## Preferences and Manipulative Actions in Elections

Gábor Erdélyi



University of Siegen School of Economic Disciplines

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## Where is Siegen?!



## Preferences and Manipulative Actions in Elections



## Outline

- 1 Introduction to COMSOC
- **2** Voting Theory
- 3 Manipulation

#### 4 Bribery

- 5 Control
- 6 Domain Restrictions

Introduction to COMSOC

Voting Theory

Manipulative Actions in Elections

**Domain Restrictions** 

Incomplete Preferences

## Computational Social Choice (COMSOC)

• Young, interdisciplinary area:

- social choice theory,
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# Computational Social Choice (COMSOC)

Young, interdisciplinary area:

- social choice theory,
- computer science.
- Research groups in:
  - law,
  - economics,
  - discrete mathematics,
  - decision theory,
  - theoretical computer science, and
  - artificial intelligence.

## Merits of COMSOC

Contributes to both social choice and computer science by mutually transfering concepts between them.

- $\blacksquare$  SOC  $\rightarrow$  CS: Preference aggregation and collective decision making, e.g.,
  - Multi-agent planning,
  - Recommender systems,
- $\blacksquare$  CS  $\rightarrow$  SOC: Efficient algorithms, complexity of problems related to voting.

## Main COMSOC Areas

- Voting theory
- Preference aggregation
- Resource allocation and fair division
- Coalition formation
- Judgment aggregation and belief merging

## Where do we need preferences?

- Websearch,
- finding the best solution,
- finding best appointments,
- political elections,
- system configurations,
- multiagent planning,
- and many more...





## Preferences can be very complex



### Where should we go for lunch?

- Good mexican fast food place two bus stops away.
- Nice pizza for take-out one bus stop away.
- Sandwich in the fridge from yesterday, no loss of time.
- Juicy steak in the steakhouse around the corner, 5 min. walk.

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- Nice pizza for take-out one bus stop away.
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What is the best decision?

We have to consider: food, ambiance, distance, time, fare.

 $\rightarrow$  Preferences can be very complex!

## Voting Today

- Preference aggregation and collective decision-making.
- Political science, economics, social choice theory, and operations research.
- In computer science:
  - artificial intelligence (multiagent systems),
  - planning,
  - similarity search, and
  - design of ranking algorithms.

## Elections

- Set of candidates and multiset of voters:
  - $C = \{c_1, \ldots, c_m\},$
  - $\bullet V = \{v_1,\ldots,v_n\}.$
- Voter preferences over *C* can be represented as
  - preference lists (rankings),
  - approval/disapproval vectors,
  - CP-Nets (see, e.g., [Boutilier et al., 2004]).

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# Example Candidates: $C = \{$ Since, BIGNM, THE IT CROUD $\}$ Voters: $V = \{$ $\stackrel{\circ}{\leftrightarrow}, \stackrel{\circ}{\bullet}, \stackrel{\circ}{\bullet},$

## Voting Rules



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- ... how can we come to a result?

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- A voting rule aggregates the preferences and outputs the set of winners:
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- ... how can we come to a result?
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- A voting rule aggregates the preferences and outputs the set of winners:
  - unique-winner model,
  - nonunique-winner model.
- What kind of voting rules exist?

# Plurality

Borda

# Plurality

## Veto

Borda



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Preferences and Manipulative Actions in Elections

# Condorcet Plurality

Bucklin

**STV** 

## Veto

Borda

Black

# Copeland

## Maximin

k-Approval

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Preferences and Manipulative Actions in Elections



## Scoring Rules

Given

• an election E = (C, V) with |C| = m and

• a scoring vector 
$$lpha = (lpha_1, \dots, lpha_m)$$

such that

• 
$$\alpha_j \in \mathbb{N}$$
 for  $1 \leq j \leq m$ ,

• 
$$\alpha_1 \geq \alpha_2 \geq \cdots \geq \alpha_m$$
 and

$$\bullet \alpha_1 > \alpha_m.$$

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Score: For  $c \in C$  let  $score(c) = \sum_{i=1}^{n} \alpha_i$ , such that  $pos(c, \succ_i) = j$ Winner:  $w \in C$ , such that  $score(w) = \max_{c' \in C} score(c')$ 

Plurality:  $\alpha = (1, 0, ..., 0)$ 

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#### Winner: THE IT CROWD

Borda: 
$$\alpha = (m - 1, m - 2, ..., 0)$$

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#### Example



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# 

#### Winner?









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## Properties





## Manipulative Actions in Elections



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- Manipulation: An evil coalition of voters strategically change their votes.
- **Bribery**: An external agent bribes a group of voters.
- **Control:** The Chair modifies the election's structure.



