

Part4- Voting



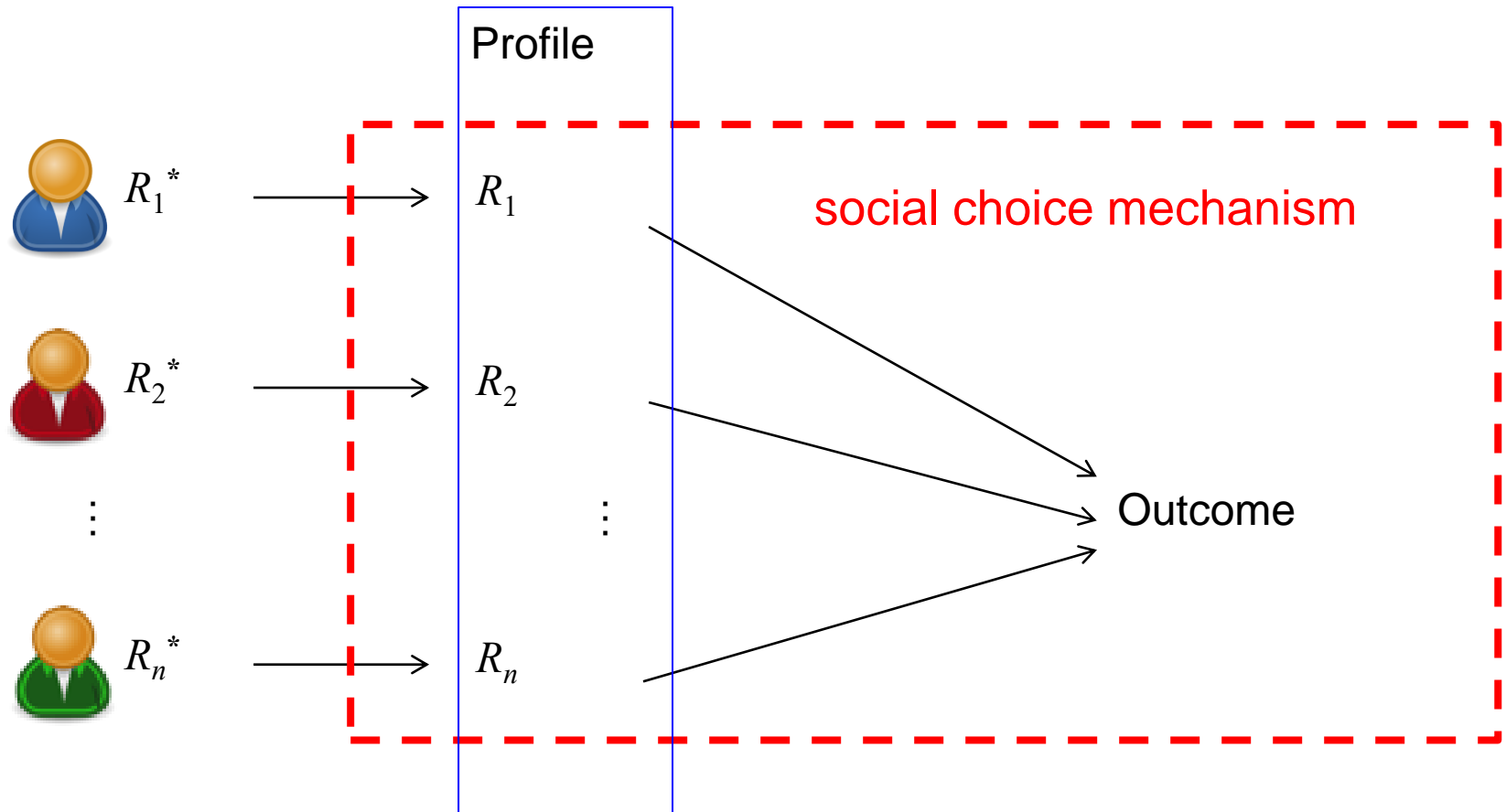
Based on slides by Lirong Xia, Ester David and Avinatan Hassidim

Social choice

“social choice is a theoretical framework for analysis of combining individual preferences, interests, or welfares to reach a collective decision or social welfare in some sense.”

