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# Computing Spanning Trees in a Social Choice Context

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# Introduction

Combine Social Choice Theory with Discrete Optimization

- Given: individuals' preferences over edges of a graph
- Aim: Find a "socially best" spanning tree in the graph
- Applications:
  - oil pipeline construction
  - water network construction in a village
- Group ranking of edges may or may not allocate numerical values to the edges

Main result:

- sets of best spanning trees for the discussed ranking rules coincide
- a best spanning tree for each considered ranking rule can be determined efficiently

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# Formal Framework

- Undirected Graph G = (V, E)
- $T \subseteq E$  is a spanning tree :  $\iff$  subgraph (V, T) of G is acyclic and connected
- $\tau$ ...set of spanning trees of G
- finite set of individuals  $I = \{1, 2, ..., k\}$ , linear orders  $P_i$  on E,  $1 \le i \le k$
- $\pi = (P_1, P_2, ..., P_k)$  is a (voter) preference profile
- Complete order ≿ on E: asymmetric part ≻ and symmetric part ~
- Complete order ⊵ on τ: asymmetric part ▷ and symmetric part ⋈

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# Definition

Let  $\succeq$  be a complete order on  $\tau$ .

 $T \in \tau$  is a best tree with respect to  $\supseteq :\iff \nexists T' \in \tau : T' \rhd T$ 

#### Examples

Let  $w(e) \in \mathbb{R}$  for all  $e \in E$ .

- Minimum Spanning Tree Problem is to determine a best tree with respect to the relation  $T_1 \supseteq T_2 :\iff \sum_{e \in T_1} w(e) \le \sum_{e \in T_2} w(e)$ .
- Maximum Spanning Tree Problem: find a best tree w.r.t. relation  $T_1 \ge T_2 :\iff \sum_{e \in T_1} w(e) \ge \sum_{e \in T_2} w(e).$

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# Basic orders on the edge-set

# Definitions

- Borda's method (see [BF02]): Individual *i*'s Borda count of edge *e* is given by  $B_i(e) := |\{f \in E : eP_if\}|$ . The total Borda count of edge *e* is defined by  $B(e) := \sum_{i \in I} B_i(e)$ . For  $e, f \in E$  we define the Borda-order on *E* by  $e \succeq_b f :\iff B(e) \ge B(f)$ .
- Simple Majority-order (see [BF02]): Let  $e, f \in E$ . Then we define the Simple Majority-order on E by  $e \succeq_{sm} f :\iff |\{i \in I : eP_if\}| \ge |\{i \in I : fP_ie\}|.$

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# Definitions

Let  $e, f \in E$ .

For all  $i \in I$ , partition edge-set E into a set  $S_i \subset E$  of edges individual i approves of and a set  $E \setminus S_i$  individual i disapproves of.

• Approval-order (see [BF83]):

The Approval count of e is defined by  $A(e) := |\{i \in I : e \in S_i\}|$ . The Approval-order  $\succeq_a$  is then defined by  $e \succeq_a f :\iff A(e) \ge A(f)$ .

For all  $i \in I$  the set  $S_i^t := \{e \in E | eP_i f \ \forall f \in E \setminus \{e\}\}$  represents individual *i*'s top choice

 Plurality-order (see [Rob91]): The Plurality count of e is Pl(e) := |{i ∈ I : e ∈ S<sub>i</sub><sup>t</sup>}|. The Plurality-order ≿<sub>pl</sub> is defined by e ≿<sub>pl</sub> f :⇔ Pl(e) ≥ Pl(f).

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- Borda-, Approval- and Plurality-order are weak orders on E (complete and transitive).
- Simple Majority-order is in general not transitive  $\Rightarrow$  preference cycles

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# Some complete orders on au

• Idea: Derive weak orders on au from weak orders on  $extsf{E}$ 

#### Definition

For  $T \in \tau$  we define the Borda count of T by  $B(T) := \sum_{e \in T} B(e)$ . Then the Borda-order  $\geq_B$  on  $\tau$  is defined by letting, for all  $T_1, T_2 \in \tau$ ,

$$T_1 \succeq_B T_2 : \iff B(T_1) \ge B(T_2)$$
.

• Analogously: Approval-order  $\geq_A$  on  $\tau$ , Plurality-order  $\geq_{Pl}$  on  $\tau$ .

General concept of a best tree w.r.t. orders, that are based on summing up numerical values of the edges:

# Definition

Let  $\tau$  be the set of spanning trees of G and let  $\succeq$  be a weak order on E. A tree  $M \in \tau$  is called *max-spanning tree* if and only if for every edge  $f = \{i, j\}, f \notin M$ ,

 $f\precsim e$ 

holds for all  $e \in M$  that are part of the unique simple path between i and j in M.

