# Let's Agree to Agree: Targeting Consensus for Incomplete Preferences through Majority Dynamics

#### Simon Rey, together with Sirin Botan and Zoi Terzopoulou

IJCAI 2022

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Fargeting Consensus for Incomplete Preferences through Majority Dynamics

## 1. Introduction

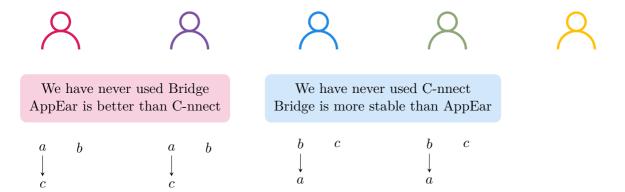


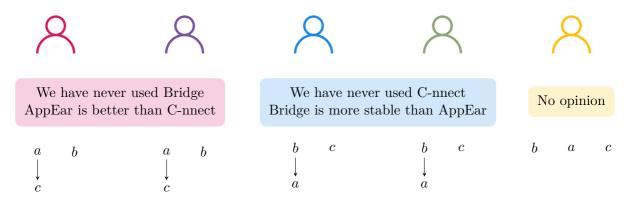




We have never used Bridge AppEar is better than C-nnect







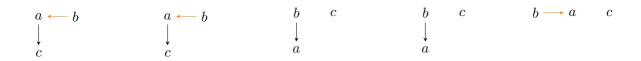


The committee meets to discuss the alternatives and starts by comparing AppEar and Bridge

a	b	a	b	b $c$	b $c$	b $a$ $c$
				$\downarrow$	Ļ	
$\overset{*}{c}$		$\overset{*}{c}$		à	à	

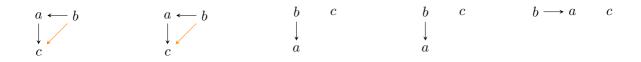


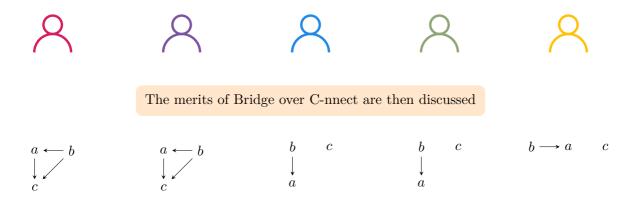
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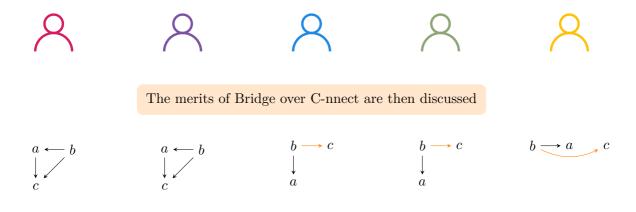


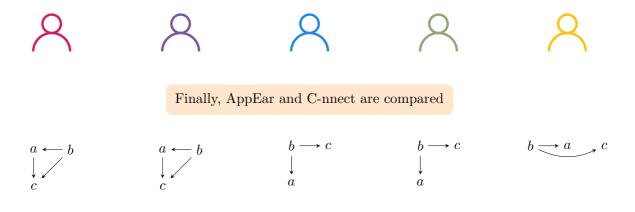


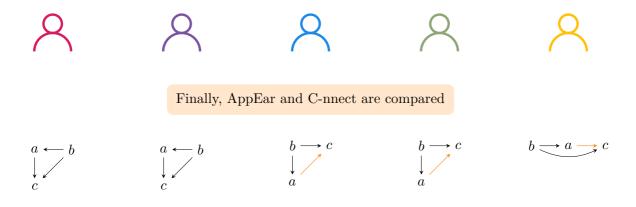
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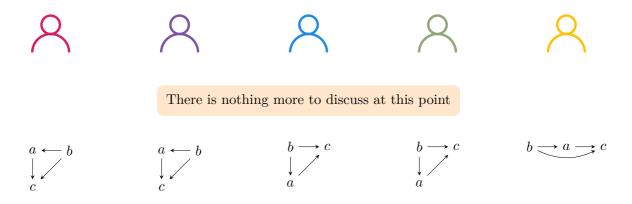




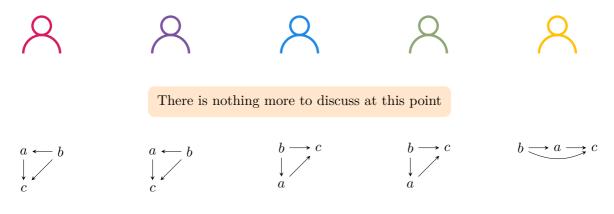








 $\mapsto$  Note the existence of an obvious consensual alternative now: Bridge.



