# Convergence In Iterative Voting Panagiotis Grontas 

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## Introduction

* Multi Agent Systems
* Select course of action
* How: Aggregate the preferences of individual agents by voting
* Social choice theory
* Problems:
* All voting rules can be manipulated (Gibbard - Satterthwaite)
* Strategic Behavior: Game theory to the rescue
* But...
* Distorted equilibria
* The result cannot be changed
* But, there might be individual unhappy voters
* Example: Everybody votes for the same candidate
* Cannot force agents honest preferences


## Introduction

* A solution:
* Manipulate the manipulation!
* How: Use it to converge to a stable state, where no agent wants to further manipulate the game
* Stable state: Nash Equilibrium
* Iterative voting (Meir, 2010)
* All agents vote and view the result
* Individual Preferences are not revealed
* Unhappy agents can change their votes
* Repeat until everybody is happy


## Results Summary

* Under Restrictions
* Plurality Voting Converges
* Antiplurality Converges
* Other voting rules do not converge, regardless of restrictions
* Borda
* K-approval
* Restrictions:
* Initial Vote (truthful or not)
* Voter weights
* Type of agent action (best/better reply)
* Tie breaking rules


## The model

* $V$ : set of $n$ voters/players
* $|V|=n$
* $k$ strategic voters
* $n-k$ truthful
* $C$ : set of $m$ candidates
* $|C|=m$
* Score at time $t: \boldsymbol{s}_{\boldsymbol{t}}(\mathrm{c})$
* Truthful voters forgotten after voting
* Initial score: $\hat{\boldsymbol{s}}_{\boldsymbol{t}}(\mathrm{c})$
* Strategic Voters
* Myopic Greedy Moves
* One Change At A Time
* Winners at time $t$
* $\boldsymbol{O}_{\boldsymbol{t}}$
* Potential Next Winners
* A voter can make them win in the next move
* $\boldsymbol{W}_{\boldsymbol{t}}$


## The model - (2)

* Voting rule $f: A^{n} \rightarrow 2^{C^{*}}$
* $A$ : all preference orders for $C$ (real/announced)
* Scoring Rules:

$$
\left(a_{1}, a_{2}, \cdots, a_{m-1}, 0\right)
$$

* $a_{i} \geq a_{i+1}$
* Examples:
* Plurality: $(1,0, \cdots, 0,0)$
* Veto: $(1,1, \cdots, 1,0)$ or

$$
*(0,0, \cdots, 0,-1)
$$

* Borda: $(m-1, m-2, \cdots, 1,0)$
* K-Approval: $(1,1, \cdots, 0,0)$
* Maximin
* $\forall x, y \in C$
* $\mathrm{N}(x, y)=\left|\left\{i: x>_{i} y\right\}\right|$
* $S(x)=\min _{y}\{N(x, y)\}$
* Winner: $\max _{x} S$


## The model - (3)

* Tie breaking:
* $t: 2^{C^{*}} \rightarrow C$
* Alphabetical Tie - Breaking
* $\boldsymbol{O}_{\boldsymbol{t}}$ : Singleton
* Randomized Tie Breaking
* Sets of possible winners
* Linear Order Tie Breaking
* If $\forall x, y \in D \subseteq C: t(D)=x$
$*$ and $x, y \in D^{\prime}$
* Then $t\left(D^{\prime}\right) \neq y$


## Non convergence - example

* $|V|=9, k=3$
* $C=\{a, b, c, d\}$
* Initial score (2,2,2,0)
* Plurality with Alphabetical Tie Breaking
* Preference Profile 1: $d \succ_{1} a>_{1} b>_{1} c$
* Preference Profile 2: $c \succ_{2} b \succ_{2} a \succ_{2} d$
* Preference Profile 3: $d \succ_{3} a \succ_{3} b \succ_{3} c$
* Initial Move (truthful): $(d, c, d)\{c\}(2,2,3,2)$
$(\boldsymbol{b}, c, d)\{b\}_{(2,3,3,1)}(b, c, \boldsymbol{a})\{a\}_{(3,3,3,0)}(b, \boldsymbol{b}, a)\{b\}_{(3,4,2,0)}$
$(\boldsymbol{c}, b, a)\{a\}_{(3,3,3,0)}^{\longrightarrow}(c, \boldsymbol{c}, a)\{c\} \underset{(3,2,4,0)}{\longrightarrow}(\boldsymbol{b}, c, a)\{a\}$


