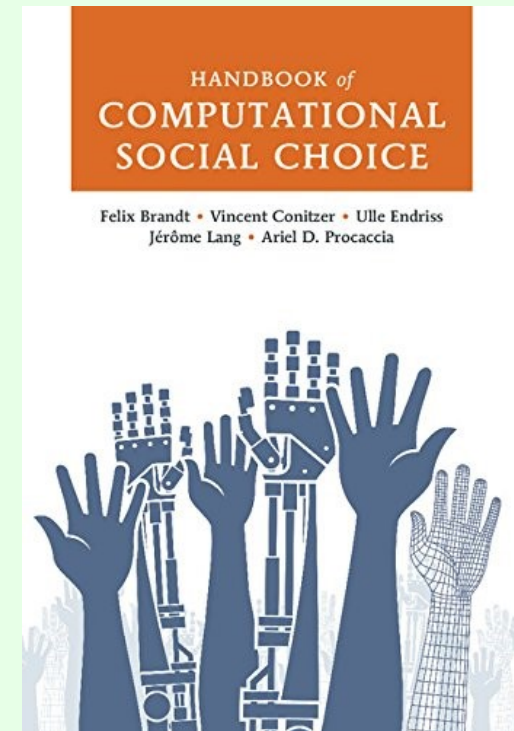


A Crash Course on Computational Social Choice and Fair Division

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Computation (EC), 2018

comsoc mailing list: <https://lists.duke.edu/sympa/subscribe/comsoc>





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Voting

n voters...



... each produce a ranking of m alternatives...

$$b \succ a \succ c$$

$$a \succ c \succ b$$

$$a \succ b \succ c$$

... which a **social preference function (SPF)** maps to one or more aggregate rankings.

$$a \succ b \succ c$$

... or, a **social choice function (SCF)** just produces one or more winners.

a

Plurality

1 0 0

$b \succ a \succ c$

$a \succ b \succ c$

$a \succ c \succ b$

2 1 0

$a \succ b \succ c$



Borda

2 1 0

$b \succ a \succ c$

$a \succ b \succ c$

$a \succ c \succ b$

5 3 1

$a \succ b \succ c$



Instant runoff voting / single transferable vote (STV)



$b \succ a \succ c$

$a \succ b \succ c$



$a \succ b \succ b$



$a \succ b \succ c$

Kemeny



$$b \succ a \succ c$$



$$a \succ c \succ b$$



$$a \succ b \succ c$$

$$a \succ b \succ c$$

2 disagreements

\leftrightarrow

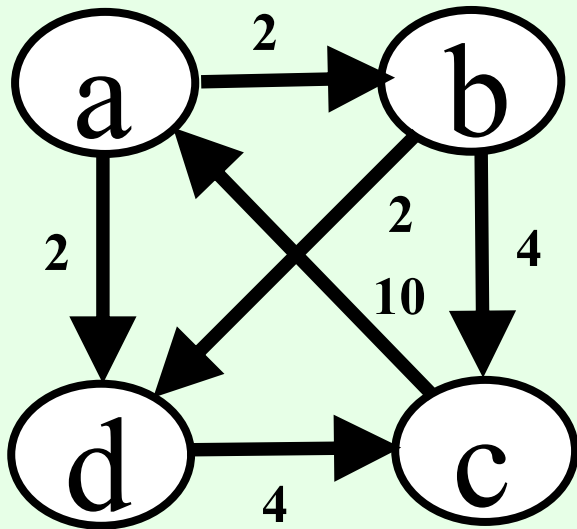
$3 \cdot 3 - 2 = 7$ agreements
(maximum)

- Natural interpretation as maximum likelihood estimate of the “correct” ranking [Young 1988, 1995]

