

# Probabilistic Methods in Social Choice

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Voters    Rankings

1

*a b c d*

2

*b a d c*

3

*b d a c*

4

*d c a b*

Aggregation Method

Winner

Winning set

Defeat Relation

Committee

Voters    Rankings

1	$a \ b \ c \ d$
2	$b \ a \ d \ c$
3	$b \ d \ a \ c$
4	$d \ c \ a \ b$



Winner  
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Aggregation Method

Winner

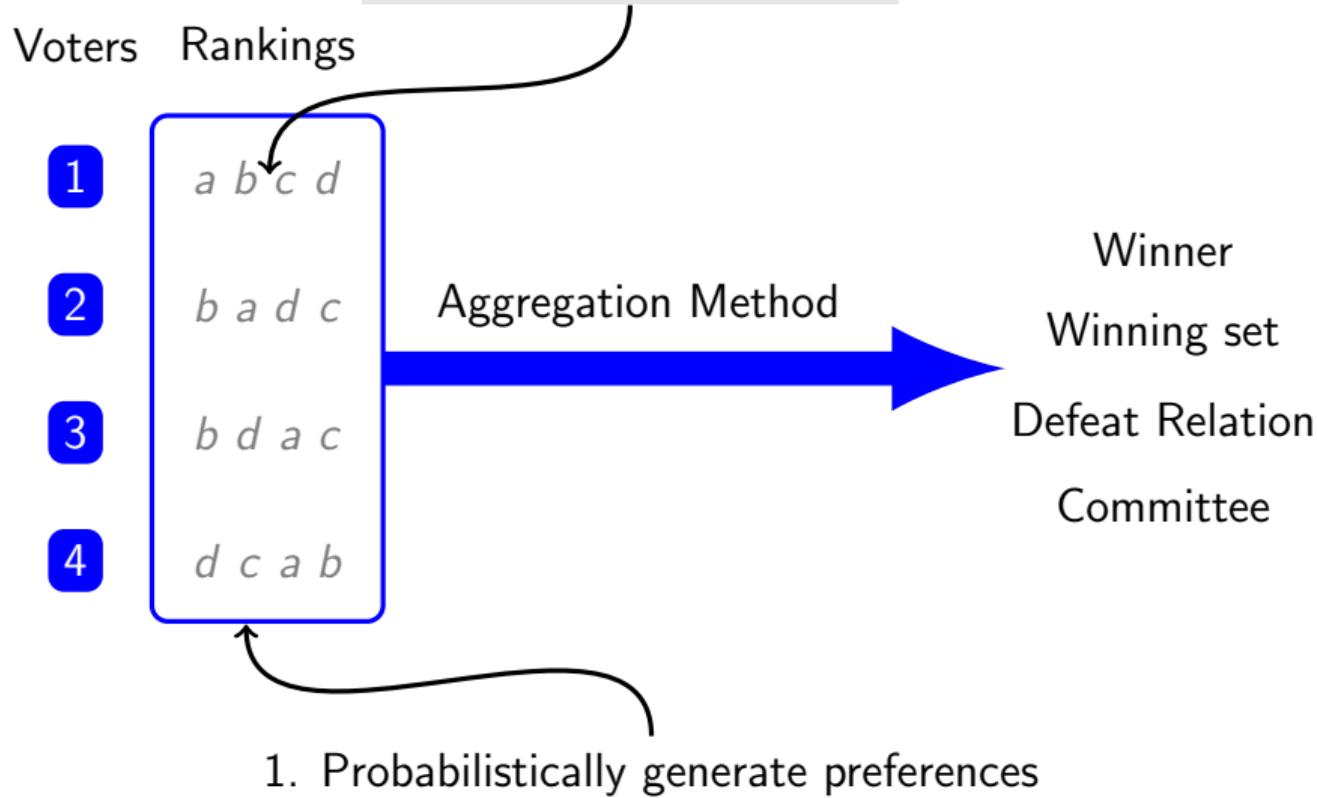
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1. Probabilistically generate preferences

