

# Eliciting a Suitable Voting Rule via Rank-Vectors

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<https://github.com/oliviercailloux/eliciting-voting-rules>



# Introduction

## Context

- A *committee* (a group of decision makers)
  - a panel attributing a research price
  - a management committee
- Recurring decisions
- A decision is taken using a voting rule
- Voting rule: a systematic way of aggregating different opinions and decide

## Our goal

We want to help the committee choose a suitable voting rule.

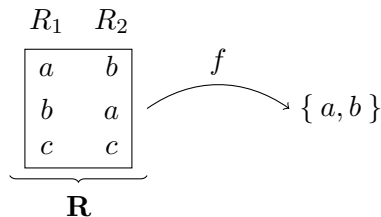
# Voting rule

## Input

- A set of possible alternatives (options)  $\mathcal{A}$
- Each voter  $i \in N$  has a linear order of preference over  $\mathcal{A}$
- A profile  $\mathbf{R}$  associates each  $i$  to such an order.

## Voting rule

Associates to each profile  $\mathbf{R}$  winning alternatives  $A \subseteq \mathcal{A}$ .



# Our goal

Making decisions involves two steps.

- 1 Establish a constitution: choose a voting rule.
- 2 Solve a decision problem: apply the voting rule.

## Our goal

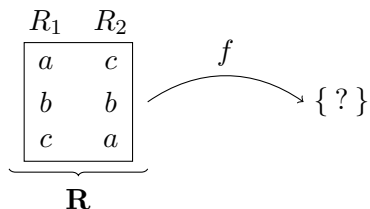
We focus on step 1: help the committee choose a voting rule.

- Class of functions  $\mathcal{F}$  (the set of all voting rules)
- Preference elicitation in order to choose a function  $f \in \mathcal{F}$ .
- We want to ask *simple* questions: example-based.

# A naïve attempt

## A first attempt

Simply give a profile  $\mathbf{R}$  and ask for  $f(\mathbf{R})$ . Then iterate.



- Completely general: all functions in  $\mathcal{F}$  can be reached.

*But...*

- One question brings very little information.
- Questions may be difficult to answer.

# General idea

- Ask *good* (informative, example-based) questions.
- Restrict the class of a priori acceptable functions to  $\mathcal{F}' \subset \mathcal{F}$ .

# Outline

- 1 Context
- 2 Asking good questions
- 3 Restrict the class of functions
- 4 Which questions to ask?
- 5 Conclusion

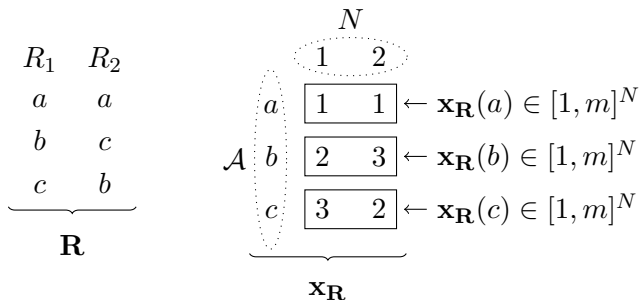
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## A different view of a profile

- We want to ask more informative questions about  $f$
- We look at profiles under a different angle
- A *rank-vector* maps voters to ranks,  $x : N \rightarrow [1, m]$
- All rank-vectors:  $[1, m]^N$



# Rank-profile function

- Rank-profile  $\mathbf{x} \in ([1, m]^N)^{\mathcal{A}}$  maps alternatives to rank-vectors
- To each profile  $\mathbf{R}$  corresponds a *rank-profile*  $\mathbf{x}_{\mathbf{R}}$
- Voting rule  $f$  maps  $\mathbf{R}$  to  $A \subseteq \mathcal{A}$
- Rank-profile voting rule  $f_{r-p}$  maps  $\mathbf{x}$  to  $A \subseteq \mathcal{A}$
- Rank-profile voting rule  $f_{r-p}$  corresponds to voting rule  $f$  iff  $f_{r-p}(\mathbf{x}_{\mathbf{R}}) = f(\mathbf{R})$