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# Remarks:

- Above definition generalizes the path optimality condition for the maximum spanning tree problem stated in [AMO93]
- A max-spanning tree can be determined efficiently by a greedy algorithm (e.g. Kruskal's algorithm)
- $\textcircled{\sc 0}$  Note that for above definition  $\succsim$  does not need to be based on numerical values
- Simple-Majority order does not fit in this concept

Alternative idea to rank two trees:

- Those edges that are simultaneously contained in both trees should not play a role. Thus, we simply remove those edges that both trees have in common.
- Rank trees  $T_1, T_2 \in \tau$  according to the sum of wins of edges of  $\tilde{T}_1$ against those of  $\tilde{T}_2$ , where  $\tilde{T}_1 := T_1 \setminus T_2$  and  $\tilde{T}_2 := T_2 \setminus T_1$

#### Definition

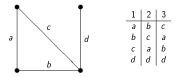
Let  $\succeq$  be a complete order on E. For  $e, f \in E$  let

$$s(e,f) := \begin{cases} 1 & \text{if } e \succ f \\ 0 & \text{if } e \sim f \\ -1 & \text{if } e \prec f \end{cases}$$

be the score of e versus f. For  $T_1, T_2 \in \tau$  we define

$$T_1 ext{ } \ge_S T_2 : \iff \sum_{a \in \tilde{T}_1} \sum_{b \in \tilde{T}_2} s(a, b) \ge 0 \; .$$

Introduction	Formal Framework	Some complete orders on $ au$	Comparing trees



# Example

3 spanning trees:  $T_1 := \{a, b, d\}$ ,  $T_2 := \{b, c, d\}$  and  $T_3 := \{a, c, d\}$ . Preference cycle  $a \succ_{sm} b \succ_{sm} c \succ_{sm} a$ . We get  $T_1 \setminus T_2 = \{a\}$  and  $T_2 \setminus T_1 = \{c\}$ ,  $T_1 \setminus T_3 = \{b\}$  and  $T_3 \setminus T_1 = \{c\}$ ,  $T_2 \setminus T_3 = \{b\}$  and  $T_3 \setminus T_2 = \{a\}$ . Thus we have  $T_3 \triangleright_S T_2 \triangleright_S T_1 \triangleright_S T_3$ . Hence a best tree with respect to  $\succeq_S$  does not exist in this example.

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#### Example

For the above graph the Simple Majority-order on  $E = \{a, b, c, d, e, f\}$  is of the following form:

a≻ <sub>sm</sub> b	$b \succ_{sm} d$	c ≻ <sub>sm</sub> a	$d \succ_{sm} e$	$f \succ_{sm} c$	edge	# of inf edges
a≻sm d	b≻sm e	c≻sm b	e≻sm c	f≻sm d	f	4
a≻sm e	b≻sm f	d≻sm c	f≻sm a	f≻sm e	a, b	3
					c, d	2
					е	1

 $\Rightarrow$  Kruskal's algorithm according to SM-wins outputs  $T_g = \{f, a, b, d, e\}$ .

The two other spanning trees are  $T_1 = \{b, c, d, e, f\}$  and  $T_2 = \{a, c, d, e, f\}$ .  $T_1 \setminus T_g = \{c\}$  and  $T_g \setminus T_1 = \{a\} \Rightarrow T_1 \triangleright_S T_g$ .  $T_2 \setminus T_g = \{c\}$  and  $T_g \setminus T_2 = \{b\} \Rightarrow T_2 \triangleright_S T_g$ . I.e. according to  $\geq_S$  every other spanning tree of the graph is strictly preferred to  $T_g$ .

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# Proposition

Let  $\succeq = \succeq_{sm}$ . Then the following statements hold:

- There exist a graph G = (V, E) and a voter preference profile on E such that a best tree with respect to  $\geq_S$  does not exist.
- O There exist a graph G = (V, E) and a voter preference profile on E such that a best tree with respect to ≥<sub>S</sub> exists but the generalized version of Kruskal's algorithm fails to determine such a best tree. In fact, the tree determined by the algorithm may even be the worst tree with respect to ≥<sub>S</sub>.

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# Comparing trees Three more complete orders on $\tau$

dea:

- Compare trees on basis of a given weak order  $\succeq$  on E.
- When comparing two trees, those edges that are simultaneously contained in both trees should not play a role.