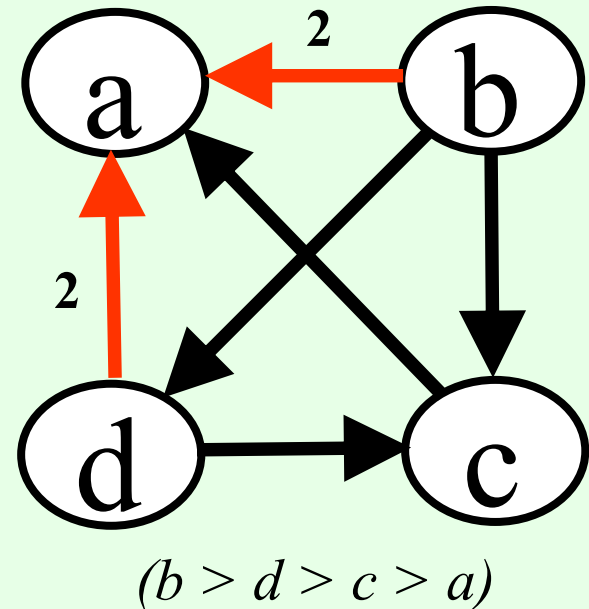
Kemeny on pairwise election graphs

- Final ranking = acyclic tournament graph
 - Edge (a, b) means a ranked above b
 - **Acyclic** = no cycles, **tournament** = edge between every pair
- Kemeny ranking seeks to minimize the total **weight** of the inverted edges

pairwise election graph



Kemeny ranking

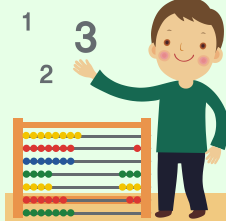
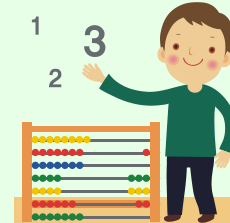
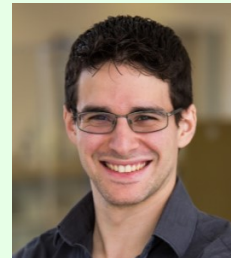
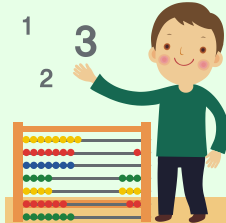


- NP-hard even with 4 voters [Dwork et al. 2001]
- Integer programs scale reasonably [C., Davenport, Kalagnanam 2006]

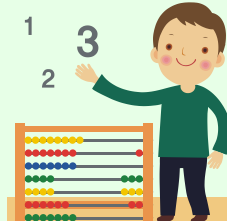
Ranking Ph.D. applicants

(briefly described in [C. \[2010\]](#))

- Input: Rankings of **subsets** of the (non-eliminated) applicants



- Output: (one) Kemeny ranking of the (non-eliminated) applicants



Choosing a rule

- How do we choose a rule from all of these rules?
- How do we know that there does not exist another, “perfect” rule?
- Let us look at some **criteria** that we would like our voting rule to satisfy

Condorcet criterion

- A candidate is the **Condorcet winner** if it wins all of its pairwise elections
- Does not always exist...
- ... but the Condorcet criterion says that if it does exist, it should win

- Many rules do not satisfy this
- E.g., for plurality:
 - $b > a > c > d$
 - $c > a > b > d$
 - $d > a > b > c$
- a is the Condorcet winner, but it does not win under plurality

Consistency (SPF sense)

**Session 2B: Consistent
approval-based multi-
winner rules**

- An SPF f is said to be **consistent** if the following holds:
 - Suppose V_1 and V_2 are two voting profiles (multisets) such that f produces the same ranking on both
 - Then f should produce the same ranking on their union.
- Which of our rules satisfy this?

Consistency (SCF sense)

- An SCF f is said to be **consistent** if the following holds:
 - Suppose V_1 and V_2 are two voting profiles (multisets) such that f produces the same **winner** on both
 - Then f should produce the same winner on their union.
- Which of our rules satisfy this?
- Consistency properties are closely related to interpretability as MLE of the truth [C., Rognlie, Xia 2009]

Some axiomatizations

- **Theorem [Young 1975].** An SCF is symmetric, consistent, and continuous if and only if it is a positional scoring rule.
- **Theorem [Young and Levenglick 1978].** An SPF is neutral, consistent, and Condorcet if and only if it is the Kemeny SPF.
- **Theorem [Freeman, Brill, C. 2014].** An SPF satisfies independence of bottom alternatives, consistency at the bottom, independence of clones (& some minor conditions) if and only if it is the STV SPF.