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First papers on manipulation [Bartholdi et al., 1989], bribery [Faliszewski et al., 2006, Faliszewski et al., 2009] and control [Bartholdi et al., 1992]. For an overview we refer to the textbooks [Rothe, 2015, Brandt et al., 2016].





	Supering.	BIGBANG	THE IT CROWD	JAWS
2	3	2	0	1
Å	0	1	3	2
Ť	2	0	3	1
*	0	1	2	3
Σ	5	4	8	7



	Simpsons.	BIGBANG	THE IT CROWD	JAWS
	3	2	0	1
Å	0	1	3	2
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	Supposed.	BIGBANG	THE IT CROWD	JAWS
2	3	2	0	1
Å	0	1	3	2
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*	1	2	0	3
Σ	6	5	6	7

## Gibbard-Satterthwaite Theorem



#### Theorem (Gibbard 1973, Satterthwaite 1975)

Every strategy-proof voting system for three or more candidates must be dictatorial.

## Complexity as Protection

- Immune (I): Manipulative action is impossible.
- Susceptible (S): Not immune.
- Vulnerable (V): S + the corresponding problem is solvable in polynomial time.
- Resistant (R): S + corresponding problem is computationally hard (i.e., NP-hard.)

# Complexity as Protection



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Worst-case complexity!

# First Results Regarding Manipulation



#### Theorem (Bartholdi, Tovey, and Trick 1989)

#### Single manipulation in

- Copeland<sup>α</sup>,
- Maximin, and
- all scoring rules

is solvable in polynomial-time.

## Manipulation under STV



### Theorem (Bartholdi and Orlin 1991) STV-MANIPULATION *is* NP-*hard*.

Bribery



#### $\mathcal{E}$ -Bribery

Instance: Election E = (C, V), a nonnegative integer k, and a distinguished candidate  $c \in C$ . Question: Is it possible to change at most k voters' votes such that c

is a winner of the resulting election under voting rule  $\mathcal{E}$ ?

## Versions of Bribery



- *E*-Bribery
- $\mathcal{E}$ -\$BRIBERY: Voters have distinct prices, k is the limit.
- *E*-WEIGHTED-BRIBERY: Voters have weights.
- *E*-WEIGHTED-\$BRIBERY: Both weights and prices.
- $\mathcal{E}$ -MICROBRIBERY: Each flip costs, k is the limit.

## **Electoral Control**

#### Basic Idea

The Chair seeks to influence the outcome of the election by changing the structure of it.

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#### Basic Idea

The Chair seeks to influence the outcome of the election by changing the structure of it.

- Adding candidates (candidate recruitment),
- deleting candidates (forcing candidates out of race),
- partition of candidates without run-off (qualifying round for some candidates),
- partition of candidates with run-off (two groups of candidates, each voter votes on both groups separately),
- adding voters (get-out-the-vote drives),
- deleting voters (forcing voters out of the election), and
- partition of voters (two-district gerrymandering).



#### Contrast

Number of resistances, immunities, and vulnerabilities to the 22 common control types.

Number of	Copeland	Plurality	SP-AV	Bucklin	NRV	FV
resistances	15	16	19	≥ 19	20	20
immunities	0	0	0	0	0	0
vulnerabilities	7	6	3	≤ 3	2	2
References	[FHHR07]	[BTT92,HHR07]	[ENR09]	[EFRS15]	[Men13]	[EFRS15]

## Is Our Model Right?

- full vs. partial information
- domain restrictions
  - single-peaked profiles
  - single-caved profiles
  - single-crossing profiles
  - top monotonicity
  - nearly single-peaked profiles

## **Domain Restrictions**

#### Idea

Until now: Each admissible vote allowed

What if the diversity of votes is limited and the resulting profile offers some structure?

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#### Advantages

- Better properties on restricted domains.
- Unnatural cases not present.
- Structure can help designing better algorithms.

# Single-Peakedness

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# Single-Peakedness



# Single-peaked elections

### Definition (Single-peakedness [Black, 1948])

Let an *axis* A be a total order on C denoted by >. Furthermore, let  $\succ$  be a vote with top-ranked candidate c. The vote  $\succ$  is *single-peaked with* respect to A if for any  $x, y \in C$ , if x > y > c or c > y > x then  $c \succ y \succ x$  has to hold.

