# Beyond Multiwinner Voting: Participatory Budgeting

Jan Maly June 10, 2022

- Participatory Budgeting is a relatively new democratic process, in which citizens can decide how (parts of) their city's budget is spend.
- Invented in 1989 by the worker's party in Porto Alegre, Brazil.
- Today, it is used in more than 1500 cities, including (parts of) Amsterdam.

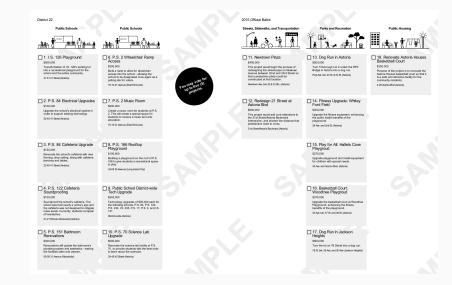
## Participatory Budgeting in Amsterdam



Website: https://buurtbudget.amsterdam.nl/

- Participatory Budgeting is usually a two stage process:
  - First, citizens propose projects.
  - Secondly, the citizens vote on which projects should be implemented.
- In recent years, researchers from the area of COMSOC started studying voting rules for the second stage more closely.

## What is (Approval-Based) Participatory Budgeting



# A formal model for Participatory Budgeting

We consider approval based Participatory Budgeting:

- A set of agents N, a set of projects P and a budget limit b.
- For every agent *i*, the set of projects  $A_i \subseteq P$  that *i* approves.
- A cost function  $c: P \to \mathbb{R}^+$ .

We call a bundle of projects  $W \subseteq P...$ 

... feasible if

$$\sum_{p\in W} c(p) \leq b.$$

 $\ldots$  exhaustive if for all  $p^* \in P \setminus W$  we have

$$c(p^*) + \sum_{p \in W} c(p) > b.$$

- PB instances in which all projects have the same cost are equivalent to approval based multiwinner voting. We call this the unit-cost case.
- When we talk about the unit-cost case, we assume w.l.o.g. that all projects have cost 1.
- We can consider PB as "weighted" multiwinner voting.
- Observe: In multiwinner voting exhaustiveness is essentially always required!

- A PB rule R is a function that maps a PB instance (A, c, b) to a feasible bundle R(A, c, b).
- We say a PB rule is exhaustive if its output is always exhaustive.

### An example PB instance

	<i>p</i> <sub>1</sub>	<i>p</i> <sub>2</sub>	<i>p</i> 3	<i>p</i> 4	<i>p</i> <sub>5</sub>
$c(\cdot)$	8	8	5	5	2
1	✓	1	1	×	×
2	1	✓	✓	×	×
3	1	1	$\checkmark$	×	×
4	1	×	×	✓	×
5	×	1	×	✓	×
6	1	×	×	×	$\checkmark$
7	×	×	×	×	<ul> <li>Image: A start of the start of</li></ul>
# of app.	5	4	3	2	2

- *b* = 14
- Most common PB rule is Greedy approval:
  - Take most approved project first
  - Remove projects which are no longer affordable
  - Take most approved project among the remaining projects
  - Repeat until no further project is affordable.
- Winning bundle in example: {p<sub>1</sub>, p<sub>3</sub>}

### A problematic PB instance

	$p_1$	<i>p</i> <sub>2</sub>	<i>p</i> <sub>3</sub>	<i>p</i> <sub>4</sub>	$p_5$
$c(\cdot)$	8	8	5	5	2
1	✓	1	1	×	×
2	1	1	1	×	×
3	1	1	1	×	×
4	$\times$	$\times$	×	1	×
5	$\times$	$\times$	×	1	×
6	$\times$	$\times$	$\times$	×	1
7	×	×	×	×	✓
# of app.	3	3	3	2	2

• *b* = 14

- Most common PB rule is Greedy approval.
- Winning bundle in example: {p<sub>1</sub>, p<sub>3</sub>} or {p<sub>2</sub>, p<sub>3</sub>}.
- 1, 2, 3 are not even a majority, but nevertheless only their projects are funded!

# Justified representation in PB

- Fairer PB rules are needed!
- Natural idea: Lift proportionality axioms and proportional rules from multiwinner voting to PB.
- In this lecture, we will try to lift the axiom EJR and the rule MES to the PB setting.
- In doing so, we will encounter three problems:
  - Cohesive groups need to be redefined.
  - We need to reason about the satisfaction of an agent.
  - Problems that were easy in MWV become intractable.

#### **ℓ-Cohesive Groups**

A group of agents  $N' \subseteq N$  is called  $\ell$ -cohesive if  $|N'| \ge \ell^{n/k}$  and  $|\bigcap_{i \in N'} A_i| \ge \ell$ .