## 2. Probability judgements



## 2. Probability judgements

Voters      Rankings

1

a b c d

2

b a d c

3

b d a c

4

d c a b

Aggregation Method

## 3. Lottery over candidates

Winner

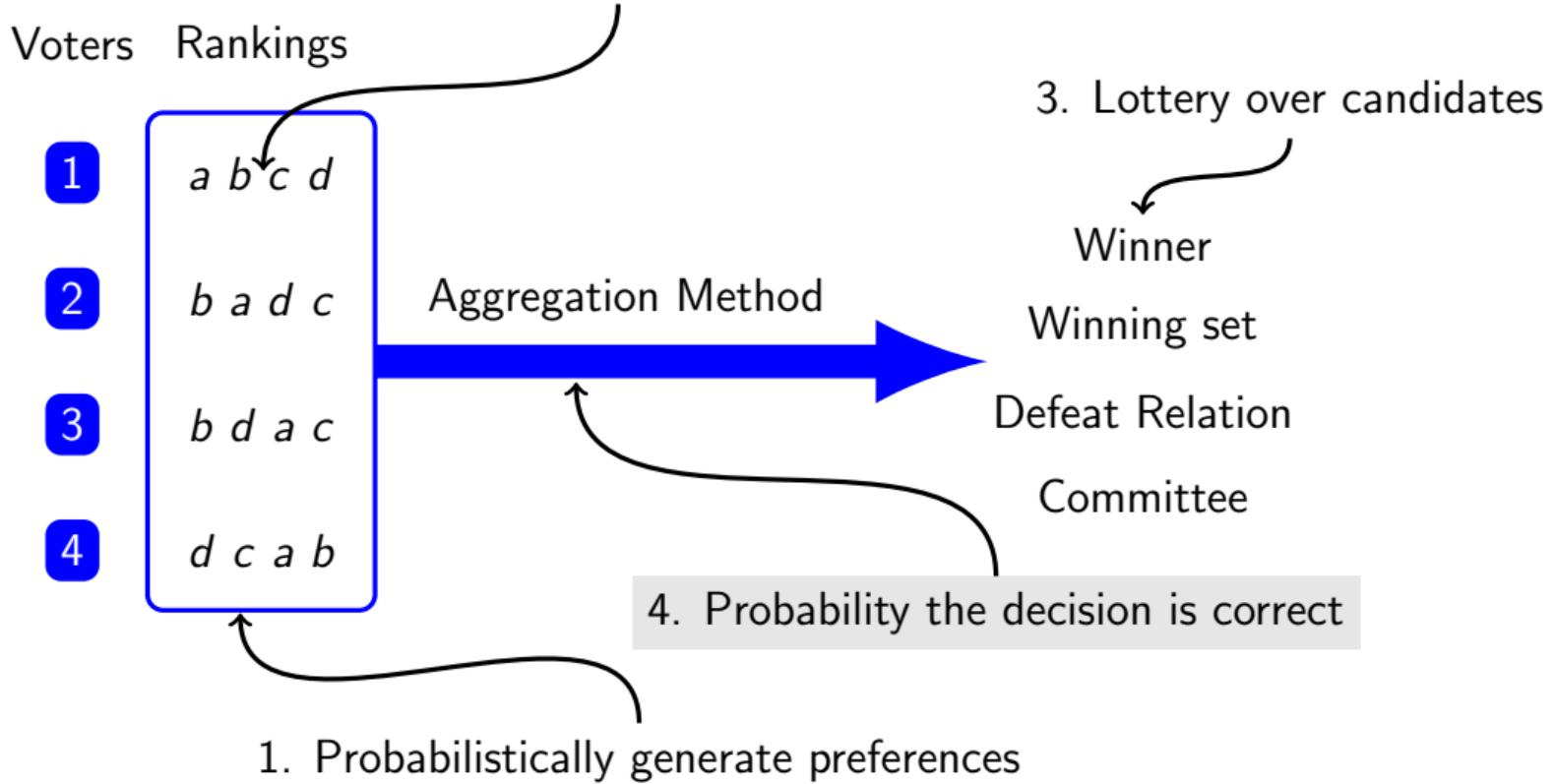
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## 1. Probabilistically generate preferences

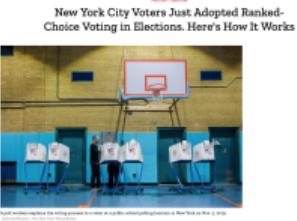
## 2. Probability judgements



# Plan

- ▶ Background on voting theory
- ▶ Generating preference profiles
- ▶ Quantitative analysis of voting methods
- ▶ Probabilistic voting methods
- ▶ Condorcet jury theorem and related results
- ▶ Aggregating probabilistic judgements

# Voting



New York City Voters Just Adopted Ranked-Choice Voting in Elections. Here's How It Works



The Rules of the Game: A New Electoral System  
Eric Shanteau and Savage Fox



Ranked-Choice Voting Gets A Prime-Time Shot Under New York City's Bright Lights



Opinion  
A Better Electoral System in Maine

**The New York Times**

Opinion

### How Majority Rule Might Have Stopped Donald Trump

By Eric Schmid

September 18, 2018

Editorial note: This column reflects the author's opinions. The New York Times' editorial board has determined that this column does not represent the views of the newspaper.