Manipulability

- Sometimes, a voter is better off revealing her preferences insincerely, AKA **manipulating**
- E.g., plurality
 - Suppose a voter prefers $a > b > c$
 - Also suppose she knows that the other votes are
 - 2 times $b > c > a$
 - 2 times $c > a > b$
 - Voting truthfully will lead to a tie between b and c
 - She would be better off voting, e.g., $b > a > c$, guaranteeing b wins

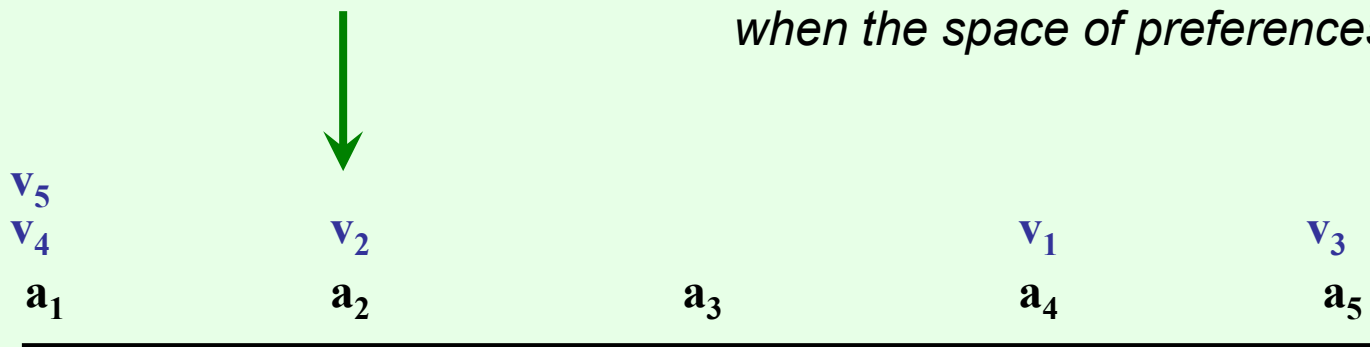
Gibbard-Satterthwaite impossibility theorem

- Suppose there are at least 3 alternatives
- There exists no rule that is simultaneously:
 - **non-imposing/onto** (for every alternative, there are some votes that would make that alternative win),
 - **nondictatorial** (there does not exist a voter such that the rule simply always selects that voter's first-ranked alternative as the winner), and
 - **nonmanipulable/strategy-proof**

Single-peaked preferences

- Suppose candidates are ordered on a line
- Every voter prefers candidates that are closer to her most preferred candidate
- Let every voter report only her most preferred candidate (“peak”)
- Choose the **median voter’s** peak as the winner
 - This will also be the Condorcet winner
- Nonmanipulable!

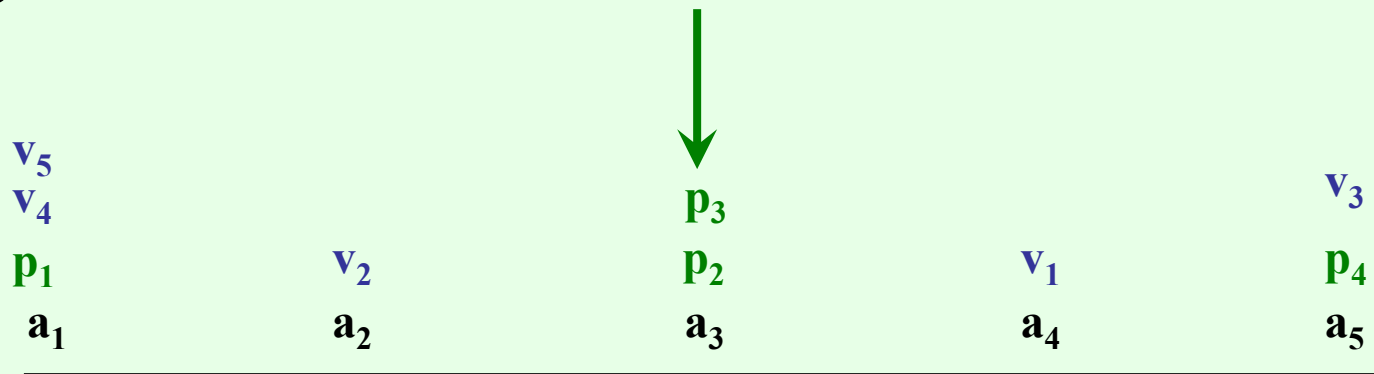
Impossibility results do not necessarily hold when the space of preferences is restricted