---Wikipedia Aug 26, 2013

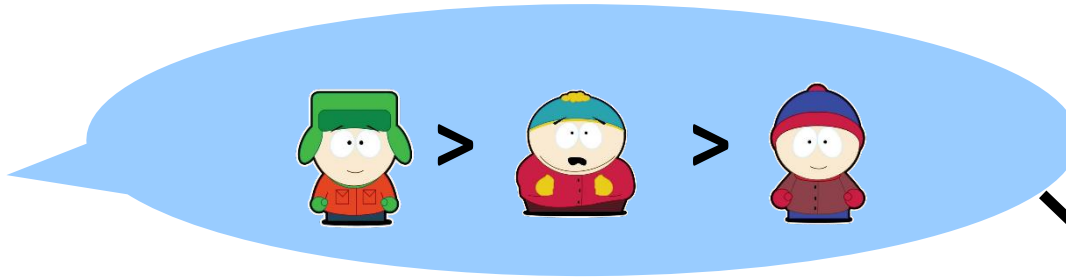
Social choice problems



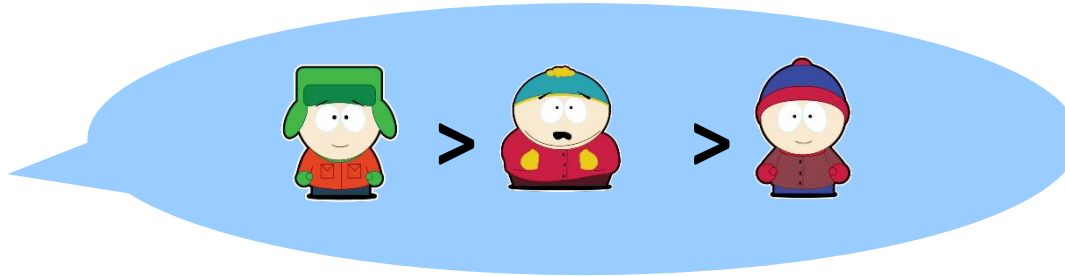
- Agents
- Alternatives
- Outcomes
- Preferences (true and reported)
- Social choice mechanism

Example: Political elections

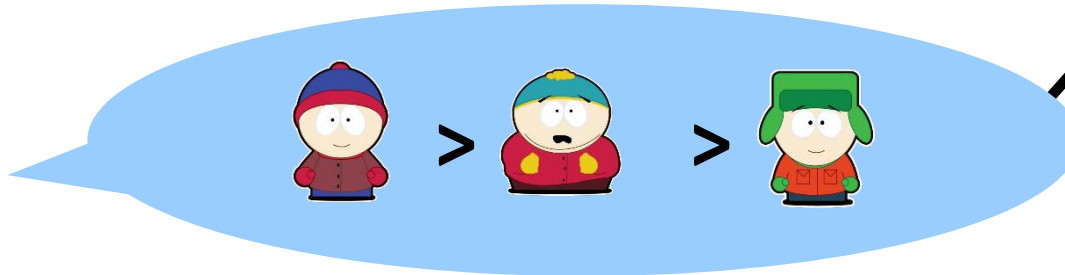
Alice






Bob



Carol



Why is this social choice?

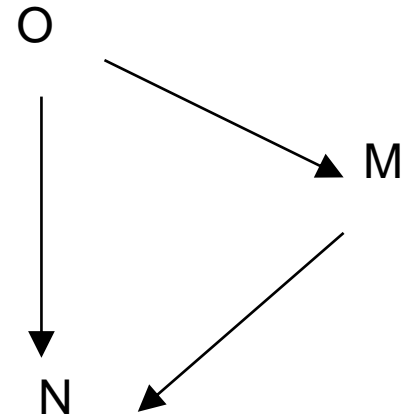
- Agents: {Alice, Bob, Carol}
- Alternatives: { , ,  }
- Outcomes: **winners** (alternatives)
- Preferences (vote): rankings over alternatives
- Mechanisms: voting rules
- Can vote over just about anything
 - political representatives, award nominees, where to go for dinner tonight, joint plans, allocations of tasks/resources, ...
 - Also can consider other applications: e.g., aggregating search engines' rankings into a single ranking

More formally

- Agents: n voters, $N=\{1,\dots,n\}$
- Alternatives: m candidates,
 - $A=\{a_1,\dots,a_m\}$ or $\{a, b, c, d,\dots\}$
- Outcomes:
 - winners (alternatives): $O=A$. Social choice function
 - rankings over alternatives: $O=\text{Rankings}(A)$. Social welfare function
- Preferences: R_j^* and R_j are full rankings over A
 - Extensions include indifference and incompleteness
- Voting rule: a function that maps each profile to an outcome

