made by the players but the Side-choice Configuration (SC) defines the sequencing of the design-time decisions. We have two players, x and y, who make a choice dx and dy for the start position of the combinatorial game G. dx, dy are elements of {P, O}. If x chooses dx = P then x claims to win the combinatorial game G from the game's start position. If x chooses dx = O then x claims to prevent y from winning G from its start position. The players make the side choices but SC specifies the configuration. Examples for SC :

• simultaneous

The two players make side choice independently. This is our preferred side-choice configuration.

• sequential

With probability q for x to be the first player. Or we can choose other context-sensitive mechanisms to select the first player.

#### 10.1.3 Agreement Algorithm Definition

The agreement algorithm maps two players x, y x, y with their design-time side choices dx, dy, where dx = dy, into a set of plays between the two players with, for each play, run-time side choices rx, ry such that at most one player is forced.

• Example Agreement algorithm CAA (Competitive Agreement Algorithm):

Randomly choose z, one of the players x, y and force z.

- Play SCG(G, x, y, dz, d!z, !dz, d!z); z is forced
- Play SCG(G, x, y, dz, d!z, dz, !d!z); !z is forced

Motivation for CAA: For some claims it is a disadvantage to have to move first because you give away a "secret". Therefore, we choose the forced player randomly to balance the potential disadvantage. We play two games to give each player a chance to test the other. This is our preferred agreement algorithm.

• Alternative Example for Agreement Algorithm

CAA-1/2 only plays one game choosing the forced player randomly. CAA-1/2 (Competitive Agreement Algorithm 1/2): Randomly choose z, one of the players x, y and force z.

- Play SCG(G, x, y, dz, d!z, !dz, d!z); z is forced

## 10.2 Example Claims

We provide three example claims to illustrate how side-choosing games work.

10.3

10.4

10.4.1