## Plurality Convergence

## Theorem

Plurality with alphabetical tie breaking converges to a Nash Equilibrium from any starting state in at most $\boldsymbol{m + ( m - 1 ) n}$ steps, if all players respond with restricted best replies

## Improvement Steps

At time $t$ a player responds with $a \rightarrow b$

- Type 1: $\boldsymbol{a} \neq \boldsymbol{o}_{\boldsymbol{t}-1}$ and $\boldsymbol{b}=\boldsymbol{o}_{\boldsymbol{t}}$
- Type 2: $a=o_{t-1}$ and $b \neq \boldsymbol{o}_{t}$
- Type 3: $\boldsymbol{a}=\boldsymbol{o}_{\boldsymbol{t}-1}$ and $\boldsymbol{b}=\boldsymbol{o}_{\boldsymbol{t}}$ winner set

Restricted Best Reply: Type 1 and Type 3 improvement steps,

## Improvement Steps Practice

* $|V|=3, k=2$
* $C=\{a, b, c\}$
* Initial score (1,0,0)
* Alphabetical Tie Breaking
* Preference Profile 1: $a \succ_{1} b \succ_{1} c$
* Preference Profile 2: $c \succ_{2} b \succ_{2} a$
$*(b, c)\{a\} \underset{\substack{c \rightarrow b \\ \text { Type } 1}}{ }(b, \boldsymbol{b})\{b\} \underset{\substack{b \rightarrow \mathrm{C} \\ \text { Type } 2}}{ }(c, b)\{a\}$
* $\underset{b \rightarrow \mathrm{C}}{ }(c, \boldsymbol{c})\{c\} \underset{c \rightarrow a}{ }(\boldsymbol{a}, c)\{a\}$

Type 1
Type 3

## An observation

* Simultaneous responses might not converge
* $C=\{a, b, c\}$
* $|V|=4, k=2$
* Initial score (0,0,2)
* Preference Profile 1: $a>_{1} b>_{1} c$
* Preference Profile 2: $b \succ_{2} \quad a>_{2} c$
$*(\boldsymbol{a}, \boldsymbol{b})\{c\} \rightarrow(\boldsymbol{b}, \boldsymbol{a})\{c\} \rightarrow(\boldsymbol{a}, \boldsymbol{b})\{c\}$


## Plurality Convergence Proof (1)

## Lemma 1

The set of potential next winners never increases over time

$$
\forall t<t^{\prime}: W_{t^{\prime}} \subseteq W_{t}
$$

## Proof

- $\forall t: c \in W_{t} \Rightarrow c \in W_{t-1}$
- Assume $c \in W_{t}$ :
- An RBR step $a \rightarrow c$ yields $O_{t+1}=c$
- Step increases $c^{\prime} s$ score:
- $s_{t+1}(c)=s_{t}(c)+1$
- By winner definition: $\forall y \in C$

$$
\text { - } s_{t+1}(c) \geq s_{t+1}(y) \Rightarrow s_{t}(c)+1 \geq s_{t+1}(y)
$$

## Plurality Convergence Proof (2)

At time $t$, an improvement step $\boldsymbol{a} \rightarrow \boldsymbol{b}$ occurs