Moulin's characterization

Session 1A: *Strategyproof
linear regression in high
dimensions*

- Slight generalization: add **phantom** voters, then choose the median of real+phantom voters
- **Theorem [Moulin 1980]**. Under single-peaked preferences, an SCF is strategy-proof, Pareto efficient, and anonymous if and only if it is such a generalized median rule.



Computational hardness as a barrier to manipulation

- A (successful) manipulation is a way of misreporting one's preferences that leads to a better result for oneself
- Gibbard-Satterthwaite only tells us that for some instances, successful manipulations exist
- It does not say that these manipulations are always easy to find
- Do voting rules exist for which manipulations are computationally hard to find?

A formal computational problem

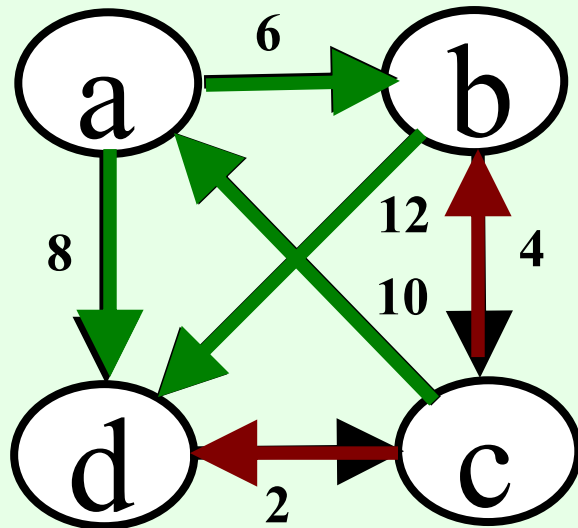
- The simplest version of the manipulation problem:
- **CONSTRUCTIVE-MANIPULATION:**
 - We are given a voting rule r , the (unweighted) votes of the other voters, and an alternative p .
 - We are asked if we can cast our (single) vote to make p win.
- E.g., for the Borda rule:
 - Voter 1 votes $A > B > C$
 - Voter 2 votes $B > A > C$
 - Voter 3 votes $C > A > B$
- Borda scores are now: A: 4, B: 3, C: 2
- Can we make B win?
- Answer: YES. Vote $B > C > A$ (Borda scores: A: 4, B: 5, C: 3)

Early research

- **Theorem.** CONSTRUCTIVE-MANIPULATION is NP-complete for the second-order Copeland rule. [Bartholdi, Tovey, Trick 1989]
 - **Second order Copeland** = alternative's score is sum of Copeland scores of alternatives it defeats
- **Theorem.** CONSTRUCTIVE-MANIPULATION is NP-complete for the STV rule. [Bartholdi, Orlin 1991]
- Most other rules are easy to manipulate (in P)

Ranked pairs rule [Tideman 1987]

- Order pairwise elections by decreasing strength of victory
- Successively “lock in” results of pairwise elections unless it causes a cycle



Final ranking:
 $c > a > b > d$

- **Theorem.** CONSTRUCTIVE-MANIPULATION is NP-complete for the ranked pairs rule [Xia et al. IJCAI 2009]

Many manipulation problems...

