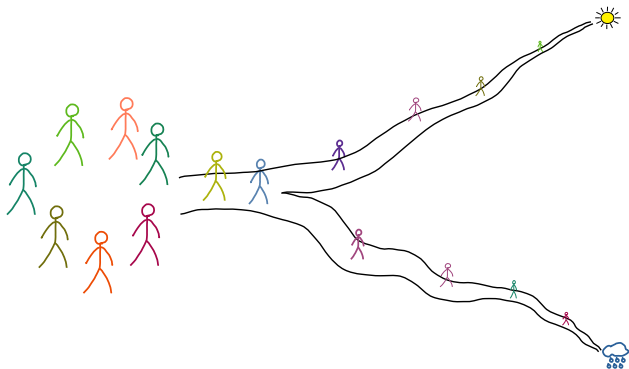


Public Projects with Preferences and Predictions or, “Mixing Auctions and Futarchy”¹



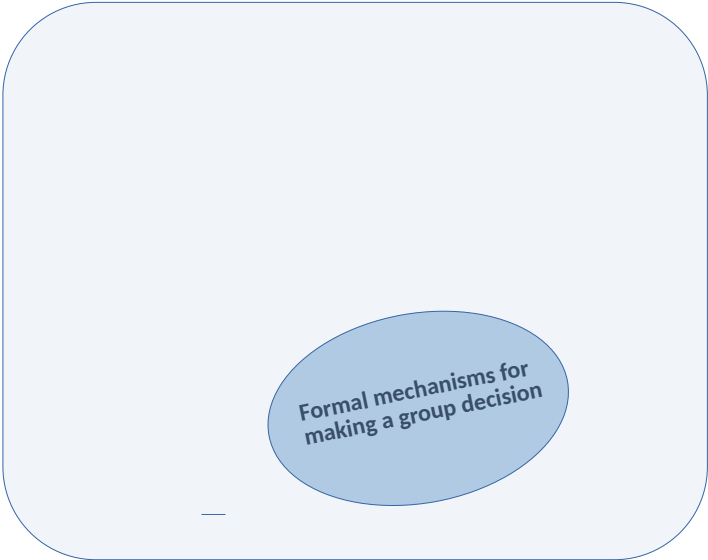
Bo Waggoner
University of Colorado, Boulder

Edge Esmeralda
June 19, 2024

¹Based on joint work with Mary Monroe. Supported by the Ethereum Foundation.

Intro and background

Governance



Formal mechanisms for
making a group decision

Governance

- single-shot
- well-defined rules
- environment may be low-trust



Formal mechanisms for
making a group decision

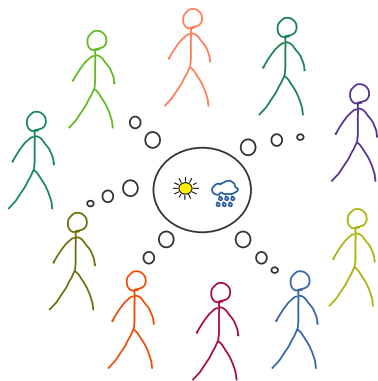
Formal mechanisms for making a group decision

Two paradigms for decision making:

- Information aggregation
- Preference aggregation

Information aggregation

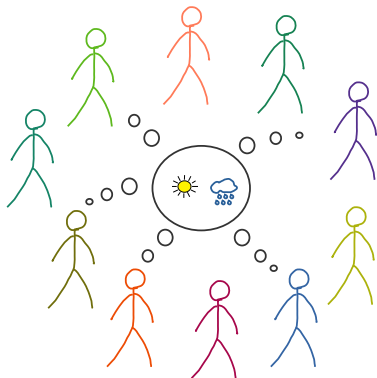
Information aggregation: discussion, consensus, ...



Information aggregation

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Common aggregation mechanisms: *separate from decisionmaking*
prediction markets, wagering mechanisms, forecasting competitions, ...



