

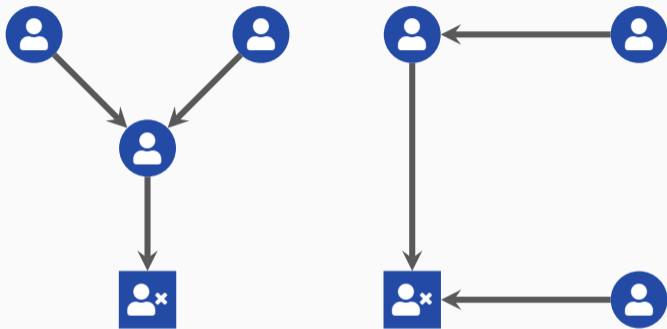
Liquid Democracy with Ranked Delegations

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Ulrike Schmidt-Kraepelin¹

¹TU Berlin ²Université Paris-Dauphine ³University of Oslo ⁴TU Wien

Liquid Democracy Workshop @ Zurich

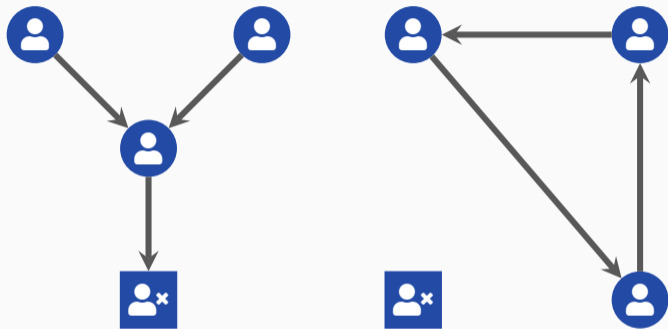
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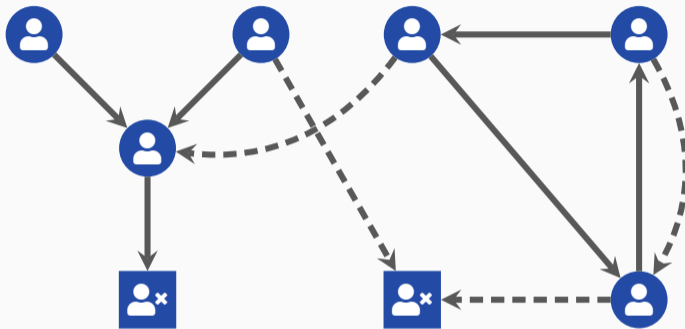
Voters can delegate their vote to **one** other voter.

Implementations: LiquidFeedback, Sovereign, GoogleVotes

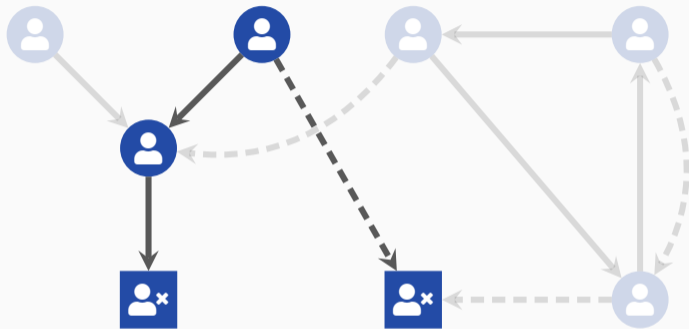
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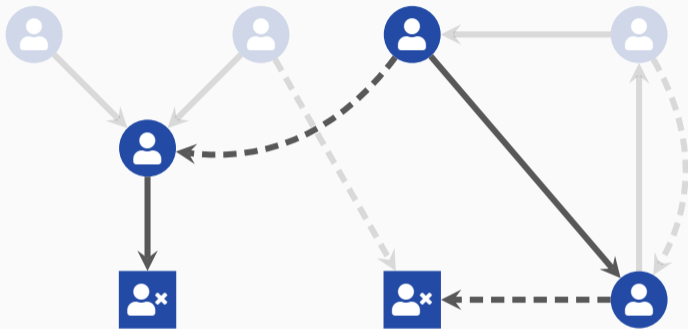
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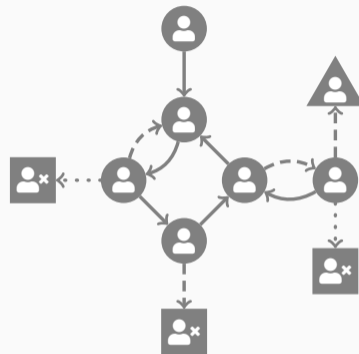
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Delegation Rules