* C maintains score at time $t$
* $s_{t}(c)=s_{t-1}(c)$
* $b=o_{t}$ (from RBR def)
* $\boldsymbol{c}$ can beat $\boldsymbol{b}$ at time $\boldsymbol{t}$
* $s_{t}(c)+1 \geq s_{t+1}(b)$
* $s_{t-1}(c)+1 \geq s_{t+1}(b) s_{t+1}(b)=s_{t}(b)-1=s_{t-1}(b)-\mathrm{b}$ fell back to the same score



## Plurality Convergence Proof (3)

* $\boldsymbol{c}$ can beat $\boldsymbol{a}$ at time $\boldsymbol{t}$
* $\boldsymbol{a} \rightarrow \boldsymbol{b}$ is a type 3 move
* $a=o_{t-1}$
* Moves are: $a \rightarrow b$ followed by $b \rightarrow c$
* Replace with $a \rightarrow c$
* Scores at time $t+1=$ scores at time $t$
* As a result c can win at time t


## Plurality Convergence Proof (4)

* $\boldsymbol{a} \rightarrow \boldsymbol{b}$ is a type 1 move
* $a \neq o_{t-1}$ and $b=o_{t}$
* This means: $\exists a^{\prime}, a^{\prime}=o_{t-1}, a^{\prime} \neq a$
* $s_{t-1}\left(a^{\prime}\right) \geq s_{t-1}(y) \forall y \in C$
* $s_{t-1}\left(a^{\prime}\right)=s_{t}\left(a^{\prime}\right)=s_{t+1}\left(a^{\prime}\right)$
* $s_{t-1}(c)+1=s_{t}(c)+1 \geq s_{t}\left(a^{\prime}\right)=s_{t-1}\left(a^{\prime}\right) \geq s_{t-1}(a)$
* $\boldsymbol{c}$ can beat all the rest at time $\boldsymbol{t}$
* The rest are unaffected $s_{t-1}(c)+1 \geq s_{t-1}(y)$
* As a result $c \in W_{t-1}$


## Plurality Convergence Proof (5)

## Lemma 2

- There are at most $m$ - 1 type 3 moves for each voter
- There are at most $m$ type 1 moves


## Proof

- A step of type 3, $a \rightarrow b$, is an improvement step
- So for each voter: $\mathrm{b}>_{i} a$
- There are m-1 such possible improvements
***
- For all type 1 moves $a \rightarrow b, a \notin W_{t}$
- If $a \in W_{t}$ then $b \rightarrow a$ would make $a$ win at time $t+1$
- But $a \rightarrow b \rightarrow a$ results in $a$ not winning (type 1 def)
- Conclusion: Type 1 moves only decrease the number of winners
- At most $m$ such moves


## Anti-Plurality Convergence

## Theorem

Anti-Plurality with alphabetical tie breaking converges to a Nash Equilibrium from any starting state in at most $\boldsymbol{m n}$ steps, if all players respond with restricted best replies

## Improvement Steps

At time $t$ a player responds with $-a \rightarrow-b$

- Type 1: $\boldsymbol{a} \neq \boldsymbol{o}_{\boldsymbol{t}}$ and $\boldsymbol{b}=\boldsymbol{o}_{\boldsymbol{t}-1}$
- Type 2: $a=o_{t}$ and $b \neq o_{t-1}$
- Type 3: $a=o_{t}$ and $b=o_{t-1}$

Note: A type 4 move ( $\boldsymbol{a} \neq \boldsymbol{o}_{\boldsymbol{t}-\mathbf{1}}$ and $\boldsymbol{b} \neq \boldsymbol{o}_{\boldsymbol{t}}$ ) has no impact on the winner set

Restricted Best Reply: Type 1 and Type 3 improvement steps (Veto the previous winner)

## Proof

## Lemma 1

A type 2 step $-a \rightarrow-c$ can be replaced with a type 3 step $-a \rightarrow-b$ without changing the winner but increasing the margin of victory of $a$