Decisions based on information

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- Run a prediction market for $V_{\text{yes}} :=$ “ V if we adopt the proposal”
- Simultaneously run a prediction market for V_{no}
- If $V_{\text{yes}} > V_{\text{no}}$, adopt the proposal
 - Cancel all trades in the “no” market
 - In one year, resolve the “yes” market and pay out

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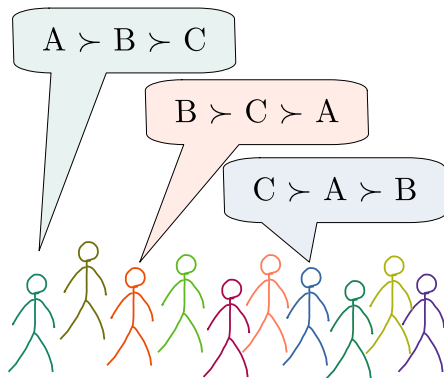
Decisions based on preferences

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Two paradigms for preference aggregation:

- Ranked-choice voting (normative, axiomatic)
- Mechanism design (utilitarian)

not a focus today



Preferences: mechanism design

Example: second-price auction.

decide who gets an item

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Generally assume: utility is interchangeable with money (“quasilinear utility”).

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General example: VCG mechanism.

“Pick the welfare-maximizing choice; charge each person their externality on everyone else.”

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- Amanatidis, Birmpas, Lazos, and Marmolejo-Cossío (2022)
 - Motivated by deciding on blockchain protocol updates
 - Experts have beliefs about probability of success of proposal
 - Experts may have ulterior motives
 - Analyzes weighted approval voting

Public Projects with Preferences and Predictions

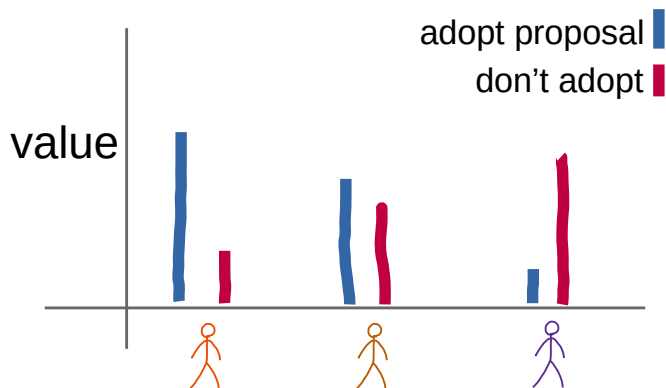
Mary Monroe and Bo Waggoner, CU Boulder

<https://arxiv.org/abs/2403.01042>

Public projects

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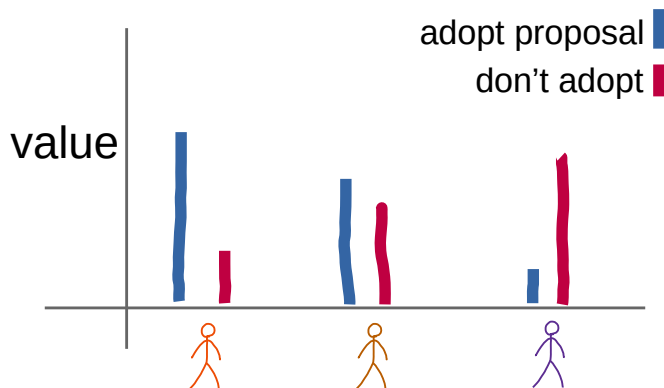
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Public projects

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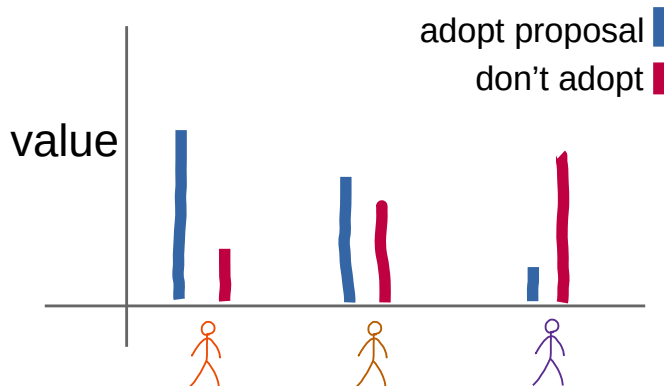
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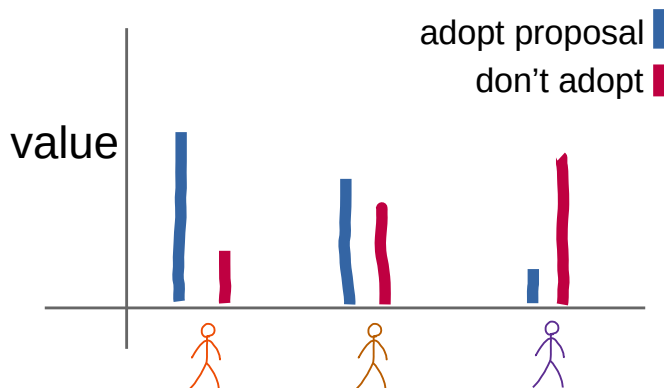
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$$\text{Price of Anarchy} = \frac{\mathbb{E}[V_{k^*}]}{\max_k V_k}$$