### A problematic PB instance

	$p_1$	<i>p</i> <sub>2</sub>	<i>p</i> <sub>3</sub>	<i>p</i> <sub>4</sub>	$p_5$
$c(\cdot)$	8	8	5	5	2
1	✓	1	1	×	×
2	1	1	1	×	×
3	1	✓	✓	×	×
4	×	×	×	1	×
5	$\times$	$\times$	×	1	×
6	$\times$	$\times$	×	×	1
7	×	×	×	×	✓
# of app.	3	3	3	2	2

- *b* = 14
- 4 and 5 represent 2/7 of the agents and agree on projects worth more than 2/7 of the budget.
- They have no project that they can afford from 2/7 of the budget.

#### *l***-Cohesive Groups**

A group of agents  $N' \subseteq N$  is called  $\ell$ -cohesive if  $|N'| \ge \ell^{n/k}$  and  $|\bigcap_{i \in N'} A_i| \ge \ell$ .

#### *T***-Cohesive Groups**

Let  $T \subseteq P$  be a set of projects. Then a group of agents  $N' \subseteq N$  is called *T*-cohesive if  $c(T) \leq b \cdot |N'|/n$  and  $T \subseteq \bigcap_{i \in N'} A_i$ .

### A problematic PB instance

	$p_1$	<i>p</i> <sub>2</sub>	<i>p</i> <sub>3</sub>	<i>p</i> <sub>4</sub>	$p_5$
$c(\cdot)$	8	8	5	5	2
1	✓	1	1	×	×
2	1	1	✓	×	$\times$
3	1	✓	✓	×	×
4	$\times$	$\times$	$\times$	1	$\times$
5	$\times$	$\times$	$\times$	✓	×
6	×	×	×	×	1
7	×	×	×	×	✓
# of app.	3	3	3	2	2

- *b* = 14
- 6 and 7 are  $\{p_5\}$ -cohesive.
- 4 and 5 are not  $\{p_4\}$ -cohesive as  $c(\{p_4\} > 14 \cdot 2/7 = 4$

#### Proposition

Let (A, b, c) be a unit-cost PB instance. Then a group of agents N' is  $\ell$ -cohesive if and only if there is a set  $T \subseteq P$  with  $c(T) = \ell$  for which N' is T-cohesive.

- Assume N' is  $\ell$ -cohesive.
- Then  $|\bigcap_{i\in N'}A_i| \ge \ell$ .
- Let T be  $\ell$  arbitrary projects from  $|\bigcap_{i \in N'} A_i|$ .
- Then  $c(T) = \ell \leq b \cdot |N'|/n$  and  $T \subseteq \bigcap_{i \in N'} A_i$ .
- Hence N' is T-cohesive.
- Assume N' is T-cohesive and  $c(T) = \ell$ .
- Then  $\ell = c(T) \leq b \cdot |N'|/n$  and  $T \subseteq \bigcap_{i \in N'} A_i$ .
- Hence  $|\bigcap_{i\in N'}A_i| \ge c(T) = |T| = \ell$  and  $|N'| \ge \ell^n/b$ .
- Hence N' is  $\ell$ -cohesive.

#### EJR

A committee  $W \subseteq C$  of size k satisfies EJR if for every  $\ell \in \{1, \ldots, k\}$  and every  $\ell$ -cohesive group N', there exists a  $i \in N'$  such that  $|A_i \cap W| \ge \ell$ .

The three most common options to model an agents satisfaction:

- Count the number of approved projects:  $\mu_i^{\#}(W) = |A_i \cap W|$ .
- Cost of approved projects:  $\mu_i^c(W) = c(A_i \cap W)$ .
- Assume that agents provide an (additive) cardinal utility μ<sub>i</sub>(p) for each project p: μ<sub>i</sub>(W) = Σ<sub>p∈W</sub> μ<sub>i</sub>(p).

Count the number of approved projects:  $\mu_i^{\#}(W) = |A_i \cap W|$ .

- Difference in cost between projects can be huge.
- Particularly problematic when we are concerned with fairness: In example below {p<sub>1</sub>, p<sub>2</sub>} and {p<sub>1</sub>, p<sub>3</sub>} would be considered equally fair.

	$p_1$	<i>p</i> <sub>2</sub>	<i>p</i> <sub>3</sub>
$c(\cdot).$	50	50	1
1	1	×	×
2	×	1	1

Cost of approved projects:  $\mu_i^c(W) = c(A_i \cap W)$ .

- Implementing the same project in different locations might produce different cost. No reason to assume that this leads to a change in satisfaction.
- Higher cost might lead to "diminishing marginal returns".
- Rules based on this satisfaction principle often don't satisfy "discount monotonicity", i.e., making a winning project cheaper might lead to the project not winning anymore.

Observation: Greedy approval is implicitly based on this assumption.

Assume that agents provide an (additive) cardinal utility  $\mu_i(p)$  for each project p:  $\mu_i(W) = \sum_{p \in W} \mu_i(p)$ .