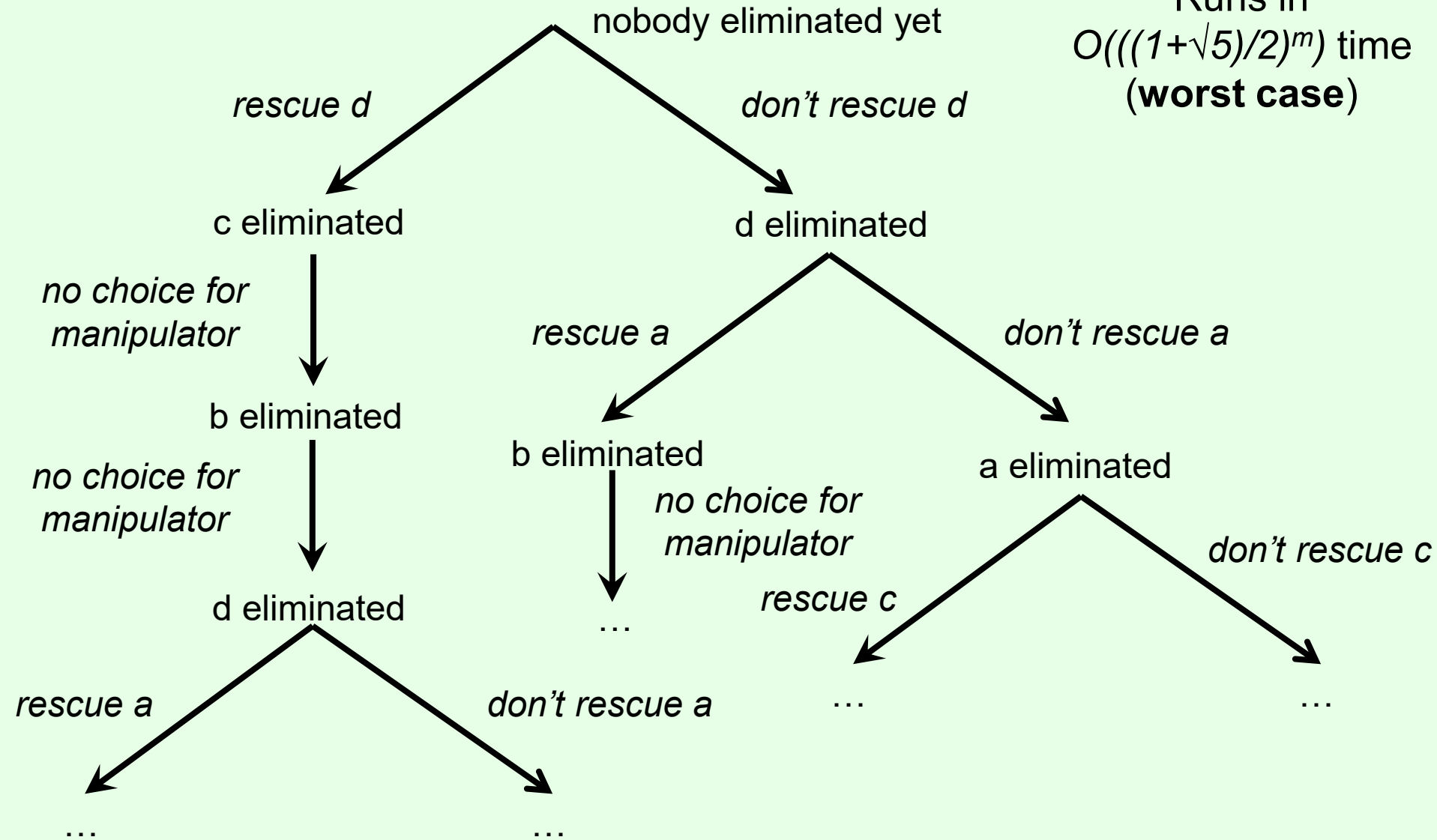
# alternatives # manipulators	unweighted votes, constructive manipulation		weighted votes,							
	1	≥ 2	2	3	4	≥ 5	2	3	≥ 4	
plurality	P	P	P	P	P	P	P	P	P	P
plurality with runoff	P	P	P	NP-c	NP-c	NP-c	NP-c	P	NP-c	NP-c
veto	P	P	P	NP-c	NP-c	NP-c	NP-c	P	P	P
cup	P	P	P	P	P	P	P	P	P	P
Copeland	P	P	P	P	NP-c	NP-c	NP-c	P	P	P
Borda	P	NP-c	P	NP-c	NP-c	NP-c	NP-c	P	P	P
Nanson	NP-c	NP-c	P	P	NP-c	NP-c	NP-c	P	P	NP-c
Baldwin	NP-c	NP-c	P	NP-c	NP-c	NP-c	NP-c	P	NP-c	NP-c
Black	P	NP-c	P	NP-c	NP-c	NP-c	NP-c	P	P	P
STV	NP-c	NP-c	P	NP-c	NP-c	NP-c	NP-c	P	NP-c	NP-c
maximin	P	NP-c	P	P	NP-c	NP-c	NP-c	P	P	P
Bucklin	P	P	P	NP-c	NP-c	NP-c	NP-c	P	P	P
fallback	P	P	P	P	P	P	P	P	P	P
ranked pairs	NP-c	NP-c	P	P	P	NP-c	NP-c	P	P	?
Schulze	P	P	P	P	P	P	P	P	P	P

