

# Ranking Specific Sets of Objects

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# Lifting rankings from objects to sets

## Given

- A set  $S$
- A linear order  $<$  on  $S$
- A family  $\mathcal{X} \subseteq \mathcal{P}(S) \setminus \{\emptyset\}$  of nonempty subsets of  $S$

## The problem

Is there a “good” ranking  $\prec$  on  $\mathcal{X}$ ?

# An example - Basics

- $S = \{\text{strawberry, vanilla, chocolate, lemon}\}$
- Linear order: strawberry < chocolate < vanilla < lemon
- $\mathcal{X} = \{\{\text{strawberry}\}, \{\text{chocolate}\}, \{\text{strawberry, vanilla}\}, \{\text{strawberry, vanilla, lemon}\}, \{\text{strawberry, lemon}\}\}$

# The axiomatic approach

## What is a “good” ranking?

- The ranking should be based on the linear order  $<$
- The ranking should be transitive, either reflexive or irreflexive, ...
- “good” depends on the interpretation of  $\mathcal{X}$

## Possible interpretations

- Sets as final outcomes
- Opportunities
- Complete uncertainty
- etc. . .

# Axioms for ranking sets under complete uncertainty

## Extension Rule

For all  $x, y \in S$  if  $\{x\}, \{y\} \in \mathcal{X}$ , then

$$\{x\} \prec \{y\} \text{ iff } x < y$$

## Dominance

For all  $A \in \mathcal{X}$  and all  $x \in S$  if  $A \cup \{x\} \in \mathcal{X}$ , then

$$y < x \text{ for all } y \in A \text{ implies } A \prec A \cup \{x\}$$

$$x < y \text{ for all } y \in A \text{ implies } A \cup \{x\} \prec A$$

If  $\mathcal{X} = \mathcal{P}(S) \setminus \{\emptyset\}$  and  $\prec$  is transitive, the extension rule is implied by dominance.

# An example - extension rule and dominance

- $S = \{\text{strawberry, vanilla, chocolate, lemon}\}$
- Linear order: strawberry < chocolate < vanilla < lemon
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- **Extension rule:  $\{\text{strawberry}\} \prec \{\text{chocolate}\}$**

# An example - extension rule and dominance

- $S = \{\text{strawberry, vanilla, chocolate, lemon}\}$
- Linear order:  $\text{strawberry} < \text{chocolate} < \text{vanilla} < \text{lemon}$
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- Extension rule:  $\{\text{strawberry}\} \prec \{\text{chocolate}\}$
- Dominance:  
 $\{\text{strawberry}\} \prec \{\text{strawberry, vanilla}\} \prec \{\text{strawberry, vanilla, lemon}\}$   
 $\{\text{strawberry}\} \prec \{\text{strawberry, lemon}\}$



# Axioms for ranking sets under complete uncertainty

## Independence

For all  $A, B \in \mathcal{X}$  and for all  $x \in S \setminus (A \cup B)$  if  $A \cup \{x\}, B \cup \{x\} \in \mathcal{X}$ , then

$$A \prec B \text{ implies } A \cup \{x\} \preceq B \cup \{x\}$$

## Strict Independence

For all  $A, B \in \mathcal{X}$  and for all  $x \in S \setminus (A \cup B)$  if  $A \cup \{x\}, B \cup \{x\} \in \mathcal{X}$ , then

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# An example - all axioms

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- Linear order:  $\text{strawberry} < \text{chocolate} < \text{vanilla} < \text{lemon}$
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- Independence:  $\{\text{strawberry, lemon}\} \preceq \{\text{strawberry, vanilla, lemon}\}$
- Strict independence:  
 $\{\text{strawberry, lemon}\} \prec \{\text{strawberry, vanilla, lemon}\}$

# Classic impossibility results

## Kannai and Peleg (1984)

Assume  $\mathcal{X} = \mathcal{P}(S) \setminus \{\emptyset\}$  and  $|S| \geq 6$ , then there exists no order on  $\mathcal{X}$  satisfying dominance and independence.

## Barberà and Pattanaik (1984)

Assume  $\mathcal{X} = \mathcal{P}(S) \setminus \{\emptyset\}$  and  $|S| \geq 3$ , then there exists no binary relation on  $\mathcal{X}$  satisfying dominance and strict independence.