## Proof

- A step of type $2,-a \rightarrow-c$ results in:
- a being a winner
- Increasing $s_{t}(a)$
- Decreasing $s_{t}(c)$
- By type 2 definition c is not a previous winner
- If we replace with type 3 we get:
- $\quad a$ being a winner (winner set is the same)
- Increasing $s_{t}(a)$
- Decreasing $s_{t}(b)$ where $b$ the previous winner


## Proof (2)

## Lemma 2

Over time the set of potential next winners never decreases

$$
\forall t<t^{\prime}: W_{t} \subseteq W_{t^{\prime}}
$$

## Proof

- $\forall t: c \in W_{t-1} \Rightarrow c \in W_{t}$
- At time t improvement step $-a \rightarrow-b$ occurs
- Prove that $s_{t}(c)+1 \geq s_{t}(y) \forall y \in C$
- Three cases to consider: $\mathbf{a}, \mathbf{b}$, rest
- Rest
- $s_{t-1}(c)+1 \geq s_{t-1}(y)$ since $c \in W_{t-1}$
- But nobody changed
- $s_{t}(c)+1 \succeq s_{t}(y)$
- $c \in W_{t}$


## Proof (3)

- For $\mathrm{b}=\boldsymbol{o}_{\boldsymbol{t}-\mathbf{1}}$
- $s_{t-1}(c)+1 \geq s_{t-1}(b)$
- $b \quad$ was vetoed $\rightarrow$ score decreased $s_{t-1}(b)>s_{t}(b)$
- c was unaffected
- $s_{t}(c)+1 \geq s_{t}(b)$
- $c \in W_{t}$
- For $\boldsymbol{a}$
- If $-a \rightarrow-b$ Type 3 step:
- $-c \rightarrow-b$ at time $t$ is equivalent in score with
- $-a \rightarrow-b$ at time $t$
- $-c \rightarrow-a$ at time $t+1$
- As a result nothing changes for $\mathbf{c}, \mathbf{b}$
- $c \in W_{t}$


## Proof (4)

- If $-a \rightarrow-b$ Type 1 step:
- $O_{t}=b^{\prime}, \mathrm{b}^{\prime} \neq a, b$ (somebody else was the winner)
- This means: $s_{t}\left(b^{\prime}\right) \succeq s_{t}(a)$
- $s_{t-1}\left(b^{\prime}\right)=s_{t}\left(b^{\prime}\right)$
- $s_{t}(c)+1=s_{t-1}(c)+1 \geq s_{t-1}\left(b^{\prime}\right)=s_{t}\left(b^{\prime}\right) \succeq s_{t}(a)$
- $c \in W_{t}$


## Proof (5)

## Lemma 3

- Each voter has at most 1 type 1 moves
- Each voter has at most $m-1$ type 3 moves


## Proof

- A step of type 3, $-a \rightarrow-b$, is an improvement step
- So for each voter: $\alpha>_{i} b$
- There are m-1 such possible improvements

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$$

- Consider $-a \rightarrow-b$ step of type 1 for a voter $v$
- It will be the first improvement step
- If not $a$ was vetoed in the past
- This means that a was a winner sometime
- And before that a potential next winner ...
- Since $W_{t}$ does not ever decrease, $a$ is still
- Then $-a \rightarrow-b$ makes him a winner. Not a type 1 move


## Randomised Tie Breaking

* Sets of current winners
* How to define best response?
* Approaches:
* Cardinal Utilities
* Consistent with preference ordering
* Convergence from truthful state
* Not guaranteed from arbitrary state
* Stochastic Dominance
* $\mathrm{W} \succeq_{\mathrm{v}}$ W' if the probability of selecting the $k$ preferred candidates with winner set W is no less than with $\mathrm{W}^{\prime}$
* Convergence