Input: A directed delegation graph with a **rank** for every edge, and a partition of V into:

- **casting** voters : no outgoing edges
- **delegating** voters : reach at least one 
- **isolated** voters : do not reach any 



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Output: for each **delegating voter** :

- a path to a **casting voter** 



A delegation rule indirectly outputs a **weight distribution** over casting voters.

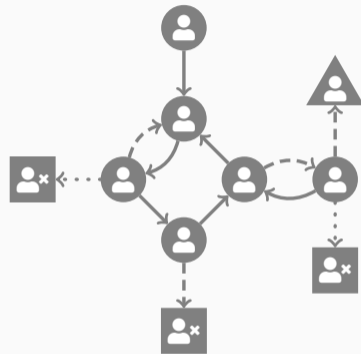
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We identify a natural **subclass** of delegation rules, perform an extensive **axiomatic analysis**, and compare all studied rules **empirically**.

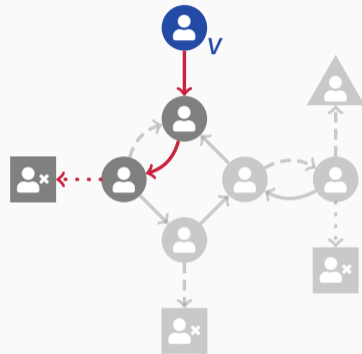
Sequence Rules

let \mathcal{S}_v be the set of **rank sequences** of paths leading to casting voters for a delegating voter v



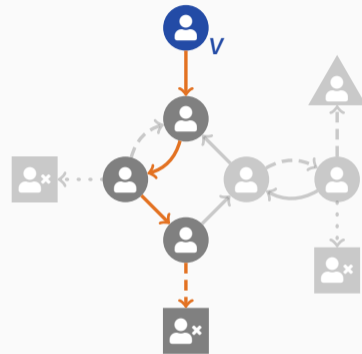
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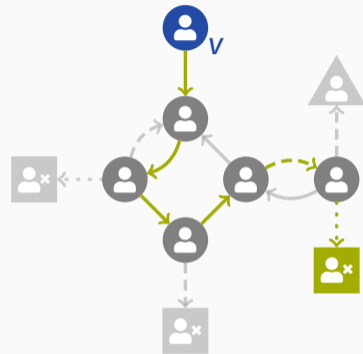
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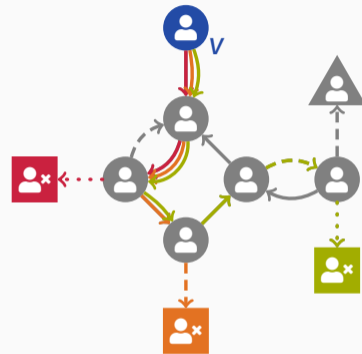
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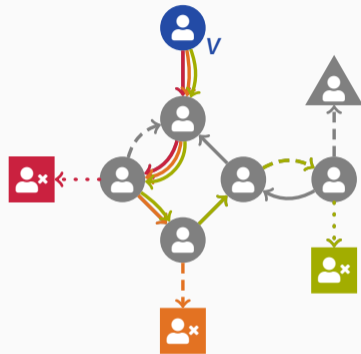
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sequence rule: outputs $\max_{\triangleright} \{\mathcal{S}_v\}$ for each delegating voter v , where \triangleright is an order over rank sequences



$$\mathcal{S}_v = \{(1,1,3), (1,1,1,2), (1,1,1,1,2,3)\}$$

Let $\triangleright_{\text{lex}}$ be the lexicographical order.