# Rank-profiles correspond to *some* combinations of rank-vectors

- Some sets of rank-vectors do *not* form a rank-profile
- We assume preferences are strict
- Thus, for a given voter: ranks must be all different

Not a rank-profile:

1	1
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2	3
---	---

2	2
---	---

# Symmetries of rank-profile functions

- A rule is *neutral* iff it treats the alternatives equally:
- after renaming alternatives,  $f$  selects the renamed alternatives
- In that case,  $f_{r-p}$  only requires a *set* of rank-vectors:

$$f_{r-p}(x^1 = \begin{bmatrix} 1 & 2 \end{bmatrix}, x^2 = \begin{bmatrix} 2 & 1 \end{bmatrix}) = \dots$$

- A rule satisfies *anonymity* iff it treats the voters equally:
- renaming the voters does not change the winners
- No similar simplification of the input of  $f_{r-p}$

# Condorcet property

## Condorcet property

- A rank-profile voting rule satisfies Condorcet iff it picks the Condorcet winner if it exists
- $x^1$  beats  $x^2$  iff more than half of the positions satisfy  $x_i^1 < x_i^2$
- $x$  is a Condorcet winner in  $\mathbf{x}$  iff it beats all other  $x' \in \mathbf{x}$

## Condorcet with 3 voters, 3 alternatives

	1	2	3	
$a$	1	2	2	
$b$	2	3	1	$\Rightarrow ?$
$c$	3	1	3	

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## Condorcet with 3 voters, 3 alternatives

	1	2	3	
$a$	1	2	2	
$b$	2	3	1	$\Rightarrow ? a$
$c$	3	1	3	

# Informational view about profiles

- Sen [1977]
- Voter  $i$  has evaluation function  $W_i : \mathcal{A} \rightarrow \mathbb{R}$
- Social welfare functional: associates  $\{W_i\}$  to ranking over  $\mathcal{A}$
- Subject to invariance requirement
- Example: changing  $\{W_i\}$  but respecting order does not change the output

# Representing the preferences of the committee

- We can now ask for the preference status of, e.g.,  
 $\boxed{1 \quad 3}$  versus  $\boxed{2 \quad 2}$
- Sets of such questions permit to identify a voting rule
- *Assuming* the committee reasons in a specific way
- We assume the committee can answer each such question
- With one of  $>, \sim, <$
- Meaning: when  $x^1 > x^2$ , the voting rule must select  $x^1$  rather than  $x^2$  if both are present (and similarly for  $x^1 < x^2$ )
- The preference  $\succeq = > \cup \sim$  of the committee over rank-vectors is transitive



# Weak-order based rules

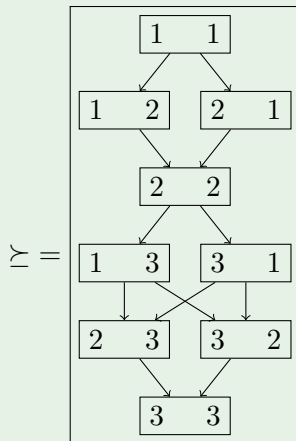
## Weak-order based rules

- $\succeq$  a weak-order (transitive, reflexive, connected) over  $[1, m]^N$ .
- The rule  $f_{\succeq}$ , at  $\mathbf{x}$ , selects those alternatives having maximal rank-vectors in  $\mathbf{x}$  according to  $\succeq$ .

A rule  $f$  is *weak-order based* (WOB) if there exists  $\succeq$  st  $f = f_{\succeq}$ .

# Example of a WOB rule

## Example (A WOB rule)



	$\mathbf{x}_1$	$f_{\succeq}(\mathbf{x}_1)$		
$a$	<table><tr><td>1</td><td>2</td></tr></table>	1	2	✓
1	2			
$b$	<table><tr><td>2</td><td>1</td></tr></table>	2	1	✓
2	1			
$c$	<table><tr><td>3</td><td>3</td></tr></table>	3	3	
3	3			
	$\mathbf{x}_2$	$f_{\succeq}(\mathbf{x}_2)$		
$a$	<table><tr><td>1</td><td>3</td></tr></table>	1	3	
1	3			
$b$	<table><tr><td>2</td><td>2</td></tr></table>	2	2	✓
2	2			
$c$	<table><tr><td>3</td><td>1</td></tr></table>	3	1	
3	1			

# Incomplete question sets

- We do not want to ask every possible questions!
- Can we get away with only *some* answers?