Table from: C. & Walsh, Barriers to Manipulation, Chapter 6 in *Handbook of Computational Social Choice*

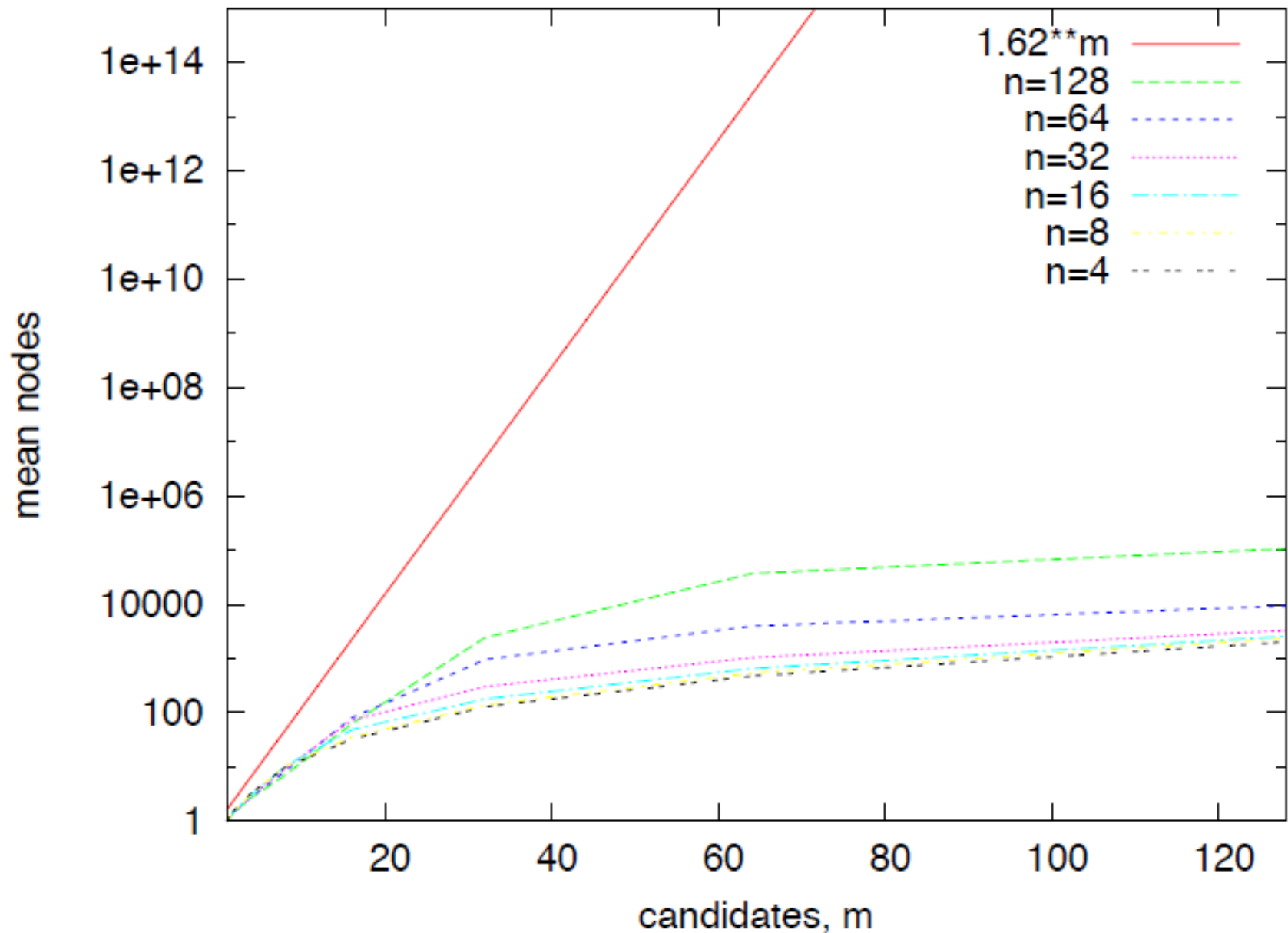
STV manipulation algorithm

[C., Sandholm, Lang JACM 2007]

Runs in
 $O(\left(\frac{1+\sqrt{5}}{2}\right)^m)$ time
(**worst case**)



Runtime on random votes [Walsh 2011]



Fine – how about another rule?

- **Heuristic algorithms and/or experimental (simulation) evaluation** [C. & Sandholm 2006, Procaccia & Rosenschein 2007, Walsh 2011, Davies, Katsirelos, Narodytska, Walsh 2011]
- **Quantitative versions of Gibbard-Satterthwaite** showing that under certain conditions, for some voter, even a random manipulation on a random instance has significant probability of succeeding [Friedgut, Kalai, Nisan 2008; Xia & C. 2008; Dobzinski & Procaccia 2008; Isaksson, Kindler, Mossel 2010; Mossel & Racz 2013]

“for a social choice function f on $k \geq 3$ alternatives and n voters, which is ϵ -far from the family of nonmanipulable functions, a uniformly chosen voter profile is manipulable with probability at least inverse polynomial in n , k , and ϵ^{-1} .”