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A preference profile  $\mathcal{P}$  is *single-peaked with respect to an axis* A if each vote is single-peaked with respect to A. A preference profile  $\mathcal{P}$  is said to be *single-peaked consistent* if there exists an axis A such that  $\mathcal{P}$  is single-peaked with respect to A.

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Can be decided (in  $O(|C| \cdot |V|)$ , vgl. [Escoffier et al., 2008]) Properties (amongst others):

The Gibbard-Satterthwaite Theorem does not hold (see. [Moulin, 1980])

• Complexity often decreases (NP  $\rightarrow$  P)

Problem: Single-peakedness is not robust!



100 votes



100 votes



100 votes



100 votes



100 votes



100 votes





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 Solution: There are robust versions of single-peakedness. However, complexity increases for single-peaked consistency. (See, e.g., [Faliszewski et al., 2014, Erdélyi et al., 2013, Bredereck et al., 2016])

# Nearly single-peaked profiles

Define distance to single-peaked profiles.

## Nearly single-peaked profiles

Define distance to single-peaked profiles.

- 1 k-Maverick Single-Peaked
- 2 k-Additional Axes Single-Peaked
- 3 k-Candidate Deletion Single-Peaked
- 4 k-Local Candidate Deletion Single-Peaked
- 5 k-Global Swaps Single-Peaked
- 6 k-Local Swaps Single-Peaked
- 7 k-Candidate Partition Single-Peaked

1. and 6. introduced by Faliszewski, Hemaspaandra, and Hemaspaandra [FHH11]

2. and 3. suggested by Escoffier, Lang, Öztürk [ELÖ08]

# Complexity of Nearly Single-Peaked Consistency [ELP13]

<i>k</i> -Maverick	NP-c
k-Additional Axes	NP-c
k-Local Candidate Deletion	NP-c
<i>k</i> -Local Swaps	NP-c
<i>k</i> -Global Swaps	NP-c
k-Candidate Deletion	$\mathcal{O}( V  \cdot  C ^5)$
k-Candidate Partition	?

# Complexity of Veto-ℓ-X-CCWM [ELP15]

X	in P	NP-complete		
Voter Deletion	$\ell \leq m-3$	$\ell > m - 3$		
Candidate Deletion	$\ell \leq m-3$	$\ell > m - 3$		
Local Candidate Del.	$\ell=0$	$\ell \geq 1$		
Global Swaps	$m = 2k: \ \ell \le k^2 - k - 1$ $m = 2k - 1: \ \ell \le k^2 - 2k$	$\ell > k^2 - k - 1$ $\ell > k^2 - 2k$		
Local Swaps	$\ell < \lfloor \frac{m-1}{2} \rfloor$	$\ell \geq \lfloor \frac{m-1}{2} \rfloor$		
Candidate Partition	$\ell < \frac{\tilde{m}}{2}$	$\ell \geq \frac{\overline{m}}{2}$		
Additional Axes	$\ell < \frac{m}{2} - 1$	$\ell \geq \frac{m}{2} - 1$		

# Incomplete Preferences [BER16]



# Bribery Under Incomplete Preferences [BER16]

Voting rule	FI	GAPS	FP	TOS	PC	CEV	1TOS	1GAP	TTO	BTO
Plurality	P	NPC	NPC	NPC	NPC	Р	Р	NPC	Р	NPC
2-Approval	P	NPC	NPC	NPC	NPC	Р	Р	NPC	Р	NPC
(≥ 3)-Approval	NPC	NPC	NPC	NPC	NPC	NPC	NPC	NPC	NPC	NPC
Veto	P	P	Р	Р	Р	P	Р	Р	P	Р
(≥ 4)-Veto	NPC	NPC	NPC	NPC	NPC	NPC	NPC	NPC	NPC	NPC

# Dealing with $\operatorname{NP-Hardness}$

Worst-case complexity vs.

- approximation algorithms
- algorithms that are always efficient although not always correct
- algorithms that are always correct, but not always efficient
- average-case complexity
- parameterized complexity

# Conclusion



#### Some important points

- Elections have many real-world applications.
- Preferences and voting rules.
- Most voting rules susceptible to manipulative actions.
- Can computational complexity provide a shield?
- Natural restrictions.

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