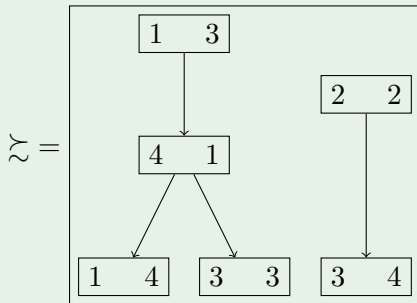
## Robust rules

- $\succsim$  a *preorder* (transitive, reflexive) over  $[1, m]^N$ .
- Look at all weak-orders  $\succeq$  extending  $\succsim$ .
- The *robust* rule  $F_{\succsim}$ , at  $\mathbf{R}$ , selects those alternatives winning in *some*  $f_{\succeq}$  (for some  $\succeq$  extension of  $\succsim$ ).

A rule  $f$  is *robust* if there exists  $\succsim$  st  $f = F_{\succsim}$ .

# Example of a robust rule

## Example (A robust rule)



	$\mathbf{x}$	$F_{\succsim}(\mathbf{x})$		
$a$	<table><tr><td>1</td><td>3</td></tr></table>	1	3	✓
1	3			
$b$	<table><tr><td>2</td><td>2</td></tr></table>	2	2	✓
2	2			
$c$	<table><tr><td>3</td><td>4</td></tr></table>	3	4	
3	4			
$d$	<table><tr><td>4</td><td>1</td></tr></table>	4	1	
4	1			

# Outline

- 1 Context
- 2 Asking good questions
- 3 Restrict the class of functions
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# Our restriction over possible functions

- We assume the committee reasons in some specific way
- Restricts the class of rules
- Bad news: we are not fully general any more
- Good news: we have restricted our class of functions

# The WOB class

- The committee has a weak-order  $\succeq$  over rank-vectors “in mind”
- This represents a WOB rule  $f_{\succeq}$
- $WOB = \left\{ f_{\succeq}, \succeq \text{ a weak-order over } [1, m]^N \right\}$  instead of  $\mathcal{F}$

# WOB rules are neutral

- If  $f$  is WOB,  $f$  is neutral
- Because  $f_{\succeq}$  selects those alternatives with highest rank-vectors
- Thus, we care only about the set of rank-vectors as input of  $f$
- And the rank-vector it selects



# How to be a WOB rule?

$f$  is a WOB rule iff  $f$ :

- Assigns a score  $s(x) \in \mathbb{R}$  to each rank-vector  $x \in [1, m]^N$
- Selects the rank-vectors having highest scores

# Scoring rules are WOB rules

- Every scoring rule (e.g. Borda) is a WOB rule
- $s(x)$  is the sum of the partial-scores  $s_r(i)$  of individual components of  $x$
- Score of  $\boxed{1 \quad 3 \quad 4} = s_r(1) + s_r(3) + s_r(4)$

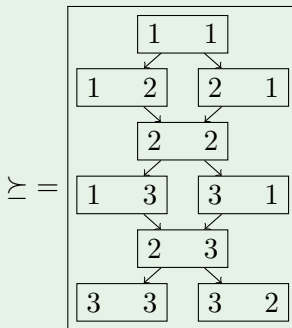
# Indifference to permutation is sufficient for anonymity

- Assume  $\succeq$  is indifferent to permutations of  $x$
- E.g.  $\begin{bmatrix} 1 & 3 \end{bmatrix} \sim \begin{bmatrix} 3 & 1 \end{bmatrix}$
- It follows that  $f_{\succeq}$  satisfies anonymity:
- Permuting the voters permutes all rank-vectors
- $f$  must still select the same (reordered) rank-vectors

