

Best reply dynamics for scoring rules

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Introduction

Voting game

- Player (voter) action is to submit an **expressed vote** (possibly different from its **sincere preference**).
- We are interested in the equilibrium result to predict the winner of election.
- Gibbard-Satterthwaite and other theorems show that dominant strategies don't always exist.
- The common solution concept is Nash Equilibrium (NE).
- Far too many NE exist and some of them are trivial. Also, voters cannot coordinate on one equilibrium.

Dynamic process of convergence

- We can use learning models or dynamic process (iterative games) as a coordination device
- Fudenberg and Levine (1998): "In some cases, most learning models do not converge to any equilibrium and just coincide with the notion of rationalizability."
- However, if it converges, it necessarily finds a NE.
- It has application for voting in finding consensus: doodle.com, etc.

Best reply dynamics

- In the voting case it has only been used by Meir et al, for **best-reply dynamics (BRD)** as far as we know (AAAI 2010).
- The first player moves, then another one responds, etc
- Players move one at a time and in each move, they do a best reply.
- Myopic moves, no communication between players and zero knowledge of others.

Basic setup

- We have a set \mathcal{C} of **alternatives** (candidates) and set \mathcal{V} of **voters**, with $m := |\mathcal{C}|$, $n := |\mathcal{V}|$.
- Each voter v submits a permutation $L(v)$ of the candidates. This defines the set \mathcal{T} of **types**, and $|\mathcal{T}| = m!$.
- A **profile** is a function $\mathcal{V} \rightarrow \mathcal{T}$. A **voting situation** is a multiset from \mathcal{T} with total weight n .
- The **scoring rule** determined by a vector w with $w_1 \geq w_2 \geq \dots \geq w_{m-1} \geq w_m$ assigns the score

$$|c| := \sum_{t \in \mathcal{T}} |\{v \in \mathcal{V} \mid L(v) = t\}| w_{L(v)^{-1}(c)}.$$

- Special cases:
 - plurality: $w = (1, 0, 0, \dots, 0)$;
 - antiplurality (veto): $w = (1, 1, \dots, 1, 0)$;
 - Borda: $w = (m-1, m-2, \dots, 1, 0)$.

An example of BRD

Consider antiplurality system with 2 voters $\mathcal{V} = \{1, 2\}$ and 4 candidates $\mathcal{C} = \{a, b, c, d\}$, alphabetically tie-breaking. The sincere profile is $P_0 = (acbd, bacd)$. If voters start from sincere state, we have

$$\begin{aligned} (-d, -d)\{a\} &\xrightarrow{2} (-d, -a)\{b\} \xrightarrow{1} (-b, -a)\{c\} \xrightarrow{2} \\ &(-b, -c)\{a\} \end{aligned}$$

The best reply is not unique. For example, the last move by second player can instead be $-d$. However, $-c$ (vetoing the current winner) is what we call **Restricted Best Reply (RBR)** for antiplurality .

- Plurality voting
- Other assumptions:
 - Behaviour : **RBR** at each step or best reply.
 - Indifference: **keep last move** or truth-biased.
 - Initial state: **sincere profile** or arbitrary profile.
 - Tiebreaking: **deterministic** or **uniform random**.
 - Voters: **unweighted** or weighted.
- Convergence for plurality under red hypotheses in at most $m^2 n^2$ steps.

Results:

- Deterministic tiebreaking from an arbitrary initial state converges for unweighted voters.
- The winner is the sincere winner or a candidate at most 1 point behind initially.
- In each case, changing each red hypothesis and keeping the others yields examples of non-convergence.