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Our goal is to study this dynamical process!

Starting from an incomplete profile P, pairs are discussed following  $\sigma$ .

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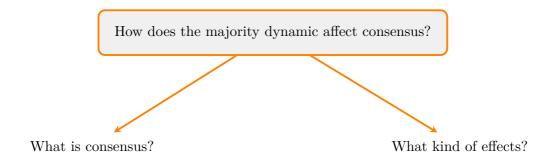
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 $\llbracket \succ \rrbracket$  denotes the *transitive closure* of the order  $\succ$ .

How does the majority dynamic affect consensus?



# 2. <u>Condorcet Consensus</u>



**Condorcet Consensus:** There exists an alternative *strictly* winning all pairwise majority contests against other alternatives.

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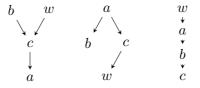
t against z: 2 for t 0 for zt against j: 1 for t 0 for j

Condorcet Consensus

- Preservation

For more than 3 alternatives: Majority dynamic does not preserve existence of Condorcet consensus.

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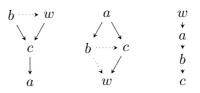


w is the Condorcet winner

For more than 3 alternatives: Majority dynamic does not preserve existence of Condorcet consensus.

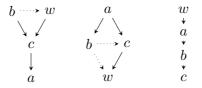
Updating on bc and bw

For more than 3 alternatives: Majority dynamic does not preserve existence of Condorcet consensus.



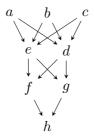
No Condorcet winner

For more than 3 alternatives: Majority dynamic does not preserve existence of Condorcet consensus.

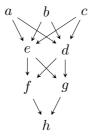


For 3 alternatives and less: Majority dynamic preserves existence of but not identity.

Strict Weak Orders: alternatives ranked in different levels, incomparabilities within levels



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With profiles of strict weak orders, the majority dynamic is preserving Condorcet consensus identify.

Let w be the initial Condorcet winner. *Claim:* we have  $a \succ_i^t w$  if and only if  $a \succ_i^0$ .

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• If i already has a comparison between a and w, nothing changes  $\checkmark$ 

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Consider round t:

- If i already has a comparison between a and w, nothing changes  $\checkmark$
- If we update on wa or aw then i will prefer w over a since w is a Condorcet winner  $\checkmark$
- If we update on another pair leading to  $a \succ_i^t w$ . Then:

$$a \longrightarrow b \longrightarrow c \quad \cdots \quad z \longrightarrow w$$

This is impossible with strict weak preferences if i does not have opinion on a and w.  $\checkmark$ 

Condorcet Consensus

A Condorcet loser can be turned into a Condorcet winner.

l	$\ell$	$w \mathrel{\scriptstyle{\checkmark}} \ell$	$w \longrightarrow \ell$	a
$\downarrow$	¥	↓ ·	Ļ	¥
$a \rightarrow x$	$b \rightarrow x$	a	a	b
$\downarrow$	$\downarrow$	$\downarrow$	$\checkmark$	¥
w	w	b	b	x
¥	$\downarrow$	$\downarrow$	$\downarrow$	¥
b	a	x	x	$\ell \dashrightarrow w$
1 agent	1 agent	2 agents	1 agent	2 agents

 $\blacktriangleright$  Condorcet consensus is preserved (*w* initially and  $\ell$  eventually) but the consensual alternative at the end used to be a Condorcet looser.

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Condorcet Consensus

- Controlling

So far we focused on preserving consensus, i.e., universal guarantees that the majority dynamic does not harm consensus.

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*What's next?* Exploring what the decision maker can achieve by selecting a specific update order.

 $\mapsto$  The decision maker can control the update order to preserve consensus.

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**Negative Control:** The majority dynamics enables negative control if for all profile *without* initial consensus:

- there exists an update order preserving the *absence* consensus; or,
- two *distinct* consensual alternatives can be reached for different update orders.

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- there exists an update order preserving the *absence* consensus; or,
- two *distinct* consensual alternatives can be reached for different update orders.

 $\rightarrow$  The decision maker can control the update order to prevent consensus from happening.

For a profile with a as initial Condorcet consensus, update according to  $ab, ac, ad, ae \dots$ 

 $\blacktriangleright$  Consider a profile without Condorcet consensus. For any *a*, there is *b* such that if we first update on *ba*, *a* cannot become a Condorcet winner.