in the worst-case equilibrium

Public projects: solutions

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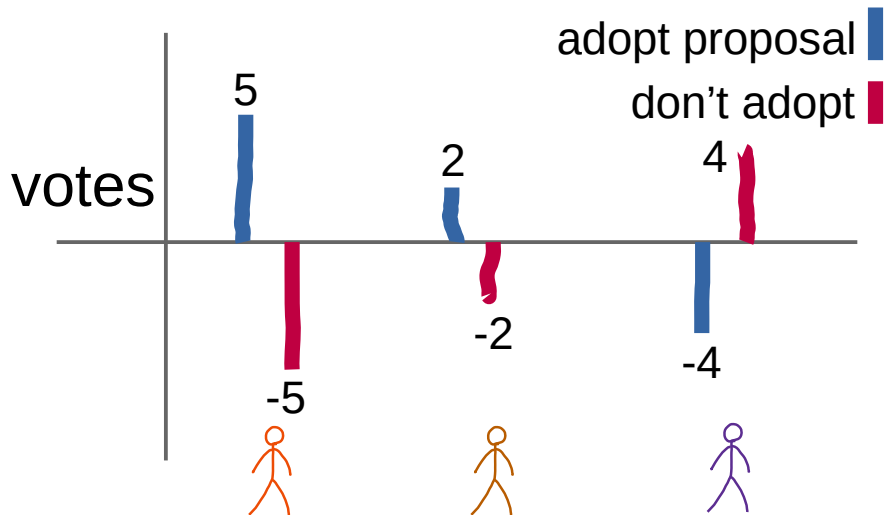
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QTM: agent i submits votes a_k^i for or against each option k ;
pays $\sum_k (a_k^i)^2$; mechanism picks $k^* \sim \mathbf{p}$ randomly where

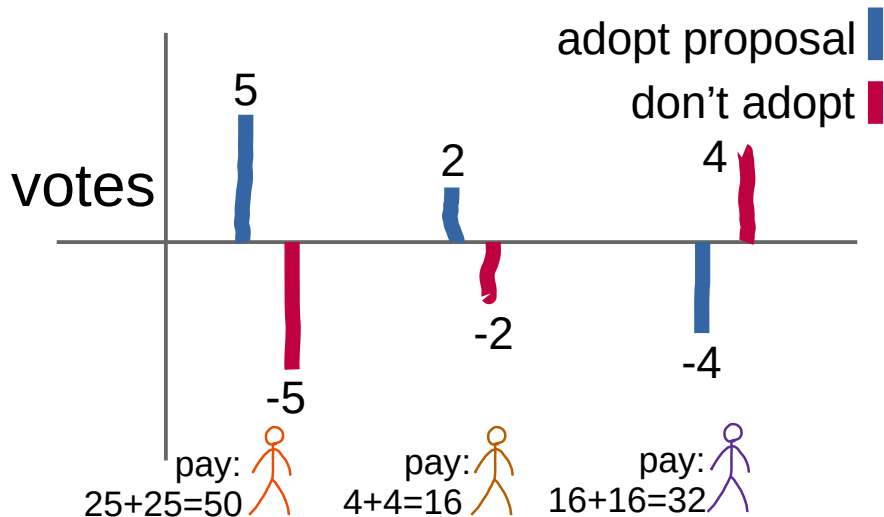
$$p_k = \frac{e^{A_k}}{e^{A_1} + \dots + e^{A_m}}.$$

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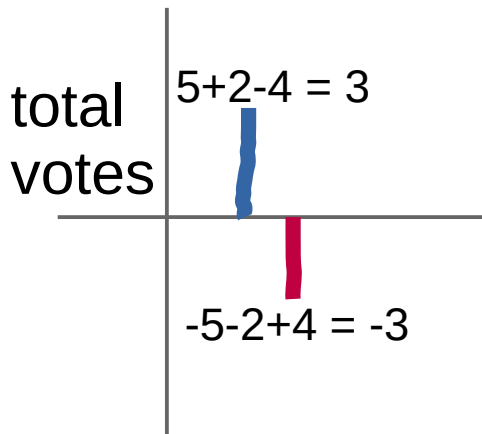
QTM: example