Example of cycle in BRD

Example

Consider the sincere profile $P_0 = (abc, bca)$ and voting rule Borda and alphabetical tie-breaking.

$$\begin{aligned} (abc, bca)\{b\} &\xrightarrow{1} (acb, bca)\{a\} \xrightarrow{2} (acb, cba)\{c\} \xrightarrow{1} \\ (abc, cba)\{a\} &\xrightarrow{2} (abc, bca)\{b\} \diamond. \end{aligned}$$

Restricted Best Reply Dynamics for antiplurality

- Best reply is not unique, because several preference orders may yield the same result.
- Is there a natural restricted best reply which is unique?
- One answer can be the best reply that maximizes the winning score margin of the new winner.

Restricted Best Reply Dynamics for antiplurality

- Without loss of generality, we can assume that $S_i = \{-c | c \in C\}$
- o_t is the winner set after the move of player i at time t and is the current winner set .
- Best reply: $-a \rightarrow -b$ where $b \neq a$.
 - Type 1: $a \notin o_t$ and $b \in o_{t-1}$
 - Type 2: $a \in o_t$ and $b \notin o_{t-1}$
 - Type 3: $a \in o_t$ and $b \in o_{t-1}$
- For plurality and antiplurality, allowing type 2 moves can lead to a cycle. We call type 1 and 3 as **RBR**.
- In randomized tie-breaking, the player vetoes the least preferred member of o_{t-1} .

RBRD for antiplurality

Set of potential winners

Definition

(set of potential winners) The set of potential winners at time t , W_t , those candidates who have a chance of winning at the next step (time $t + 1$), depending on the different RBR of voters.

$$W_t = \{c \mid \text{if a player moves } -c \rightarrow -b \text{ at time } t + 1, \text{ then } c \in o_{t+1}\}$$

RBRD for antilurality

Alphabetical tie-breaking

Lemma

If $t < t'$ then $W_t \subseteq W'_t$.

Proof.

- Let $c \in W_{t-1}$, and we have an improvement step $-a \rightarrow -b$ at time t . Then we show $c \in W_t$.
- If it is type 3, it is easy to show $-c \rightarrow -a$ makes c winner.
- If it is a type 1, let $b' = o_t$. Note that $b' \notin \{a, b\}$. Then we show $-c \rightarrow -b'$ makes c winner. It uses the transitivity of lexicographic order which may not be true for an arbitrary deterministic tie-breaking rule.



RBRD for antilurality

Alphabetical tie-breaking

Lemma

Each voter has at most one type 1 move and at most $m - 1$ moves of type 3.

Proof.

- 1 Suppose a step $-a \xrightarrow{i} -b$ is a type 1 move by voter i at time t . With proof by contradiction, we show this improvement step is the first improvement step of voter i .
- 2 as at every step $-a \xrightarrow{i} -b$ of type 3, it must hold that $a \succ_i b$ because of the definition of improvement step.



Conclusion: RBRD for $G(\mathcal{V}, \mathcal{C}, A)$ with alphabetical tie-breaking will converge to a NE from any state in at most mn steps.

RBRD for antilurality

Randomized tie-breaking

Definition

(**Stochastic dominance improvement step**) Voter v prefers an outcome with winner set W to an outcome with winner set W' if and only if for each $k = 1 \cdots m$, the probability of electing one of the first k candidates given outcome W should be no less than given W' .

Lemma

If $t < t'$ then $W_t \subseteq W'_{t'}$.

RBRD for antilurality

Randomized tie-breaking

Lemma

Each voter has at most one type 1 move and at most $m - 1$ moves of type 3.

Proof.

For type 1 move, similarly proof by contradiction.

For type 3 move $-a \rightarrow -b$, we show the probability of winning of a has increased and b has decreased. Therefore, $a \succ_i b$.



Conclusion: Stochastic dominance RBRD for $G(\mathcal{V}, \mathcal{C}, A)$ with randomized tie-breaking will converge to a NE from any state in at most mn steps.