Just a bit about fair allocation of resources

Several talks in 9A

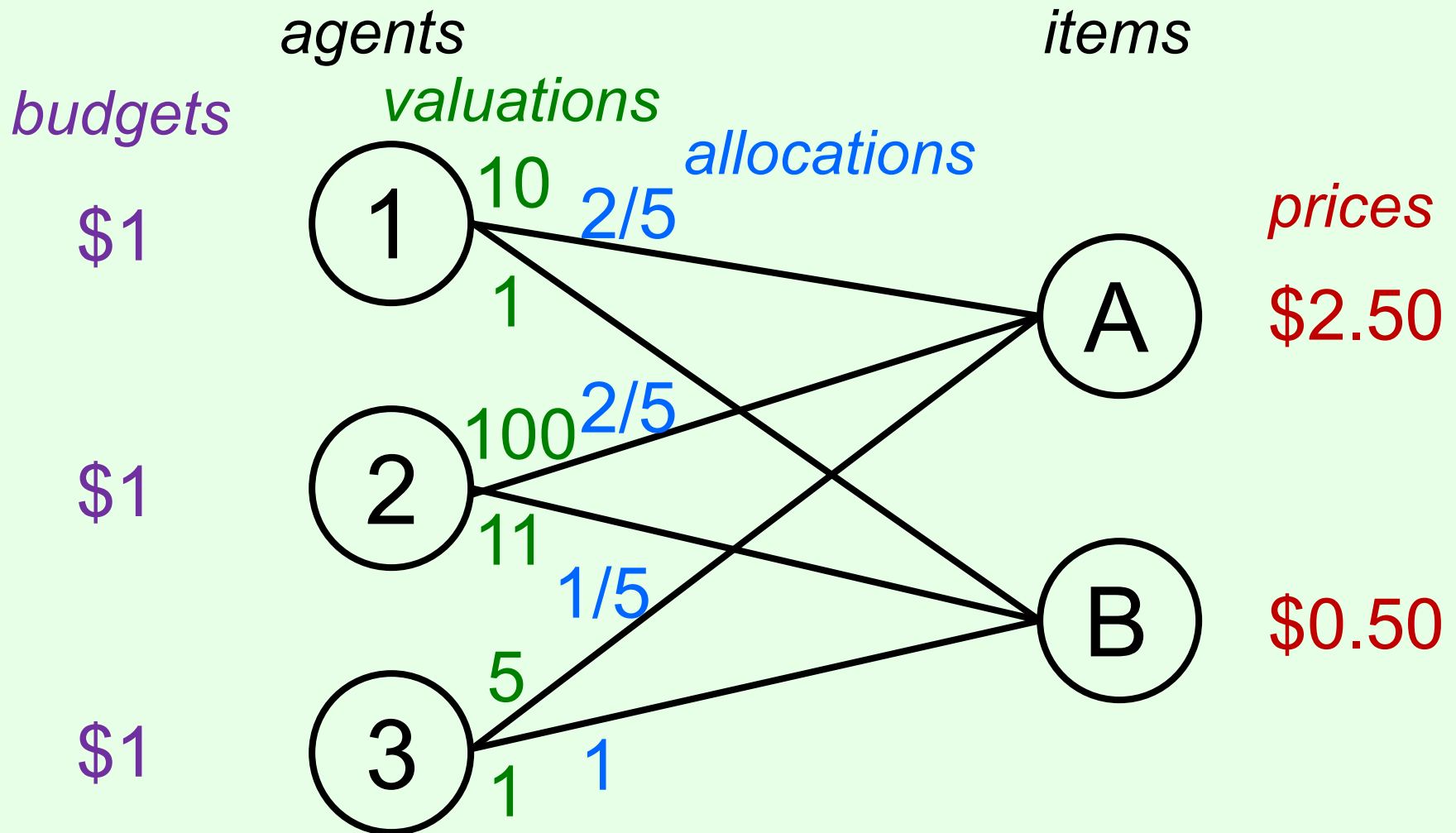
- Suppose we have m items and n agents
- Agent i values item j at v_{ij} (additive valuations)
- Who should receive what? (**no payments!**)
- One solution: $\max \sum_{ij} v_{ij} x_{ij}$
- Downsides?
- Better: \max **Nash welfare**, $\max \prod_i (\sum_j v_{ij} x_{ij})$
- Does it matter if items are divisible?

Eisenberg-Gale convex program

- Max $\sum_i \log u_i$
- subject to:
- for all i , $u_i = \sum_j v_{ij} x_{ij}$
- for all j , $\sum_i x_{ij} \leq 1$
- for all i and j , $x_{ij} \geq 0$

- Finding the optimal integer solution (indivisible items) is NP-hard [Ramezani and Endriss 2010], can be approximated efficiently in a sense [Cole and Gkatzelis 2015]

Competitive equilibrium from equal incomes (CEEI)



Nash welfare: $4 \cdot 40 \cdot 2 = 320$

Note: $(4 - 10\varepsilon) \cdot 40 \cdot (2 + 5\varepsilon) = 320 - 2000\varepsilon^2$

Nice properties of the max Nash welfare solution

- With divisible items, it constitutes a **competitive equilibrium from equal incomes!**
 - Follows from KKT conditions on convex program
 - Instant corollaries: **envy-free, proportional**
- With indivisible items:
 - *envy-free up to one good* [Caragiannis et al. 2016]
 - *proportional up to one good* (can be generalized to public decisions) [C., Freeman, Shah 2017]