# Weak-orders and WOB rules

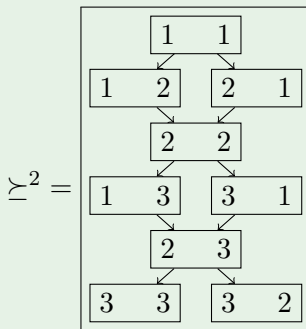
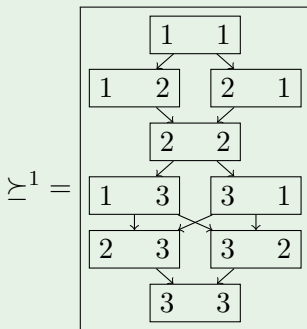
- Relationship between  $\succeq$  and  $f_{\succeq}$  may be counter-intuitive!
- Is indifference to permutation in  $\succeq$  required for anonymity of  $f_{\succeq}$ ?

Example (A weak-order yielding a neutral WOB rule)



# Two weak-orders, one WOB rule

## Example (Two “equivalent” weak-orders)



$$f_{\succsim^1} = f_{\succsim^2}$$

# Bucklin

Bucklin: a WOB rule that is not a scoring rule

## Bucklin

- Look at rank  $r$  (starting with 1)
- Is there a majority for ranking an alternative at  $r$  or better?
- Iterate, stop when found a suitable rank  $r$
- Select those alternatives that have most persons ranking them at  $r$  or better

1	2	3	4	5	
$a$	$a$	$b$	$b$	$c$	
$b$	$c$	$c$	$c$	$a$	$\Rightarrow ?$
$c$	$b$	$a$	$a$	$b$	

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## Bucklin

- Look at rank  $r$  (starting with 1)
- Is there a majority for ranking an alternative at  $r$  or better?
- Iterate, stop when found a suitable rank  $r$
- Select those alternatives that have most persons ranking them at  $r$  or better

1	2	3	4	5	
$a$	$a$	$b$	$b$	$c$	
$b$	$c$	$c$	$c$	$a$	$\Rightarrow ? c$
$c$	$b$	$a$	$a$	$b$	

## Some WOB rules are not scoring rules

- Bucklin is a WOB rule
- Proof idea: let's build a score  $s(x)$  to be *minimized*
- $s(x) = \text{rank } m_x \text{ required} + \text{frac. missing for unanimity at } m_x$
- Define  $m_x$  as the “median” of  $x$  lowest nb  $n$  st more than  $\frac{1}{2}$  the numbers are  $\leq n$

$$s(x) = m_x + \frac{\#x_i > m_x}{\#x_i}$$

### Example (Bucklin scores)

	1	2	3	4	5	$m_x$	$s(x)$
$a$	1	1	3	3	2	2	$2 + \frac{2}{5}$
$b$	2	3	1	1	3	2	$2 + \frac{2}{5}$
$c$	3	2	2	2	1	2	$2 + \frac{1}{5}$



# WOB compared to other classes of rules

- Every scoring rule is a WOB rule
- Some WOB rules are not scoring rules
- Many Condorcet rules are not WOB rules

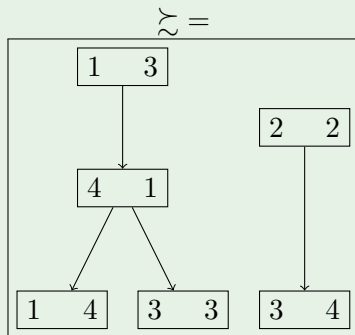
## Some relationships between classes of rules

Scoring  $\subset$  WOB; Condorcet  $\cap$  WOB =  $\emptyset$  (for  $n = 3k, m \geq 4$ ).

# The class of robust rules

Some robust rules are not WOB rules

Example (A robust rule)



	$\mathbf{R}_1$	$F_{\succsim}(\mathbf{R}_1)$	$\mathbf{R}_2$	$F_{\succsim}(\mathbf{R}_2)$				
$a$	<table><tr><td>1</td><td>3</td></tr></table>	1	3	✓	<table><tr><td>1</td><td>4</td></tr></table>	1	4	
1	3							
1	4							
$b$	<table><tr><td>2</td><td>2</td></tr></table>	2	2	✓	<table><tr><td>2</td><td>2</td></tr></table>	2	2	✓
2	2							
2	2							
$c$	<table><tr><td>3</td><td>4</td></tr></table>	3	4		<table><tr><td>3</td><td>3</td></tr></table>	3	3	
3	4							
3	3							
$d$	<table><tr><td>4</td><td>1</td></tr></table>	4	1		<table><tr><td>4</td><td>1</td></tr></table>	4	1	✓
4	1							
4	1							