Recall: binary relation

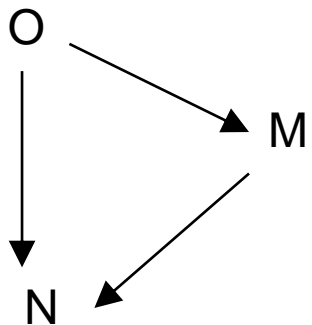
- Given a set of alternatives A
- A **binary relation** R is a subset of $A \times A$
 - $(a,b) \in R$ means “ a is preferred to b ”
 - Also write $a >_R b$
- Example
 - $A = \{O, M, N\}$
 - $R = \{(O,M), (O,N), (M,N)\}$
- Graphical representation
 - Vertices are A
 - There is an edge $a \rightarrow b$ if and only if $(a,b) \in R$



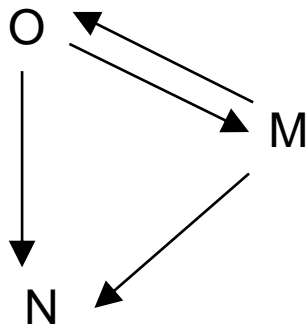
Linear orders - full rankings

Linear orders (rankings without ties): binary relations that satisfies

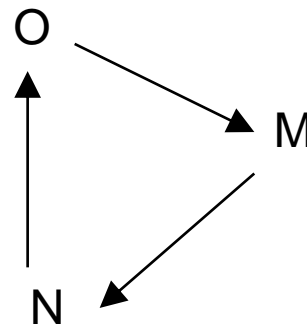
- **Antisymmetry** (no ties): $a >_R b$ and $b >_R a$ implies $a = b$
- **Transitivity**: $a >_R b$ and $b >_R c$ implies $a >_R c$
- **Totality**: for all a, b , one of $a >_R b$ or $b >_R a$ must hold



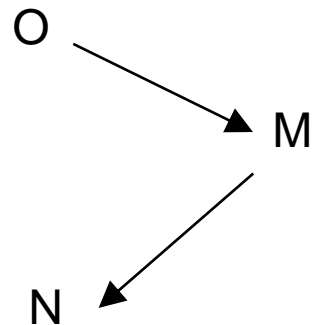
Yes



no,
Antisymmetry



no,
transitivity



no,
totality

Voting rules

- Majority rule: if a candidate is ranked first by most votes, that candidate should win
 - But what if there is no such candidate?
- Plurality: candidate with most votes wins
 - Otherwise known as “first past the post”
- Some (informal) criticisms
 - Ignores preferences other than favorite
 - Encourages voters to vote tactically
 - *“My candidate cannot win so I’ll vote for my second favorite”*

Is the winner indeed a “good” one?

$$P = \left\{ \begin{array}{ll} \boxed{a > b > c} \times 4, & \boxed{b > c > a} \times 3 \\ \boxed{b > a > c} \times 2, & \boxed{c > a > b} \times 2 \end{array} \right\}$$

$$\text{Plurality}(P) = b$$

But the majority of the voters prefer a to b (6 out of 11).
They also prefer a to c.

One possible generalization of Plurality



Jean Charles de Borda, 1733-1799

Borda: given m candidates

- i th ranked candidate score $m-i$
- Candidate with greatest sum of scores wins

Borda - example

$$P = \left\{ \begin{array}{ll} \boxed{\text{Obama} > \text{Clinton} > \text{McCain}} \times 4, & \boxed{\text{McCain} > \text{Clinton} > \text{Obama}} \times 3 \\ \boxed{\text{Clinton} > \text{Obama} > \text{McCain}} \times 2, & \boxed{\text{McCain} > \text{Obama} > \text{Clinton}} \times 2 \end{array} \right\}$$

Borda scores



$$: 4 \times 2 + 4 \times 1 = 12$$



$$: 2 \times 2 + 7 \times 1 = 11$$



$$: 5 \times 2 = 10$$

Borda(P)=



Positional scoring rules

- Characterized by a **score vector** s_1, \dots, s_m in non-increasing order
- For each vote R , the alternative ranked in the i -th position gets s_i points
- The alternative with the most total points is the winner
- Special cases
 - Borda: score vector $(m-1, m-2, \dots, 0)$
 - k -approval: score vector $(\underbrace{1 \dots 1}_k, 0 \dots 0)$
 - Plurality: score vector $(1, 0 \dots 0)$
 - Veto: score vector $(1 \dots 1, 0)$