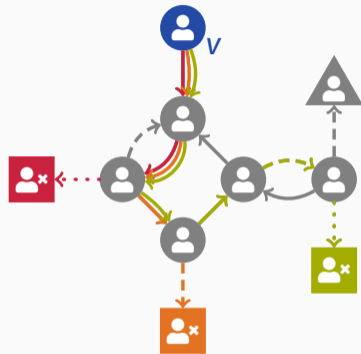


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- **depth-first delegation:** rule induced by $\triangleright_{\text{lex}}$
- **breadth-first delegation:** orders sequences by length, tie-breaking according to $\triangleright_{\text{lex}}$

[Kotsialou and Riley (AAMAS 2020)]



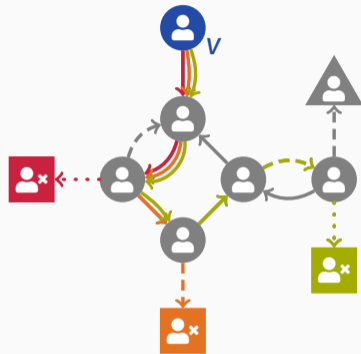
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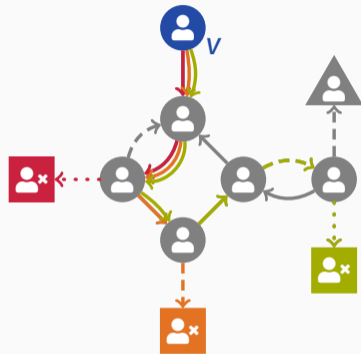
- **min-sum:** orders sequences by the sum of ranks, breaks ties according to $\triangleright_{\text{lex}}$



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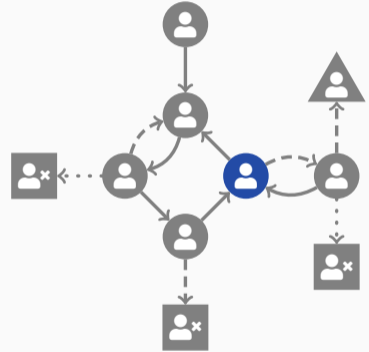
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- **min-sum:** orders sequences by the sum of ranks, breaks ties according to $\triangleright_{\text{lex}}$
- **leximax:** $s \triangleright s'$ iff $\sigma(s) \triangleright_{\text{lex}} \sigma(s')$, where σ sorts s by non-increasing ranks, e.g.,
 $\sigma(1, 1, 1, 2) = (2, 1, 1, 1) \triangleright_{\text{lex}} (3, 1, 1) = \sigma(1, 1, 3)$






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Axiomatic Analysis

Confluence: for all : all paths intersecting with  use the same outgoing edge of .






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- output of the delegation rule can be **communicated** more easily
- a single representative helps “to preserve the high level of **accountability** guaranteed by classical liquid democracy.”

[Gölz et al., WINE 2018]



Confluence: for all : all paths intersecting with  use the same outgoing edge of .






Theorem

Building upon a *characterization* of orders \triangleright that induce *confluent* sequence rules, we show:

- *breadth-first delegation*, *min-sum*, *diffusion*, and *leximax* are confluent
- *depth-first delegation* is not confluent



Copy-robustness

Copy-robustness: A delegating voter  has a direct path to its casting voter . If  becomes a casting voter, the joint voting power of  &  remains equal.