# Robust rules compared to other classes of rules

Some relationships between classes of rules

Scoring  $\subset$  WOB  $\subset$  Robust

# Outline

- 1 Context
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- 3 Restrict the class of functions
- 4 Which questions to ask?**
- 5 Conclusion

# Which questions to ask?

- Assume the committee has a weak-order  $\succeq$  in mind
- We want to discover much information using few questions
- Different questions bring different amount of information

## Elicitation strategy

An elicitation strategy tells us which question should be asked considering our current knowledge

A strategy:

- 1 computes the fitness of asking about a pair of rank-vectors, for each pair
- 2 chooses the fittest pair

We ask  $q$  questions, then compare our approximation  $F_{\sim}$  to  $f_{\succeq}$

# Which strategy?

We tested three strategies

**optimistic** fitness of  $(x, y)$  proportional to the number of rank-vectors dominated by  $x$  or  $y$ , but not both

**pessimistic** a variant of the previous strategy, using the min operator rather than the sum

**likelihood** fitness proportional to the likelihood of a profile occurring where both rank-vectors are possible winners

(depends on the probability distribution over profiles, we assumed impartial culture)

We assume pareto-dominance and indifference to permutations

## Comparison of strategies

- Optimistic not better than random!
- Likelihood much better than pessimistic

# Number of questions

How many questions must be asked for a useful approximation?

- Our approximation has all the true winners:  $f_{\succeq}(\mathbf{R}) \subseteq F_{\sim}(\mathbf{R})$
- But it may have supplementary winners
- We are interested in the ratio of approximated VS true winners:  $\frac{|F_{\sim}(\mathbf{R})|}{|f_{\succeq}(\mathbf{R})|}$
- We average it over all profiles:  $\frac{1}{|\mathcal{R}|} \sum_{\mathbf{R} \in \mathcal{R}} \frac{|F_{\sim}(\mathbf{R})|}{|f_{\succeq}(\mathbf{R})|}$

For 6 voters, 6 alternatives, using the likelihood strategy:

nb q	Target rule	
	Borda	Random $\succeq$
0	1.9	2.2
25	1.3	1.7
99	1.0	1.3

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# Conclusion

We propose to help a committee choose a voting rule.

- We introduce a different look at a profile [see also [Sen, 1977](#)]
- We use it to ask simple questions to elicit preferences
- We analyse the class of rules reachable by our questioning process
- A robust voting rule may be defined to give all possible winners [inspired by [Dias et al., 2002](#)]
- We compare and analyse several elicitation strategies

## Future work

- The committee could have a preorder in mind
- Or the stable part of the w-o might be a preorder
- Behavioural interpretation of the constraints given by the committee
- Further analysis of the classes WOB, Robust rules
- Explore approximation with robust rules more generally
- Better elicitation strategies with active learning techniques

*Thank you for your attention!*

# References I

- L. Dias, V. Mousseau, J. Figueira, and J. Clímaco. An aggregation/disaggregation approach to obtain robust conclusions with ELECTRE TRI. *European Journal of Operational Research*, 138(2):332–348, 2002. URL <http://www.sciencedirect.com/science/article/pii/S0377221701002508>.
- A. Sen. On weights and measures: Informational constraints in social welfare analysis. *Econometrica*, 45(7):1539–1572, 1977. ISSN 0012-9682. doi:[10.2307/1913949](https://doi.org/10.2307/1913949). URL <http://www.jstor.org/stable/1913949>.

## More general aim

- Choose a rule: from axioms?
- Difficult to consider the implications of the axioms
- Incompatibilities, paradoxes. . .
- We want to help a committee choose a voting rule
- Do not limit to ask which axioms are suitable
- We should use the power of the axiomatic analysis
- But leave the axioms implicit