Example

$$P = \left\{ \begin{array}{ll} \boxed{\text{Obama} > \text{Clinton} > \text{McCain}} \times 4, & \boxed{\text{McCain} > \text{Clinton} > \text{Obama}} \times 3 \\ \boxed{\text{Clinton} > \text{Obama} > \text{McCain}} \times 2, & \boxed{\text{McCain} > \text{Obama} > \text{Clinton}} \times 2 \end{array} \right\}$$

Borda



Plurality
(1- approval)



Veto
(2-approval)



Is the winner indeed a “good” one?

$$P = \left\{ \begin{array}{ll} \boxed{a > b > c} \times 4, & \boxed{b > c > a} \times 3 \\ \boxed{b > a > c} \times 2, & \boxed{c > a > b} \times 2 \end{array} \right\}$$

$$\text{Borda}(P) = b, \text{ Veto}(P) = b$$

But the majority of the voters prefer a to b (6 out of 11).
They also prefer a to c.



Another possible generalization of Plurality

- Plurality with runoff: the election has two rounds
 - First round, all alternatives except the two with the highest plurality scores drop out
 - Second round, the alternative preferred by more voters wins
- [used in France, Iran, North Carolina State]

Example: Plurality with runoff

$$P = \left\{ \begin{array}{ll} \boxed{\text{Obama} > \text{Romney} > \text{McCain}} \times 4, & \boxed{\text{McCain} > \text{Romney} > \text{Obama}} \times 3 \\ \boxed{\text{Romney} > \text{Obama} > \text{McCain}} \times 2, & \boxed{\text{McCain} > \text{Obama} > \text{Romney}} \times 2 \end{array} \right\}$$

- First round:  drops out

- Second round:  defeats 



Different from Plurality!

Single transferable vote (STV)

- Also called **instant run-off voting** or **alternative vote**
- The election has $m-1$ rounds, in each round,
 - The alternative with the **lowest** plurality score drops out, and is **removed** from all votes
 - The last-remaining alternative is the winner
- **[used in Australia and Ireland]**

$a > b > c \gg d$	$d > a \gg b > c$	$c \gg d \gg a > b$	$b > c \gg d > a$
10	7	6	3



Should we consider pairwise elections directly?



Marie Jean Antoine Nicolas de Caritat,
marquis de Condorcet (1743 – 1794)

- We saw several voting rules that are trying to generalize the concept of “majority” in different ways.
- Condorcet proposed another way, which relies on **pairwise elections**.
- a beats b in pairwise elections, if more voters prefer a over b .

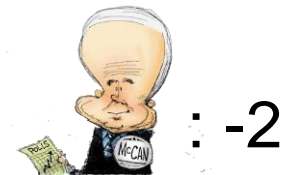
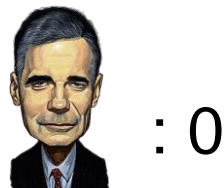
Should we consider pairwise elections directly?

- We can define several voting rules based on the idea of pairwise elections. For example, the Copeland protocol.
- The Copeland score of an alternative is its total “pairwise wins” minus its “pairwise loses”.
- The winner is the alternative with the highest Copeland score.

Example: Copeland

$$P = \left\{ \begin{array}{ll} \boxed{\text{Obama} > \text{Romney} > \text{McCain}} \times 4, & \boxed{\text{McCain} > \text{Romney} > \text{Obama}} \times 3 \\ \boxed{\text{Romney} > \text{Obama} > \text{McCain}} \times 2, & \boxed{\text{McCain} > \text{Obama} > \text{Romney}} \times 2 \end{array} \right\}$$

Copeland score:



Which is best?

- So many voting rules to choose from ..
- 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
- The axiomatic approach (again...)

Fairness axioms

- **Anonymity:** names of the voters do not matter
 - Fairness for the voters
- **Non-dictatorship:** there is no dictator, whose top-ranked alternative is always the winner, no matter what the other votes are
 - Fairness for the voters
- **Neutrality:** names of the alternatives do not matter
 - Fairness for the alternatives

Monotonicity criteria

- Informally, monotonicity means that “ranking a candidate higher should help that candidate,” but there are multiple nonequivalent definitions
- A **weak** monotonicity requirement: if
 - candidate w wins for the current votes,
 - we then improve the position of w in some of the votes and leave everything else the same,then w should still win.