Notation: Given  $T_1, T_2 \in \tau$ , we use the notation  $\tilde{T}_1 := T_1 \setminus T_2$ ,  $\tilde{T}_2 := T_2 \setminus T_1$  and  $r := |\tilde{T}_1|$ 

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# Three more complete orders on au

# Concept 1: Derived from the maxmin-order on sets presented in [BBP04]

# DefinitionLet $T_1, T_2 \in \tau$ . Then we define the maxmin-order $\geq_{m \times n}$ on $\tau$ by $T_1 \geq_{m \times n} T_2 \iff [\tilde{T}_1 = \emptyset \text{ or } \max \tilde{T}_1 \succ \max \tilde{T}_2 \text{ or } \max \tilde{T}_1 \succ \max \tilde{T}_2 \text{ or } \max \tilde{T}_1 \sim \max \tilde{T}_2 \text{ and } \min \tilde{T}_1 \succsim \min \tilde{T}_2)]$

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# Concept 2: Derived from the leximax order on sets presented in [BBP04]

### Definition

Let  $T_1, T_2 \in \tau$ . Let  $\tilde{T}_1 := \{e_1, e_2, ..., e_r\}, \tilde{T}_2 := \{f_1, f_2, ..., f_r\}$  such that  $e_i \succeq e_{i+1}$  and  $f_i \succeq f_{i+1}$  holds for  $1 \le i \le r-1$ . Then the leximax order  $\supseteq_{lex}$  on  $\tau$  is defined by  $T_1 \supseteq_{lex} T_2 :\iff [\tilde{T}_1 = \emptyset \text{ or } e_i \sim f_i \text{ for all } 1 \le i \le r \text{ or } (\exists j \in \{1, ..., r\} \text{ such that } e_i \sim f_i \text{ for all } i < j \text{ and } e_j \succ f_j)]$  Concept 3: Rank the edges of the disjoint union of  $T_1, T_2 \in \tau$  according to  $\succeq$ . For the resulting ranking use a positional scoring concept to compare the trees.

#### Definition

Let  $T_1, T_2 \in \tau$ . Let  $\tilde{T}_1 \cup \tilde{T}_2 := \{d_1, d_2, \dots, d_{2r}\}$  such that  $d_i \succeq d_{i+1}$  holds for  $1 \le i \le 2r - 1$ . Let  $b: E \to \mathbb{R}$  be strictly increasing according to  $\succeq$ , that is, for  $1 \le i \le 2r - 1$ .  $b(d_i) = b(d_{i+1})$  if  $d_i \sim d_{i+1}$  $b(d_i) > b(d_{i+1})$  if  $d_i \succ d_{i+1}$ Let  $b(\tilde{T}_1) := \sum_{e \in \tilde{T}_e} b(e)$  and  $b(\tilde{T}_2) := \sum_{f \in \tilde{T}_e} b(f)$ . Then we define  $T_1 \succeq_{ps} T_2 : \iff b(\tilde{T}_1) > b(\tilde{T}_2)$ .

**Remark.** This approach adapts the concept of the positional scoring procedures presented in [BF02]

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# Remarks.

- The orders  $\geq_{S}$ ,  $\geq_{lex}$ ,  $\geq_{m \times n}$  and  $\geq_{ps}$  are complete orders on  $\tau$ .
- In the above concepts the order ≿ on E does not need to be of numerical nature, i.e. ≿ does not have to allocate numbers to the edges.

Aim: Find a best tree w.r.t. the corresponding order

# Results on max-spanning trees and best trees

<u>Recall</u>:  $\gtrsim$  is assumed to be a given weak order on *E*, i.e.  $\gtrsim$  is complete and transitive

#### Theorem

A max-spanning tree can be computed in  $O(|E| + |V| \log |V|)$  time.

#### Proof.

Immediately follows from the fact that the maximum spanning tree problem can be solved in  $O(|E| + |V| \log |V|)$  time.

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# Main Theorem

### Theore<u>m</u>

Let  $M \in \tau$  and let  $\succeq$  be a weak order on E. Then the following statements are equivalent:

- M is a max-spanning tree
- $\exists B \in \tau : B \triangleright_{Iex} M$
- $\exists B \in \tau : B \rhd_S M$
- $\textcircled{3} \nexists B \in \tau : B \vartriangleright_{m \times n} M$
- $\ \, \textcircled{3} \ \, \nexists B \in \tau : B \vartriangleright_{ps} M$

# Corollary

Every positional scoring method that yields the same ranking  $\succeq$  on E yields the same set of best trees w.r.t.  $\succeq_{ps}$ , irrespective of the numerical values assigned to the edges.

# Consequences

Let  $\succeq$  be a weak order on E and let  $\supseteq \in \{ \supseteq_{lex}, \supseteq_S, \supseteq_{m \times n}, \supseteq_{ps} \}$ 

# Consequences of the Theorem:

- O A best tree with respect to ≥ always exists
- ② A best tree with respect to ⊵ can be determined efficiently
- **3** For the orders  $\geq_{lex}, \geq_S, \geq_{m \times n}, \geq_{ps}$ , the sets of best trees coincide

Concluding Remark: Results can be generalized to bases of matroids

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