Majority rule is a simple concept. If more than half of voters support a candidate or measure, that person or that measure should win. Yet that's not always what happens. Take the 2016 election, for example. Donald Trump won the electoral college, but he lost the popular vote by nearly 3 million votes. That's because the electoral college system is weighted heavily in favor of rural areas, where voters tend to be older and more conservative. In contrast, urban areas tend to be more liberal and have a higher voter turnout. This is why Trump won even though he lost the popular vote. In fact, he lost the popular vote by nearly 3 million votes, yet still managed to win the electoral college by nearly 3 million votes. This is a clear example of how majority rule can fail.

Majority rule is also important in other contexts. For example, it's used in many countries to determine who wins elections. In the United States, however, it's not always used. For example, in the 2016 presidential election, Donald Trump won the electoral college but lost the popular vote. This is because the electoral college system is weighted heavily in favor of rural areas, where voters tend to be older and more conservative. In contrast, urban areas tend to be more liberal and have a higher voter turnout. This is why Trump won even though he lost the popular vote. In fact, he lost the popular vote by nearly 3 million votes, yet still managed to win the electoral college by nearly 3 million votes. This is a clear example of how majority rule can fail.

**SCIENTIFIC AMERICAN**

Opinion

### Ranking Candidates Is More Accurate Than Voting

By Mark C. Jackson

September 18, 2018

Editor's note: This story was originally posted in the March/April issue, and has been expanded to highlight the changing history of ranked-choice voting in America.

Most Americans and friends online - indeed, most of the world - believe that the electoral college is a better way to elect presidents than the popular vote. That perception is usually left to political and electoral analysts. But in the past few years, a large segment of the American population has found themselves surprised. People in Pennsylvania, for example, will consider the results of the election made to the final tally.

**Politico**

Opinion

### Why Some N.Y.C. Lawmakers Want to Rethink Ranked-Choice Voting

By Mark Mazzetti

September 18, 2018

The new system was approved by voters in 2016, but critics, including at least one top-ranking candidate, fear it may distort race outcomes in coming years.

**Politico**

Opinion

### New York's 'head-swirling' mistake puts harsh spotlight on ranked-choice voting

By Mark Mazzetti

September 18, 2018

This year without a winner in the gubernatorial primary has ranked-choice backers desperate to minimize their momentum.

<https://www.electology.org>

<http://www.fairvote.org>

# Rankings

Let  $X$  be a set of candidates and  $V$  a set of voters.

A **ranking** of  $X$  is a strict linear order  $P$  on  $X$ : a relation  $P \subseteq X \times X$  satisfying the following conditions for all  $x, y, z \in X$ :

*asymmetry*: if  $x P y$  then *not*  $y P x$ ;

*transitivity*: if  $x P y$  and  $y P z$ , then  $x P z$ ;

*weak completeness*: if  $x \neq y$ , then  $x P y$  or  $y P x$ .

Let  $\mathcal{L}(X)$  be the set of all strict linear orders on  $X$ .

# Rankings

MAYOR 市長	1	2	3	4	5	6
	1st Choice 第一選擇	2nd Choice 第二選擇	3rd Choice 第三選擇	4th Choice 第四選擇	5th Choice 第五選擇	6th Choice 第六選擇
ELLEN LEE ZHOU / 李愛晨 Behavioral Health Clinician 行為健康臨床治療師	1	2	3	4	5	6
LONDON N. BREED / 倫敦·布里德 Mayor of San Francisco 三藩市市長	1	2	3	4	5	6
JOEL VENTRESCA / 茱爾·范崔斯卡 Retired Airport Analyst 退休機場分析師	1	2	3	4	5	6
WILMA PANG / 彭德慧 Retired Music Professor 退休音樂教授	1	2	3	4	5	6
ROBERT L. JORDAN, JR. / 小羅伯特·L·喬丹 Preacher 傳教士	1	2	3	4	5	6
PAUL YBARRA ROBERTSON / 保羅·伊巴拉·羅伯森 Small Business Owner 小企業業主	1	2	3	4	5	6
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## Variable candidate/voter profiles

Fix infinite sets  $\mathcal{V}$  and  $\mathcal{X}$  of *voters* and *candidates*, respectively.