Weak monotonicity

- Does STV satisfy the weak monotonicity criterion?
 - 7 votes $b > c > a$
 - 7 votes $a > b > c$
 - 6 votes $c > a > b$
- c drops out first, its votes transfer to a, a wins
- But if 2 votes $b > c > a$ change to $a > b > c$, b drops out first, its 5 votes transfer to c, and c wins.
- What about plurality with runoff?
- What about Copeland?

Strong monotonicity

- A strong monotonicity requirement: if
 - candidate w wins for the current votes,
 - we then change the votes in such a way that for each vote, if a candidate c was ranked below w originally, c is still ranked below w in the new vote
 - then w should still win.
- Note the other candidates can jump around in the vote, as long as they don't jump ahead of w

May's theorem (1952)

- Thm: With 2 candidates, a voting rule is anonymous, neutral and monotonic iff it is the plurality rule
 - Since these properties are uncontroversial, this about decides what to do with 2 candidates!
 - Proof: Plurality rule is clearly anonymous, neutral and monotonic
 - Other direction is more interesting
 - For simplicity, assume an odd number of voters

May's theorem (1952)

- Thm: With 2 candidates, a voting rule is anonymous, neutral and monotonic iff it is the plurality rule
 - Proof: Anonymous and neutral implies only number of votes matters
 - Two cases:
 - $N(A > B) = N(B > A) + 1$ and A wins.
 - By monotonicity, A wins whenever $N(A > B) > N(B > A)$
 - $N(A > B) = N(B > A) + 1$ and B wins
 - Swap one vote $A > B$ to $B > A$. By monotonicity, B still wins. But now $N(B > A) = N(A > B) + 1$. By neutrality, A wins. This is a contradiction.

Weak Pareto efficiency criterion

- If all agents prefer a to b , the voting rule will never choose b to be the winner.
- Note: the voting rule does not have to choose a .
- However, if all votes rank a first, then a should win.
- This criterion is also called **unanimity**.
- Does Plurality satisfy weak Pareto efficiency?
- Does Copeland satisfy weak Pareto efficiency?

Condorcet criterion

- A candidate is a Condorcet winner if a beats any other candidate in a pairwise election.
- A voting rule is Condorcet consistent if the Condorcet winner is always selected.
- We already saw that Plurality and Borda are not Condorcet consistent

Condorcet paradox

$$P = \left\{ \begin{array}{ll} \boxed{a > b > c} \times 4, & \boxed{b > c > a} \times 3 \\ \boxed{b > a > c} \times 2, & \boxed{c > a > b} \times 2 \end{array} \right\}$$

Plurality(P), Borda(P)=b

- Candidate a is the Condorcet winner.

Condorcet paradox

$$P = \left\{ \begin{array}{ll} \boxed{a > b > c} \times 4, & \boxed{b > c > a} \times 3 \\ \boxed{b > a > c} \times 2, & \boxed{c > a > b} \times 4 \end{array} \right\}$$

Plurality(P), Borda(P)=b

- Candidate a is the Condorcet winner.
- What if we add two voters that prefer $c > a > b$?
- Majority prefer a to b, and prefer b to c, and prefer c to a!

Condorcet criterion

- A voting rule is Condorcet consistent if the Condorcet winner is always selected, **when there is one**.
- If there is a Condorcet winner, then it is unique.

Condorcet criterion

- **Theorem (Fishburn-1974).** No positional scoring rule with strict ordering of weights satisfies Condorcet criterion:

– suppose $s_1 > s_2 > s_3$

3 Voters



2 Voters



1 Voter



1 Voter



Obama is the Condorcet winner

CONTRADICTION

Obama : $3s_1 + 2s_2 + 2s_3$

McCain : $3s_1 + 3s_2 + 1s_3$

▲

Majority criterion

- If a candidate is ranked first by most votes, that candidate should win.
 - Relationship to Condorcet criterion?
- Some rules do not even satisfy this
- E.g. Borda:
 - $a > b > c > d > e$
 - $a > b > c > d > e$
 - $c > b > d > e > a$
- a is the majority winner, but it does not win under Borda

Muller-Satterthwaite impossibility theorem [1977]

- Is Copeland the best voting rule?
- Theorem: Suppose there are at least 3 candidates. Then there exists no rule that simultaneously:
 - satisfies weak Pareto efficiency,
 - is non-dictatorial, and
 - is monotone (in the strong sense).

Social welfare function

- Let's look on our voting rules as social welfare functions.
- How to generalize our previous criteria:
 - Anonymity and neutrality: the same.
 - Non-dictatorship: there does not exist a voter such that the rule simply always copies that voter's ranking.
 - Weak Pareto efficiency \rightarrow Pareto efficiency: if all votes rank a above b , then the rule should rank a above b .