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adopt proposal

don't adopt

$$p_1 = \frac{e^3}{e^3 + e^{-3}} \approx 99.75 \%$$

$$p_2 = \frac{e^{-3}}{e^3 + e^{-3}} \approx 0.25 \%$$

With predictions

Goal: incorporate **information aggregation** to group decisionmaking.

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Welfare of option k : $W_k = V_k + B_k$.

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- Want to elicit accurate information about $\{B_k\}$...
- ... but voters may wish to manipulate the information aggregation

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Synthetic-Players Quadratic Transfer Mechanism with Predictions (SQUAP):

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Synthetic-Players Quadratic Transfer Mechanism with Predictions (SQUAP):

- 1 Run prediction markets to estimate the future impact of each alternative
- 2 Based on the markets, estimate B_1, \dots, B_k
- 3 Run QTM with “synthetic players” whose values are B_1, \dots, B_k
synthetic players make no payments
- 4 Cancel/resolve prediction markets, as with decision markets.
Use importance-weighted payoff of Chen et. al (2011)

Results and complications

Theorem

For 2 outcomes, SQUAP achieves a Price of Anarchy $\geq 1 - \frac{2\sqrt{\epsilon}}{T} - \left(\frac{4}{T}\right)^{2/5}$

In other words, Price of Anarchy $\rightarrow 1$ as the total possible welfare grows relative to the largest participant value.

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Problem: difficult to analyze (involves fixed-point computation).

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Future work: analyze the above proposed fix (fixed-point).

Discussion

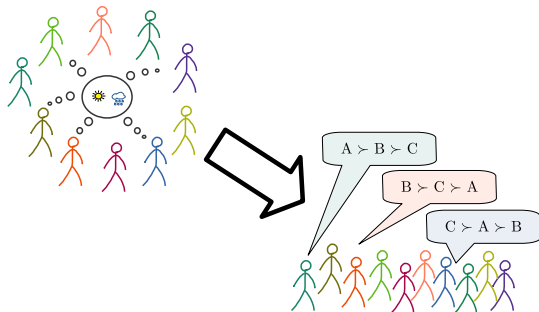
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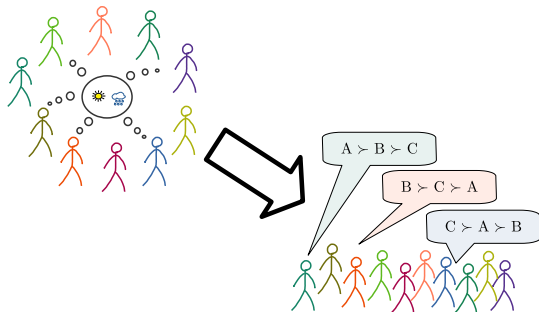


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Challenge: market manipulation \implies misled voters \implies swing in the outcome.



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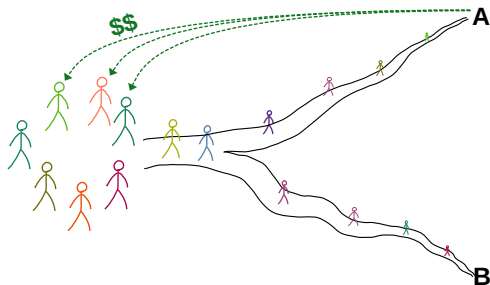
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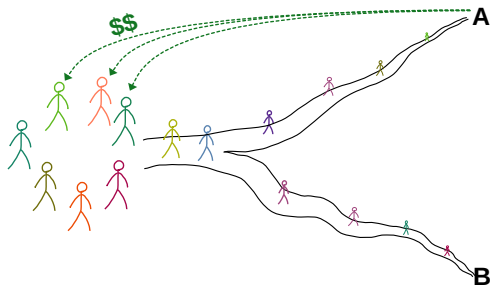
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Potential answer: decide based on preferences (of members) *and* predictions (about the mission).



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- Role of such mechanisms in a governance structure
- Can organizations avoid capture?

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