[Behrens & Swierczek (LDJ), 2015)]






Situation 1:



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Impossibility Theorem

No sequence rule is both **confluent** and **copy-robust**. Hence, **breadth-first delegation**, **min-sum**, **diffusion**, and **leximax** are not copy-robust.

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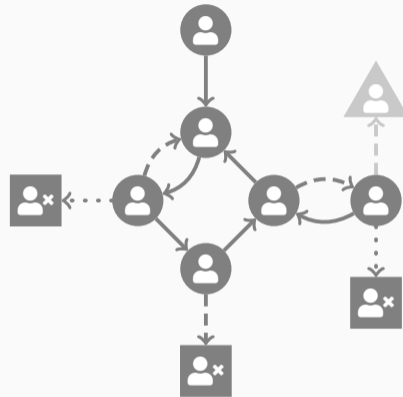
Characterization of DFS

Depth-first delegation is the only **sequence rule** that is **copy-robust** and satisfies **weak lexicographical tie-breaking**.


Can we obtain **confluence** and **copy-robustness** by going **beyond** sequence rules?

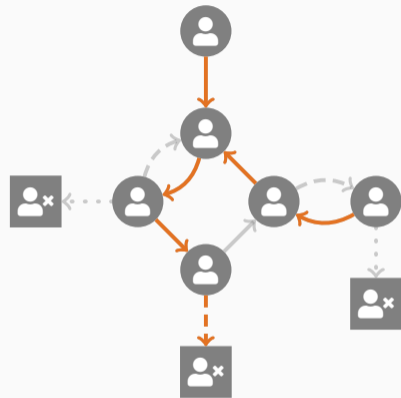
Branching Rules

C-branching: Acyclic subgraph such that all delegating voters  have **exactly one** outgoing edge.




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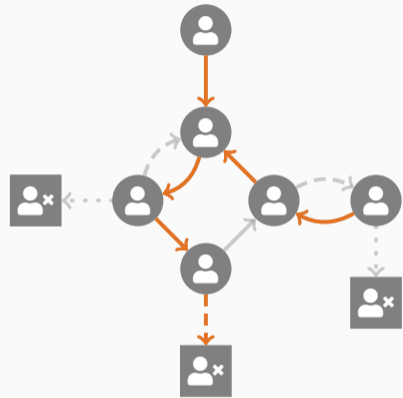
Borda branching: Select a C-branching B that minimizes the total sum of ranks



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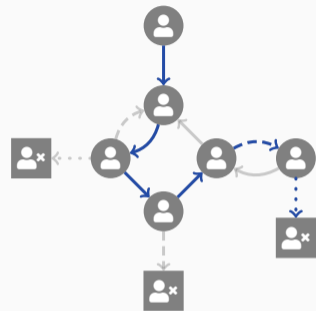


Theorem

Borda branching (with an appropriate tie-breaking rule) satisfies **confluence** and **copy-robustness**.

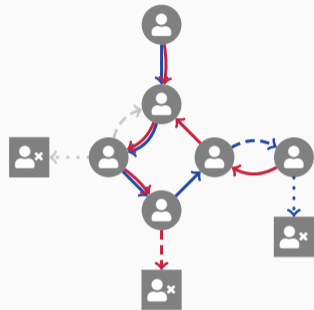
Pairwise majority comparisons:

$$\Delta(B_1, B_2) := \begin{aligned} & \# \text{ nodes in favor of } B_1 \\ & - \# \text{ nodes in favor of } B_2 \end{aligned}$$



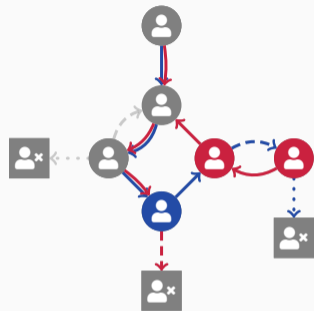
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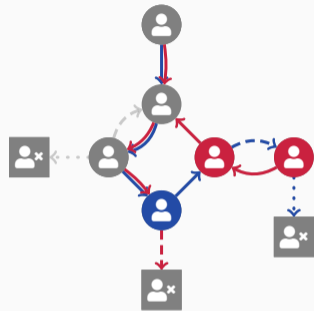


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Unpopularity margin:

$$\text{unpopularity}(B) := \max_{B'} (\Delta(B', B))$$



Theorem

A *popular branching*, i.e., a branching with unpopularity = 0 does not always exist.