Independence of irrelevant alternatives

- Result between a and b only depends on the agents preferences between a and b .
- Formally, for two profiles $D_1 = (R_1, \dots, R_n)$ and $D_2 = (R_1', \dots, R_n')$ and any pair of alternatives a and b ,
 - if for all voter j , the pairwise comparison between a and b in R_j is the same as that in R_j'
 - then the pairwise comparison between a and b are the same in $f(D_1)$ as in $f(D_2)$
 - even if voters' preferences between other pairs like a and x , b and y , or x and y change

Arrow's impossibility theorem [1951]

- Theorem: Suppose there are at least 3 candidates. Then there exists no rule that simultaneously:
 - satisfies Pareto efficiency,
 - is non-dictatorial, and
 - satisfies independent of irrelevant alternatives.
- The idea: we have to break Condorcet cycles, but how we do this, inevitably leads to trouble
- A genius observation
 - Led to the Nobel prize in economics

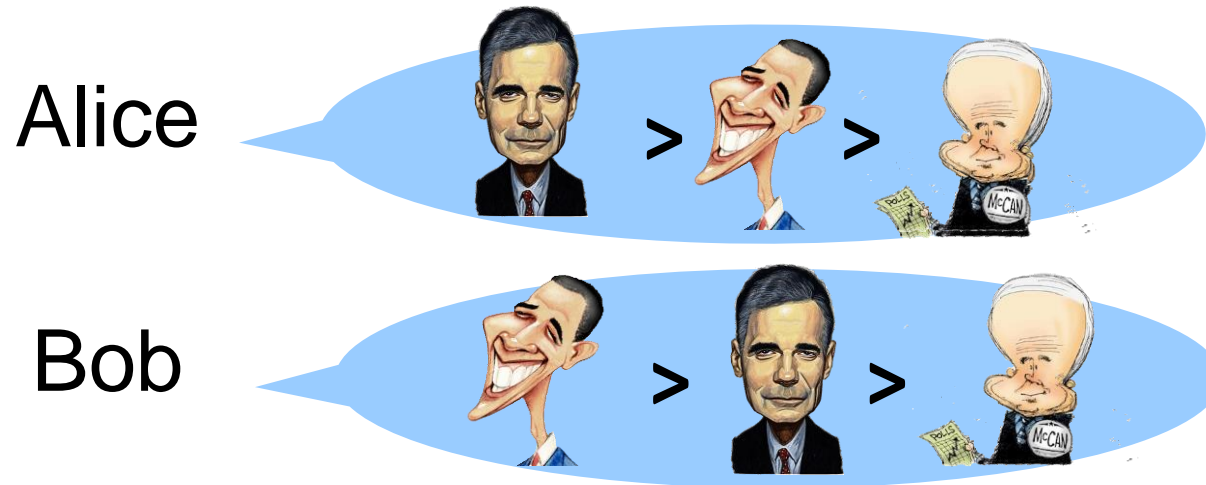
Strategic behavior (of the agents)

- **Manipulation**: an agent (manipulator) casts a vote that does not represent her true preferences, to make herself better off
- A voting rule is **strategy-proof** if there is never a (beneficial) manipulation under this rule
- Do you think Plurality is strategy-proof?