RBRD for plurality

Type 1: $a \notin o_{t-1}$ and $b \in o_t$

Type 3: $a \in o_{t-1}$ and $b \in o_t$

$W_t = \{c \mid \text{if a player moves } a \rightarrow c \text{ and } a \in o_{t-1} \text{ then } c \in o_t\}$

Lemma

If $t < t'$ then $W_{t'} \subseteq W_t$.

Lemma

The number of type 1 moves are at most m and each voter has at most $m - 1$ moves of type 3.

Theorem

RBRD $G(V, C, P)$, will converge to a NE from any state in at most $m + (m - 1)n$ steps.

Cycles for more general scoring rules

Cycle for scoring rules close to Plurality:

- Suppose we have 3 candidates a , b and c and $P_0 = (abc, bca)$. The scoring rule is $w = (1, \alpha, 0); \alpha \leq \frac{1}{2}$ and we use alphabetical tie-breaking.

$$(abc, bca)\{b\} \xrightarrow{1} (acb, bca)\{a\} \xrightarrow{2} (acb, cba)\{c\} \xrightarrow{1} (abc, cba)\{a\} \xrightarrow{2} (abc, bca)\{b\} \diamond$$

- general m and $n = 2$

$$(ab \cdots c, bc \cdots a)\{b\} \xrightarrow{1} (a \cdots cb, bc \cdots a)\{a\} \xrightarrow{2} (a \cdots cb, cb \cdots a)\{c\} \xrightarrow{1} (ab \cdots c, cb \cdots a)\{a\} \xrightarrow{2} (ab \cdots c, bc \cdots a)\{b\} \diamond$$

Cycles for more general scoring rules

Cycle for scoring rules close to antiplurality: $m = 3, n = 4$

Suppose we have 3 candidates a, b and c . The sincere profile is $P_0 = (abc, bac, cab, bca)$. Our scoring rule is $(1, \alpha, 0)$; $\frac{1}{2} \leq \alpha < 1$ with alphabetical tie-breaking.

$$\begin{aligned} (abc, bac, cab, bca)\{b\} &\xrightarrow{1} (acb, bac, cab, bca)\{a\} \xrightarrow{4} \\ (acb, bac, cab, cba)\{c\} &\xrightarrow{1} (abc, bac, cab, cba)\{a\} \xrightarrow{4} \\ (abc, bac, cab, bca)\{b\} &\diamond \end{aligned}$$

Order of players matters

Consider Borda system with 4 voters and 3 candidates,
 $P_0 = (acb, acb, cab, cba)$ and alphabetically tie-breaking

$(acb, acb, cab, cba)\{c\} \xrightarrow{1} (abc, acb, cab, cba)\{a\} \xrightarrow{3}$

$(abc, acb, cba, cba)\{c\} \xrightarrow{2} (abc, abc, cba, cba)\{a\} \xrightarrow{4}$

$(abc, abc, cba, bca)\{b\} \xrightarrow{1} (acb, abc, cba, bca)\{1\} \xrightarrow{4}$

$(acb, abc, cba, cba)\{c\} \xrightarrow{1} (abc, abc, cba, bca) \diamond$

P is the same as P after fourth move and the cycle starts.

Now let's consider another order for the players.

$(acb, acb, cba, cab)\{c\} \xrightarrow{1} (abc, acb, cba, cab)\{a\} \xrightarrow{4}$

$(abc, acb, cba, cba)\{c\} \xrightarrow{2} (abc, abc, cba, cba)\{a\} \xrightarrow{3}$

$(abc, abc, bca, cba)\{b\} \xrightarrow{4} (abc, abc, bca, cab)\{a\}$

Conclusion

- The possibility of winning of a candidate depends on the type of improvement step and also candidate's priority in tie-breaking (max $d = 2$)
- The number of type 2 moves are not bounded, so we need to use RBR for convergence.
- We need to use stochastic dominance RBR for randomized tie-breaking.
- The results of convergence do not happen for a non-linear deterministic tie-breaking rule
- The order of players matters in convergence, equilibrium result and also speed of convergence.