# Proof of Barberà and Pattanaik

- Assume  $S = \{1, 2, 3\}$
- (1)  $\{1\} \prec \{1, 2\}$  and (2)  $\{2, 3\} \prec \{3\}$  by dominance
- $\{1, 3\} \prec \{1, 2, 3\}$  by (1) and strict independence
- $\{1, 2, 3\} \prec \{1, 3\}$  by (2) and strict independence

# Proof of Kannai and Peleg

- Observation: dominance and independence imply  $A \sim \{\max(A), \min(A)\}$
- Assume  $S = \{1, 2, \dots, 6\}$
- $\{3\} \succ \{2, 5\}$

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- Assume  $S = \{1, 2, \dots, 6\}$
- $\{3\} \prec \{2, 5\}$
- $\{3, 6\} \preceq \{2, 5, 6\}$  by independence

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- Assume  $S = \{1, 2, \dots, 6\}$
- $\{3\} \prec \{2, 5\}$
- $\{3, 6\} \preceq \{2, 5, 6\}$  by independence
- $\{3, 4, 5, 6\} \preceq \{2, 3, 4, 5, 6\}$  by observation

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- This contradicts dominance!

# Proof of Kannai and Peleg

- Observation: dominance and independence imply  $A \sim \{\max(A), \min(A)\}$
- Assume  $S = \{1, 2, \dots, 6\}$
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# Proof of Kannai and Peleg

- Observation: dominance and independence imply  $A \sim \{\max(A), \min(A)\}$
- Assume  $S = \{1, 2, \dots, 6\}$
- $\{2, 5\} \succeq \{3\} \prec \{4\}$

# Proof of Kannai and Peleg

- Observation: dominance and independence imply  $A \sim \{\max(A), \min(A)\}$
- Assume  $S = \{1, 2, \dots, 6\}$
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- Assume  $S = \{1, 2, \dots, 6\}$
- $\{2, 5\} \prec \{4\}$
- $\{1, 4\} \succeq \{1, 2, 5\}$  by independence

# Proof of Kannai and Peleg

- Observation: dominance and independence imply  $A \sim \{\max(A), \min(A)\}$
- Assume  $S = \{1, 2, \dots, 6\}$
- $\{2, 5\} \prec \{4\}$
- $\{1, 4\} \succeq \{1, 2, 5\}$  by independence
- $\{1, 2, 3, 4\} \succeq \{1, 2, 3, 4, 5\}$  by observation



# Proof of Kannai and Peleg

- Observation: dominance and independence imply  $A \sim \{\max(A), \min(A)\}$
- Assume  $S = \{1, 2, \dots, 6\}$
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- $\{1, 4\} \succeq \{1, 2, 5\}$  by independence
- $\{1, 2, 3, 4\} \succeq \{1, 2, 3, 4, 5\}$  by observation
- This contradicts dominance!

## Ditching the assumption $\mathcal{X} = \mathcal{P}(S) \setminus \{\emptyset\}$

- In many applications  $\mathcal{X}$  is subject to constraints.
- There are families  $\mathcal{X} \neq \mathcal{P}(S) \setminus \{\emptyset\}$  with  $|S| > 6$  such that there is an order on  $\mathcal{X}$  satisfying dominance and (strict) independence.
- It can be argued that dominance is too weak in the general case.

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- Strict independence:  
 $\{\text{strawberry, lemon}\} \prec \{\text{strawberry, vanilla, lemon}\}$
- $\{\text{strawberry, vanilla}\} \stackrel{?}{\prec} \{\text{strawberry, lemon}\}$

# A strengthening of dominance

- Solution: Define a stronger version of dominance

## Maximal dominance

For all  $A, B \in \mathcal{X}$ ,

$$(\max(A) \leq \max(B) \wedge \min(A) < \min(B)) \vee$$

$$(\max(A) < \max(B) \wedge \min(A) \leq \min(B)) \rightarrow A \prec B$$

Assuming  $\mathcal{X} = \mathcal{P}(S) \setminus \{\emptyset\}$ , maximal dominance is implied by dominance and (strict) independence.

# An example - maximal dominance

- $S = \{\text{strawberry, vanilla, chocolate, lemon}\}$
- Linear order: strawberry < chocolate < vanilla < lemon
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  - $\{\text{strawberry}\} \prec \{\text{chocolate}\}$
  - $\{\text{strawberry, vanilla}\} \prec \{\text{strawberry, lemon}\}$

# The problems we treated

## The Partial (Max)-Dominance-(Strict)-Independence Problem

Given a linearly ordered set  $S$  and a set  $\mathcal{X} \subseteq \mathcal{P}(S) \setminus \{\emptyset\}$ , decide if there is a **partial order/preorder** on  $\mathcal{X}$  satisfying (maximal) dominance and (strict) independence.