Manipulation under Plurality

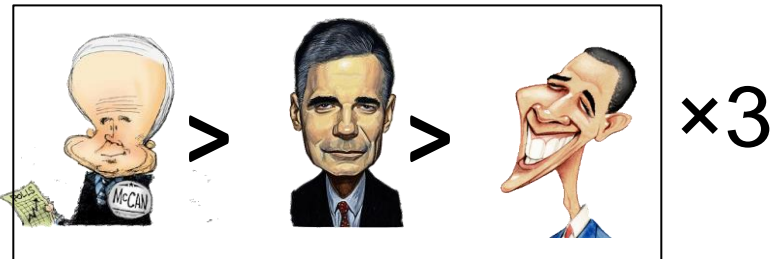
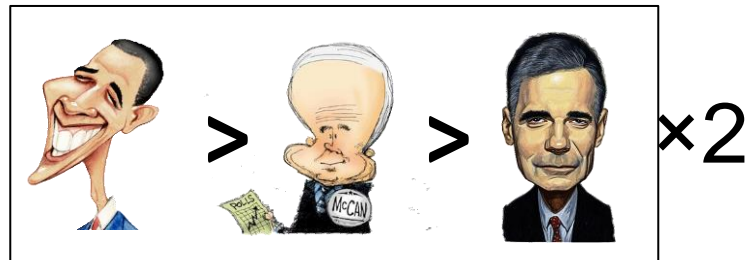
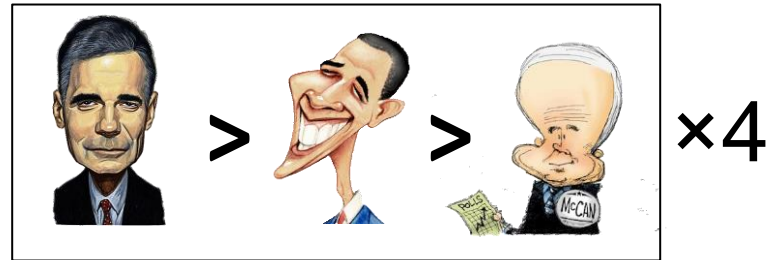
- Suppose a voter prefers $a > b > c$
- Also suppose she knows that the other votes are
 - 2 times $b > c > a$
 - 2 times $c > a > b$
- Voting truthfully will lead to a tie between b and c
- She would be better off voting e.g. $b > a > c$, guaranteeing b wins

Manipulation under Borda



What if we change the tie-breaking mechanism?

Manipulation under STV



$N > O > M \rightarrow O > N > M$

Gibbard-Satterthwaite impossibility theorem

- Suppose there are at least 3 candidates
- There exists no rule that is simultaneously:
 - onto (for every candidate, there are some votes that would make that candidate win),
 - nondictatorial, and
 - nonmanipulable
- This is a powerful negative result

Computational perspective

- We first need to verify that the voting rules are not too complicated so that nobody can easily compute the winner.
- The winner determination problem:
 - Given: a voting rule f
 - Input: a preference profile P and an alternative c
 - input size: $nm \log m$
 - Output: is c the winner of f under P ?
- We want a voting rule where the winner determination is in P.

Computational perspective

- The winner determination problem for all of the voting rules that we saw is in P. 😊
- There are some interesting and important voting rules where the winner determination problem is NP-hard. 😞
 - Dodgson rule
 - Kemeny rule

Dodgson voting rule

- We saw that there is not always a Condorcet winner.
- A Dodgson winner is a candidate who is "closest" to being a unique Condorcet winner.
- That is, the Dodgson score of a candidate, a , is the smallest number of sequential exchanges of adjacent candidates in preference orders such that after those exchanges a is a Condorcet winner.

Example: Dodgson voting rule

- 2 voters that vote for: $a > b > c$
- The Dodgson scores of a, b, c are 0, 2, 4 respectively.
- Now suppose we have 2 voters with
 - $a > b > c$
 - $b > a > c$
- The Dodgson scores of a, b, c are 1, 1, 4 respectively.

Kemeny voting rule

- The idea: create an overall ranking of the candidates that has as few *disagreements* as possible.
- Kendall tau distance
 - $K(R1, R2) = \# \{ \text{different pairwise disagreements} \}$
 - Also called bubble-sort distance, since it is also the number of swaps that the bubble sort algorithm would make to place one list in the same order as the other list

$$K(b > c > a , a > b > c) = ?$$

Kemeny voting rule

- $\text{Kemeny}(P) = \operatorname{argmin}_W K(P, W) = \operatorname{argmin}_W \sum_{R \in P} K(R, W)$
- For single winner, choose the top-ranked alternative in $\text{Kemeny}(P)$
- E.G.,

$a \succ b \succ c \succ d$	$b \succ a \succ c \succ d$	$d \succ a \succ b \succ c$	$c \succ d \succ b \succ a$
1	1	2	2

- $K(P, a \succ b \succ c \succ d) = 0 + 1 + 2 * 3 + 2 * 5 = 17$

Computational perspective

- Gibbard-Satterthwaite only tells us that for some instances, successful manipulations exist.
- It does not say that these manipulations are always easy to find.
- If it is computationally too hard for a manipulator to compute a manipulation, she is best off voting truthfully
 - Similar as in cryptography
- For which common voting rules manipulation is computationally hard?

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: $A: 4, B: 5, C: 3$)

A formal computational problem

- We can also extend the single manipulation problem to a coalitional manipulation problem:
- **CONSTRUCTIVE-COALITION-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 k votes to make p win.
- Can be extended to a weighted version, and to a destructive version.