 $\bullet\,$  If there are no Condorcet winner at the end, we are done  $\checkmark\,$ 

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  - $\bullet\,$  If there are no Condorcet winner at the end, we are done  $\checkmark\,$
  - If  $x \neq w$  is a Condorcet winner at the end, we have two update orders leading to two different Condorcet winners  $\checkmark$

# 3. Other Consensus Notions



## Unanimity-Based Consensus

#### **Unanimity Undomiated**

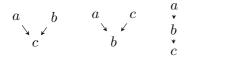
#### **Unanimity Undomiated**

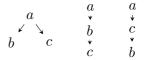
Consensus requires *unicity* 

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#### **Unanimity Undomiated**

#### **Unanimity Dominant**





Consensus requires *unicity* 

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14 / 21

#### Majority Undomiated

$$a b a c b$$
  
 $c b a c a$   
 $c c c c a$ 

#### Majority Undomiated

Majority should be *strict* Consensus requires *unicity* 

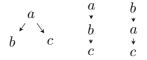
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# Majority-Based Consensus

#### **Majority Undomiated**

# 

#### **Majority Dominant**

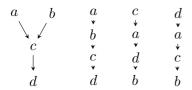


## Majority should be *strict* Consensus requires *unicity*

Majority should be *strict* 

## Plurality-Based Consensus

#### **Plurality Undomiated**



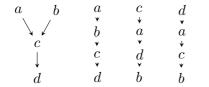
Consensus requires *unicity* 

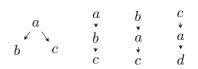
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## Plurality-Based Consensus

## **Plurality Undomiated**







Consensus requires *unicity* 

Consensus requires *unicity* 

	Preserving consensus		0
 Condorcet	🗶 (🗸)	1	1

	Preserving consensus	Positive control	
Condorcet	X (√)	✓	1
Plurality Undominated	×	×	×

	Preserving consensus	Positive control	Negative control
Condorcet	X (√)	1	1
Plurality Undominated	×	×	×
Plurality Dominant	×	×	×

	Preserving consensus	Positive control	Negative control
Condorcet	🗙 (🗸)	1	1
Plurality Undominated	×	×	×
Plurality Dominant	×	×	×
Majority Undominated	×	$\checkmark$	×

	Preserving consensus	Positive control	Negative control
Condorcet	X (✓)	1	1
Plurality Undominated	×	×	×
Plurality Dominant	×	×	×
Majority Undominated	×	$\checkmark$	×
Majority Dominant	1	1	×

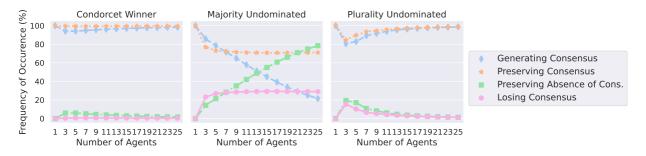
	Preserving consensus	Positive control	Negative control
Condorcet	X (V)	1	1
Plurality Undominated	×	×	×
Plurality Dominant	×	×	×
Majority Undominated	×	$\checkmark$	×
Majority Dominant	1	✓	×
Unanimity Undominated	🗡 (🗸)	$\checkmark$	$\checkmark$

	Preserving consensus	Positive control	Negative control
Condorcet	🗙 (🗸)	1	1
Plurality Undominated	×	×	×
Plurality Dominant	×	×	×
Majority Undominated	×	$\checkmark$	×
Majority Dominant	1	$\checkmark$	×
Unanimity Undominated	🗶 (🗸)	$\checkmark$	1
Unanimity Dominant	1	$\checkmark$	×

# 4. Experimental Analysis

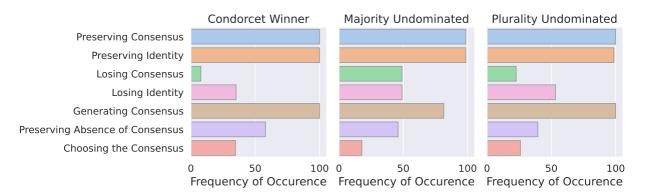


# Quantifying the Effects on Consensus



- Numbers of agents varying in 1, 3, 5, ..., 25
- 5 000 000 random profiles each time (uniform distribution over  $a \succ b, b \succ a$  and  $a \sim b$ , repeat until transitive)

# Quantifying the Opportunities for Control



- 11 agents and 4 alternatives
- 20 000 random profiles
- $\bullet\,$  All of the 46 080 possible update orders on each profile

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### 5. Conclusion



*What have we done?* Studied the majority dynamic and the effects it can have on consensus for several consensus notions.

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What is still to be done? Several ideas:

- Computational complexity of control problems (selecting the update order to achieve some goal)
- Computational complexity of good update orders (minimising number of updates, etc...)
- Guarantees about distance to consensus when it is not achieve
- And so many others...

#### Thanks



 $\operatorname{Sirin}$ 



Simon



 $\operatorname{Zoi}$ 

Do you still have questions?

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21 / 21