## Borda and Best Replies

* May not converge even with alphabetical tie breaking
* Counterexample
* $|V|=2, k=2$
* $C=\{a, b, c\}$
* Preference Profile 1: $a \succ_{1} b \succ_{1} c$
* Preference Profile 2: $b \succ_{2} c \succ_{2} a$
* Moves:
* $(a b c, b c a)\{b\} \rightarrow(\boldsymbol{a c b}, b c a)\{a\} \rightarrow(a c b, \boldsymbol{c b a})\{c\} \rightarrow$ $(\boldsymbol{a b c}, c b a)\{a\} \rightarrow(a b c, \boldsymbol{b c a})\{b\} \rightarrow \ldots$
* Order of players matters
* May not converge even without tie breaking


## 2-approval and Best Replies

* May not converge even with alphabetical tie breaking
* Counterexample
* $|V|=2, k=2$
* $C=\{a, b, c, d\}$
* Preference Profile 1: $a \succ_{1} c \succ_{1} d \succ_{1} b$
* Preference Profile 2: $d \succ_{1} b \succ_{1} c>_{1} a$
* Moves:
* $(a c, d b)\{a\} \rightarrow(a c, \boldsymbol{d} c)\{c\} \rightarrow(\boldsymbol{a b}, d c)\{a\} \rightarrow(a b, \boldsymbol{d} \boldsymbol{b})\{b\} \rightarrow$ $(\boldsymbol{a c}, d b)\{a\} \rightarrow \ldots$


## Maximin - (1)

* May not converge
* Counterexample
* $|V|=2, k=2$
* $C=\{a, b, c, d\}$
* Preference Profile 1:
* $c>_{1} d \succ_{1} b>_{1} a$
* Preference Profile 2:
* $b \succ_{1} d \succ_{1} c \succ_{1} a$
* Tie breaking rule:
* if

$$
\begin{aligned}
& * \mathrm{~b}=\mathrm{c}=\mathrm{d} \rightarrow \mathrm{~b} \\
& * \mathrm{~b}=\mathrm{c} \rightarrow \mathrm{c} \\
& * \mathrm{a}=\mathrm{b}=\mathrm{c} \rightarrow \mathrm{~b} \\
& * \mathrm{a}=\mathrm{b}=\mathrm{c}=\mathrm{d} \rightarrow \mathrm{a} \\
& * \mathrm{c}=\mathrm{d} \rightarrow \mathrm{c} \\
& * \mathrm{~b}=\mathrm{d} \rightarrow \mathrm{~b}
\end{aligned}
$$

* Else
* a


## Maximin - (2)

* Truthful start
* V1: $c>_{1} d \succ_{1} b \succ_{1} a$
* V2: $b>_{1} d \succ_{1} c>_{1} a$
* $S(a, b, c, d)=(0,1,1,1)\{b\}$
* V1: $\boldsymbol{c}>_{1} \boldsymbol{b}>_{1} \boldsymbol{d}>_{1} \boldsymbol{a}$
* V2: $b>_{1} d>_{1} c>_{1} a$
* $S(a, b, c, d)=(0,1,1,0)\{c\}$
* V1: $c>_{1} b \succ_{1} d \succ_{1} a$
* V2: $\boldsymbol{a}>_{1} \boldsymbol{b}>_{1} \boldsymbol{d}>_{1} \boldsymbol{c}$
* $S(a, b, c, d)=(1,1,1,0)\{b\}$
* V1: $\boldsymbol{c}>_{1} \boldsymbol{d}>_{1} \boldsymbol{b}>_{1} \boldsymbol{a}$
* V2: $a>_{1} b \succ_{1} d \succ_{1} c$
* $\mathrm{S}(\mathrm{a}, \mathrm{b}, \mathrm{c}, \mathrm{d})=(1,1,1,1)\{\mathrm{c}\}$
* V1: $c>_{1} d \succ_{1} b \succ_{1} a$
* V2: $b>_{1} d>_{1} c>_{1} a$
* $S(a, b, c, d)=(0,1,1,1)\{b\}$
* ...


## Open Problems

* Reply definition for convergence
* General convergence conditions applicable to different social choice functions


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