Results

- Plurality, Veto, Pluarlity with runoff: manipulation is easy.
- Copeland, Borda: easy for a single manipulator [BTT SCW-89], NP-C if there at least 2 manipulators [FHS AAMAS-08,10], [DKN+ AAAI-11] [BNW IJCAI-11].
- STV: NP-C even with a single manipulator! [BO SCW-91]
- But wait, is computational complexity a strong barrier?
 - NP-hardness is a worst-case concept

Manipulating Borda

- Suppose you want to add k manipulators for Borda who would promote p
- Clearly, p should be ranked first in all of them
- If we could rank no one else, we would be happy
 - But we have to give points to other candidates
- So the goal is to give points to bad candidates who won't win

Greedy algorithm for UCM for Borda

- We want to promote p
- Each manipulator puts p on top
- Problem – we need to give points to other candidates..
 - Set the manipulators one by one
 - At each manipulator be greedy
- Thm [\[ZPR AIJ-09\]](#): If exists a manipulation with $k-1$ manipulators this will succeed with k manipulators

Application: Reducing Energy Consumption



How to Choose a Meeting Room?



a1



a2



a4



a3



The Voting Process



$a_3 > a_4 > a_1 > a_2$



$a_4 > a_2 > a_1 > a_3$



$a_2 > a_3 > a_1 > a_4$



$a_1 > a_2 > a_3 > a_4$

The Voting Process



$a_3 > a_4 > a_1 > a_2$



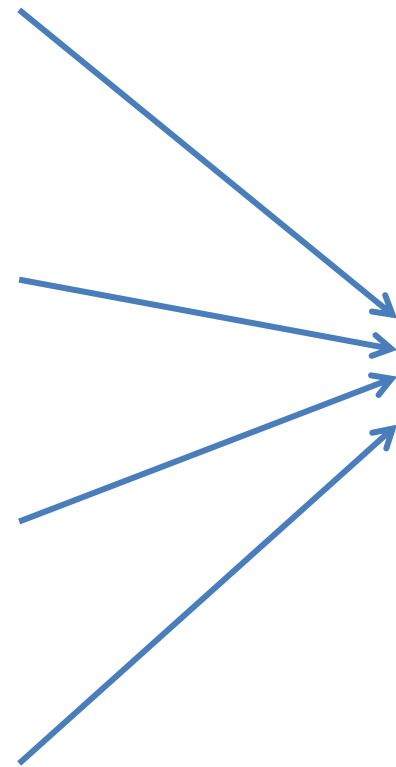
$a_4 > a_2 > a_1 > a_3$



$a_2 > a_3 > a_1 > a_4$



$a_1 > a_2 > a_3 > a_4$



$a_1 > a_2$

The Voting Process



$a_3 > a_4 > a_1 > a_2$



$a_4 > a_2 > a_1 > a_3$



$a_2 > a_3 > a_1 > a_4$



$a_1 > a_2 > a_3 > a_4$

$a_3 > a_1 > a_4 > a_2$

?



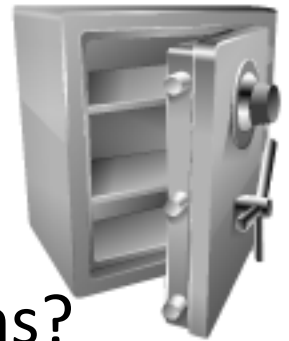
$a_1 > a_2$

The Persuasion Problems

- Given:
 - A set of alternatives
 - A set of voters with their preferences
 - A preferences list of the sender
- Is there a “good” set of suggestions?
- K-Persuasion: send at most k suggestions

Add Safety Requirement

- What if not all the voters accept the suggestions?
- Safe-Persuasion
 - Is there a “good” and safe set of suggestions?
- K-Safe-persuasion: send at most k suggestions



Persuasion \neq Manipulation

- In coalitional manipulation
 - The manipulators always obey their suggestions
 - There is no requirement that they will benefit from it
 - How the manipulators attain full knowledge?
- In persuasion
 - Voters can accept or decline the sender's suggestions
 - Send suggestion only to voters that will benefit from it, and we add safety requirement
 - The sender is the election organizer

Complexity Results [HLK IJCAI-13]

	Persuasion	K-Persuasion	Safe-Persuasion	K-Safe-Persuasion
Plurality	P	P	P	P
Veto	P	P	P	P
K-Approval	P	NP-complete	NP-hard	NP-hard
Bucklin	P	NP-complete	NP-hard	NP-hard
Borda	NP-complete	NP-complete	NP-hard	NP-hard