## The (Max)-Dominance-(Strict)-Independence Problem

Given a linearly ordered set  $S$  and a set  $\mathcal{X} \subseteq \mathcal{P}(S) \setminus \{\emptyset\}$ , decide if there is a (strict) **total order** on  $\mathcal{X}$  satisfying (maximal) dominance and (strict) independence.

# The Partial (Max)-Dominance-(Strict)-Independence Problem

## Theorem

The Partial (Max)-Dominance-Independence Problem is trivial.

We can define a preorder satisfying maximal dominance and independence.

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## Theorem

The Partial (Max)-Dominance-Strict-Independence Problem is P-complete.

- We construct the minimal transitive relation satisfying (maximal) dominance and strict independence, then check if this relation is irreflexive.
- We can prove the P-hardness by a reduction from Horn-Sat.

# The Total (Max)-Dominance-(Strict)-Independence Problem

- The (Max)-Dominance-(Strict)-Independence problem is NP-hard.
- This can be shown via a reduction from betweenness.

## The Betweenness Problem

Given a finite set  $V = \{v_1, v_2, \dots, v_n\}$  and a set of triples  $R \subseteq V^3$ , find a strict total order on  $V$  such that  $a < b < c$  or  $a > b > c$  holds for all  $(a, b, c) \in R$ .

The NP-hardness of betweenness was shown 1979 by Jaroslav Opatrny.

# The Total Max-Dominance-Strict-Independence Problem

- Idea: Represent the elements  $v_1, v_2, \dots, v_n$  of  $V$  by sets  $V_1, V_2, \dots, V_n$ .
- $V_i := \{1, N\} \cup \{i + 1, i + 2, \dots, N - i\}$  for sufficiently large  $N$ .
- All sets have the same maximal and minimal element.
- The second largest elements are decreasing and second smallest elements are increasing.



Figure: Sketch of the sets  $V_1$ ,  $V_2$  and  $V_n$

# The Total Max-Dominance-Strict-Independence Problem

- For the triple  $(a, b, c) \in R$  represented by the sets  $A, B, C$  we add the following sets, where  $k$  is unique for this triple:  $A \setminus \{k\}, B \setminus \{k\}, B \setminus \{k+1\}, C \setminus \{k+1\}, A \setminus \{k+2\}, B \setminus \{k+2\}, B \setminus \{k+3\}, C \setminus \{k+3\}$
- We want  $B \setminus \{k+1\} \prec A \setminus \{k\}, B \setminus \{k\} \prec C \setminus \{k+1\}, A \setminus \{k+2\} \prec B \setminus \{k+3\}$  and  $C \setminus \{k+3\} \prec B \setminus \{k+2\}$

# The Total Max-Dominance-Strict-Independence Problem

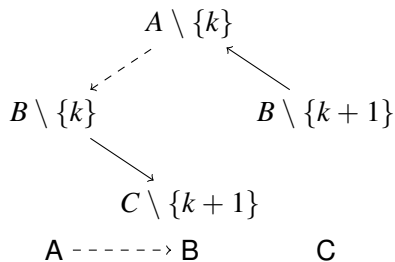


Figure: Family that forces that  $A \prec B$  leads to  $B \prec C$

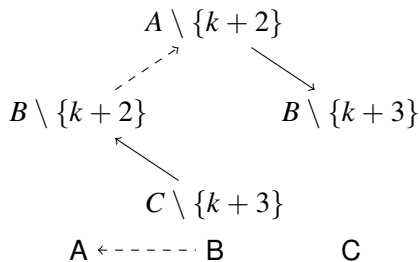


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# The Total Max-Dominance-Strict-Independence Problem

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- For example, we can force  $B \setminus \{k+1\} \prec A \setminus \{k\}$  by adding  $A \setminus \{k, k+4\}, B \setminus \{k+1, k+4\}$  and either  $A \setminus \{1, k, k+4\}, B \setminus \{1, k+1, k+4\}$  or  $A \setminus \{k, k+4, N\}, B \setminus \{k+1, k+4, N\}$

# A summary of our results

	Not total	Total
Dom + Ind	always	NP-complete
Max Dom +Ind	always	NP-complete
Dom + Strict Ind	in P	NP-complete
Max Dom + Strict Ind	in P	NP-complete

- The complexity of the studied problems if  $\mathcal{X}$  is given in a compact way.
- Characterize the sets  $\mathcal{X}$  that have orders satisfying (maximal) dominance and (strict) independence.
- Study other axioms and interpretations.