For  $X \subseteq \mathcal{X}$ , let  $\mathcal{L}(X)$  be the set of all strict linear orders on  $X$ .

A *profile* is a function  $P : V(P) \rightarrow \mathcal{L}(X(P))$  for some nonempty finite  $V(P) \subseteq \mathcal{V}$  and nonempty finite  $X(P) \subseteq \mathcal{X}$ .

We call  $V(P)$  and  $X(P)$  the sets of *voters in  $P$*  and *candidates in  $P$* , respectively.

We call  $P(i)$  voter  $i$ 's *ranking*, and we write ' $xP_iy$ ' for  $(x, y) \in P(i)$ . As usual, we take  $xP_iy$  to mean that voter  $i$  strictly prefers candidate  $x$  to candidate  $y$ .

## Anonymous profiles

40	35	25
$t$	$r$	$k$
$k$	$k$	$r$
$r$	$t$	$t$

## Margin

Let  $P$  be a profile and  $a, b \in X(P)$ . Then the **margin of  $a$  over  $b$**  is:

$$\text{Margin}_P(a, b) = |\{i \in V(P) \mid a P_i b\}| - |\{i \in V(P) \mid b P_i a\}|.$$

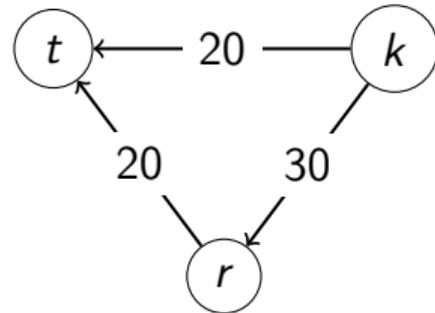
We say that  $a$  is **majority preferred** to  $b$  in  $P$  when  $\text{Margin}_P(a, b) > 0$ .

# Margin Graph

The **margin graph of  $P$** ,  $\mathcal{M}(P)$ , is the weighted directed graph whose set of nodes is  $X(P)$  with an edge from  $a$  to  $b$  weighted by  $\text{Margin}(a, b)$  when  $\text{Margin}(a, b) > 0$ . We write

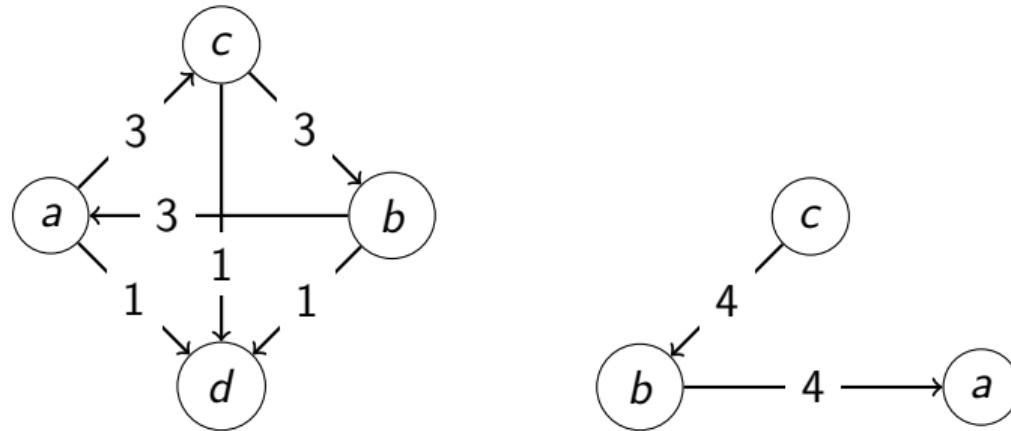
$$a \xrightarrow{\alpha} P b \text{ if } \alpha = \text{Margin}_P(a, b) > 0.$$

40	35	25
<hr/>		
$t$	$r$	$k$
$k$	$k$	$r$
$r$	$t$	$t$



# Margin Graph

A **margin graph** is a weighted directed graph  $\mathcal{M}$  where all the weights have the same parity.