Empirical Results

Data generation

- **Prominence-based method** (following the *preferential attachment* principle): the highest your in-degree in the network, the more likely you are to receive delegations.
- **Friendship-based method** (following the *small world* principle): the more you have common *friends* with someone, the most likely you are to receive its delegation.

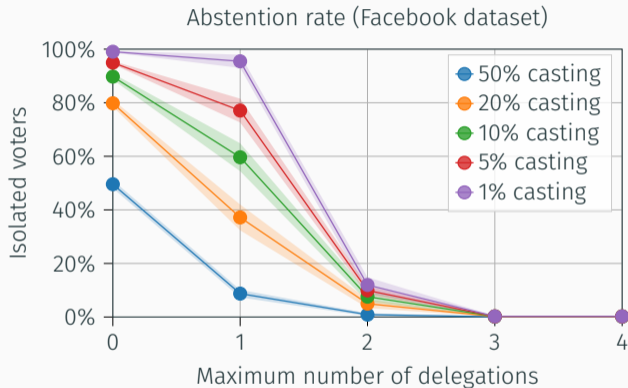
For each method, we used both generated data and **real data**. Here, I will only show the results for experiments on two real datasets:

dataset	method	nodes	edges	avg degree
Twitter	Prominence-based	456K	14,8M	65
Facebook	Friendship-based	63K	817K	26

Impact of backup delegation on abstention rate

On the classic liquid democracy setting, each voter can delegates to **at most one voter**. This cause the issue of **delegation cycles** and **lost ballots**.

With ranked delegation, we achieve **far better participation rate**, even when only 1% of all voters are actually voting.



Results

Twitter dataset ($n = 456626$)	Unpop.	AvgRank	AvgLen	MaxWeight
Breadth-first	223746	3.4	1.16	27397
MinSum	105023	1.37	1.89	31963
Leximax	13699	1.04	5.59	118722
BordaBranching	16	1.0	6.0	132421
Depth-first			6.05	127855

Facebook dataset ($n = 63731$)	Unpop.	AvgRank	AvgLen	MaxWeight
Breadth-first	28678	3.29	1.27	162
MinSum	12746	1.35	2.04	224
Leximax	2567	1.08	3.97	539
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MaxWeight: Maximum accumulated voting weight of a casting voter. Mechanism avoiding **super voters** were studied by Gözl et al. (WINE, 2018).

Unpopularity: Worst-case **majority comparison** [Kavitha et al. (Math. Prog. 2021)]

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Observations

- **trade-off** between minimizing unpopularity and maximum weight
- delegation rules can be aligned on a **spectrum**

Summary

In this talk:

- introduction of a simple **graph-theoretical** model
- formalization of the class of **sequence rules**
- **impossibility** result for copy-robust and confluent sequence rules
- **Borda branching** satisfies copy-robustness and confluence
- **characterization** of **depth-first delegation** via copy-robustness