Theorem (Debord, 1987)

For any margin graph  $\mathcal{M}$ , there is a profile  $P$  such that  $\mathcal{M}$  is the margin graph of  $P$ .

A **voting method** is a function  $F$  on the domain of all profiles such that for any profile  $P$ ,  $\emptyset \neq F(P) \subseteq X(P)$  (also called a **variable social choice correspondence** VSCC).

A **variable-election collective choice rule** (VCCR) is a function  $f$  on the domain of all profiles such that for any profile  $P$ ,  $f(P)$  is an asymmetric binary relation on  $X(P)$ , which we call *the defeat relation for P under f*.

For  $x, y \in X(P)$ , we say that  $x$  *defeats*  $y$  in  $P$  according to  $f$  when  $(x, y) \in f(P)$ .

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## Example

In the 2000 U.S. presidential election in Florida, George W. Bush defeated Al Gore and Ralph Nader according to Plurality voting, which only allows voters to vote for one candidate. Yet assuming that most Nader voters preferred Gore to Bush, it follows that a majority of all voters preferred Gore to Bush.

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Under Plurality, Nader spoiled the election for Gore, handing victory to Bush.

## Anonymity and Neutrality

**Anonymity:** if  $x$  defeats  $y$  in  $P$ , and  $P'$  is obtained from  $P$  by swapping the ballots assigned to two voters, then  $x$  still defeats  $y$  in  $P'$ .

**Neutrality:** if  $x$  defeats  $y$  in  $P$ , and  $P'$  is obtained from  $P$  by swapping  $x$  and  $y$  on each voter's ballot, then  $y$  defeats  $x$  in  $P'$ .

**Availability:** for all profiles  $P$ , there is some undefeated candidate.

## Monotonicity

**Monotonicity (resp. Monotonicity for two-candidate profiles):** if  $x$  defeats  $y$  in a profile (resp. two-candidate profile)  $P$ , and  $P'$  is obtained from  $P$  by some voter  $i$  moving  $x$  above the candidate that  $i$  ranked immediately above  $x$  in  $P$ , then  $x$  defeats  $y$  in  $P'$ .

## Lemma

If  $f$  satisfies Anonymity, Neutrality, and Monotonicity with respect to two-candidate profiles, then  $f$  satisfies Special Majority Defeat: for any two-candidate profile  $P$ ,  $x$  defeats  $y$  in  $P$  according to  $f$  only if  $x$  is majority preferred to  $y$ .

Other rules satisfying Anonymity, Neutrality and Monotonicity: The completely indecisive method; Unanimity; Quota rules (cf. Fishburn 1974, Section 1)

**Neutral Reversal:** if  $P'$  is obtained from  $P$  by adding two voters with reversed ballots, then  $x$  defeats  $y$  in  $P$  if and only if  $x$  defeats  $y$  in  $P'$ .

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**Pareto:** if for all profiles  $P$  and  $x, y \in X(P)$ , if  $xP_iy$  for all  $i \in V(P)$ , then  $x$  defeats  $y$  in  $P$ .

# Characterizing Majority Rule

## Proposition

*For any VCCR  $f$ , the following are equivalent:*

1.  *$f$  coincides with majority rule on two-candidate profiles;*
2.  *$f$  satisfies the following axioms with respect to two-candidate profiles:  
Anonymity, Neutrality, Monotonicity, Pareto, and Upward Neutral Reversal.*

# Characterizing Majority Rule

K. May. *A Set of Independent Necessary and Sufficient Conditions for Simple Majority Decision.* Econometrica, Vol. 20 (1952).

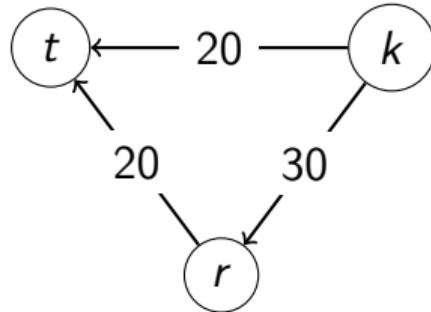
G. Asan and R. Sanver. *Another Characterization of the Majority Rule.* Economics Letters, 75 (3), 409-413, 2002.

E. Maskin. *Majority rule, social welfare functions and game forms.* in *Choice, Welfare and Development*, The Clarendon Press, pgs. 100 - 109, 1995.