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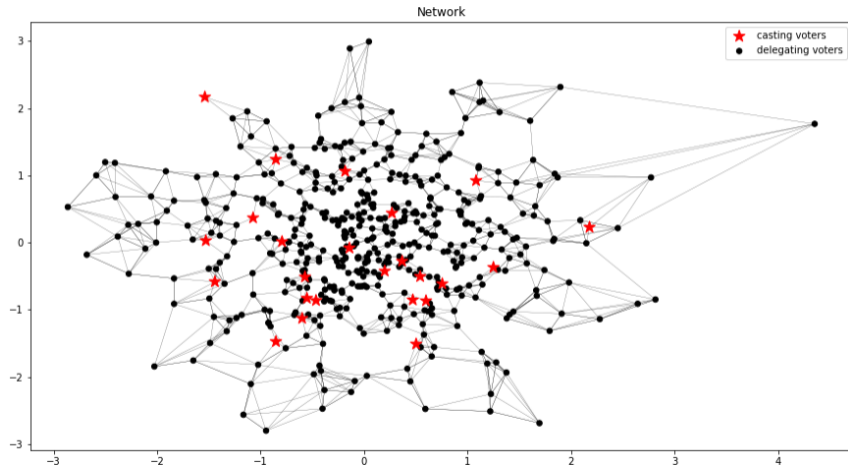
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Not mentioned in this talk:

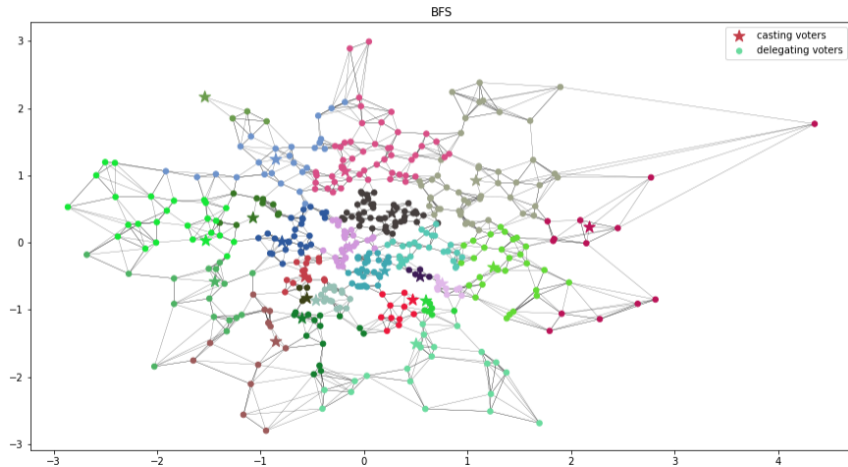
- **characterization** of **breadth-first delegation** via confluence
- a **generalization** of a result by Kotsialou and Riley (AAMAS 2020) implying that almost all studied sequence rules satisfy **guru participation**
- **Borda branching** satisfies **guru participation**
- a proof that **diffusion** is a **sequence rule** by uncovering its respective order
- more experiments !

Thanks for your attention !

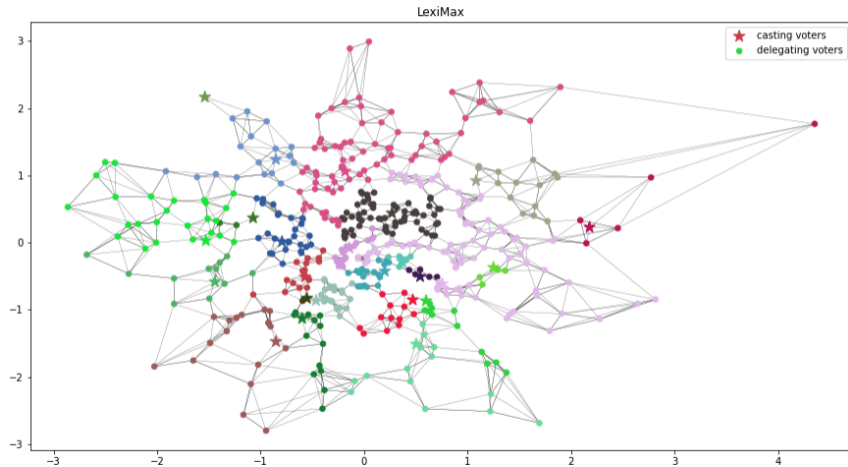
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