G. Woeginger. *A new characterization of the majority rule.* Economic Letters, 81, pgs. 89 - 94, 2003.

## More than 2 candidates...

40	35	25
$t$	$r$	$k$
$k$	$k$	$r$
$r$	$t$	$t$



Plurality winner	$t$
Instant Runoff winner	$r$
Borda winner	$k$
Condorcet winner	$k$
Condorcet loser	$t$

## Positional scoring rules

A *scoring vector* is a vector  $\langle s_1, \dots, s_n \rangle$  of numbers such that for each  $m \in \{1, \dots, n - 1\}$ ,  $s_m \geq s_{m+1}$ .

Given a profile  $P$  with  $|X(P)| = n$ ,  $x \in X(P)$ , a scoring vector  $\vec{s}$  of length  $n$ , and  $i \in V(P)$ , define  $score_{\vec{s}}(x, P_i) = s_r$  where  $r = Rank(x, P_i)$ .

Let  $score_{\vec{s}}(x, P) = \sum_{i \in V(P)} score_{\vec{s}}(x, P_i)$ . A voting method  $F$  is a **positional scoring rule** if there is a map  $\mathcal{S}$  assigning to each natural number  $n$  a scoring vector of length  $n$  such that for any profile  $P$  with  $|X(P)| = n$ ,

$$F(P) = \operatorname{argmax}_{x \in X(P)} score_{\mathcal{S}(n)}(x, P).$$

## Examples

Borda:  $\mathcal{S}(n) = \langle n - 1, n - 2, \dots, 1, 0 \rangle$

Plurality:  $\mathcal{S}(n) = \langle 1, 0, \dots, 0 \rangle$

Anti-Plurality:  $\mathcal{S}(n) = \langle 1, 1, \dots, 1, 0 \rangle$

1	3	2	4
$a$	$b$	$b$	$c$
$c$	$a$	$c$	$a$
$b$	$c$	$a$	$b$

Borda winner  $c$

Plurality winner  $b$

Anti-Plurality winner  $a$

## Plurality vs. Borda

1	1
<hr/>	
a	c
b	b
c	a

Plurality winners:  $a, b$

Borda winners:  $a, b, c$

## Iterative procedures: Instant Runoff

- ▶ If some alternative is ranked first by an absolute majority of voters, then it is declared the winner.
- ▶ Otherwise, the alternative ranked first by the fewest voters (the plurality loser) is eliminated.
- ▶ Votes for eliminated alternatives get transferred: delete the removed alternatives from the ballots and “shift” the rankings (e.g., if 1st place alternative is removed, then your 2nd place alternative becomes 1st).

Also known as Ranked-Choice, STV, Hare

How should you deal with ties? (e.g., multiple alternatives are plurality losers)

Non-neutral tiebreaking: Fix a linear ordering of the candidates

Remove all: Remove all candidates tied for the smallest plurality score

Parallel universe tiebreaking: A candidate  $a$  wins if  $a$  wins according to some linear ordering of the candidates

1	3	2	1	1
<hr/>				
c	c	b	a	a
a	b	a	c	b
b	a	c	b	c

Instant Runoff:  $\{c\}$

Instant Runoff PUT:  $\{a, c\}$

S. Obraztsova, E. Elkind and N. Hazon. *Ties Matter: Complexity of Voting Manipulation Revisited*. Proceedings of the Twenty-Second International Joint Conference on Artificial Intelligence.

J. Wang, S. Sikdar, T. Shepherd, Z. Zhao, C. Jiang and L. Xia. *Practical Algorithms for Multi-Stage Voting Rules with Parallel Universes Tiebreaking*. Proceedings of AAAI, 2019.

## Iterative procedures

Variants:

- ▶ Plurality with runoff: remove all candidates except top two plurality score;
- ▶ Coombs: remove candidates with most last place votes;
- ▶ Baldwin: remove candidate with smallest Borda score;
- ▶ Nanson: remove candidates with below average Borda score

## Example

1	1	1	1	1
<hr/>	<hr/>	<hr/>	<hr/>	<hr/>
c	b	a	b	d
a	d	b	c	a
d	a	c	d	b
b	c	d	a	c

Instant Runoff  $\{b\}$

Plurality with Runoff  $\{a, b\}$

Coombs  $\{d\}$

Baldwin  $\{a, b, d\}$

Strict Nanson  $\{a\}$