- Places a high cognitive load on the agents.
- Interpersonal comparison between different cardinal utilities is problematic.
- Additivity is still a very strong assumption.

## Possible solutions (Work in progress)

- Define a general theory of "approval-based" satisfaction functions. (Work in progress together with Markus Brill, Martin Lackner, Stefan Forster and Jannik Peters).
- Define fairness without using the concept of satisfaction.
   (Work in progress together with Simon Rey, Martin Lackner and Ulle Endriss; possible topic for a student presentation)

For this talk we focus on  $\mu_i^{\#}$  and  $\mu_i^c$ . Cardinal utilities are a possible topic for a student presentation.



#### EJR

A committee  $W \subseteq C$  of size k satisfies EJR if for every  $\ell \in \{1, \ldots, k\}$  and every  $\ell$ -cohesive group N', there exists a  $i \in N'$  such that  $|A_i \cap W| \ge \ell$ .

#### EJR- $\mu_i^{\#}$

A bundle  $W \subseteq P$  satisfies  $\text{EJR-}\mu_i^{\#}$  if for every  $T \subseteq P$  and every T-cohesive group N', there exists a  $i \in N'$  such that  $|A_i \cap W| \ge |T|$ .

EJR and EJR- $\mu_i^{\#}$  are equivalent in the unit-cost case. This follows directly from the equivalence of  $\ell$ - and T-cohesiveness in the unit-cost case.

# Satisfying EJR- $\mu_i^{\#}$

We can naturally adapt MES to the PB setting:

- Every agent starts with a budget of b/n.
- The price of project p is c(p).
- A project p is  $\alpha$ -affordable in round t if

$$\sum_{i\in N; p\in A_i} \min \alpha, b_i(t) \ge c(p)$$

 In every round, the project that is α-affordable for the smallest α is selected.

#### Theorem

MES satisfies EJR- $\mu_i^{\#}$ .

# **EJR**- $\mu_i^c$

# EJR- $\mu_i^{\#}$

A bundle  $W \subseteq P$  satisfies  $\text{EJR-}\mu_i^{\#}$  if for every  $T \subseteq P$  and every T-cohesive group N', there exists a  $i \in N'$  such that  $|A_i \cap W| \ge |T|$ .

#### **EJR**- $\mu_i^c$

A bundle  $W \subseteq P$  satisfies  $EJR-\mu_i^c$  if for every  $T \subseteq P$  and every T-cohesive group N', there exists a  $i \in N'$  such that  $c(A_i \cap W) \ge c(T)$ .

EJR, EJR- $\mu_i^{\#}$  and EJR- $\mu_i^c$  are equivalent in the unit-cost case, as |S| = c(S) for all  $S \subseteq P$  in unit-cost instances.

In general, EJR- $\mu_i^c$  and EJR- $\mu_i^{\#}$  are incompatible. Consider the following instance with b = 5.

	$p_1$	<i>p</i> <sub>2</sub>	<i>p</i> <sub>3</sub>	<i>p</i> <sub>4</sub>
$c(\cdot)$	5	1	1	1
1	1	1	1	1

Then, only  $\{p_1\}$  satisfies EJR- $\mu_i^c$  while only  $\{p_2,p_3,p_4\}$  satisfies EJR- $\mu_i^{\#}$ 

#### Theorem

If there is a polynomial time computable PB rule that satisfies EJR- $\mu_i^c$ , then P = NP.

## Complexity woes: Proof

- Consider the problem SUBSET SUM: Given a set of positive integers S and an integer t, is there a subset S' ⊆ S such that ∑<sub>s∈S'</sub> s = t?
- SUBSET SUM is known to be NP-complete.
- Given a SUBSET SUM instance (*S*, *t*), construct a PB instance with
  - 1 agent,
  - one project  $p_s$  for each  $s \in S$
  - $c(p_s) = s$  and b = t.
- Use PB rule to find a bundle W that satisfies EJR- $\mu_i^c$  in polynomial time.
- (S, t) is a positive instance if and only if c(W) = t.

#### **Greedy Cohesive for Cost**

- Initialize W and  $N^*$  as empty sets.
- While exists  $N' \subseteq N \setminus N^*$  and  $T \subseteq P \setminus W$ , s.t. N' is *T*-cohesive:
  - Select N'' ⊆ N \ N\* and T' ⊆ P \ W with maximal cost such that N'' is T'-cohesive.
  - Add T' to W and N'' to  $N^*$ .

#### Theorem

Greedy Cohesive for Cost satisfies  $EJR-\mu_i^c$ .

Observe: Greedy Cohesive for Cost requires exponential runtime.

# Satisfiability of EJR- $\mu_i^c$ : Proof Idea

#### Theorem

Greedy Cohesive for Cost satisfies  $EJR-\mu_i^c$ .

### **Proof idea**

- Let N' be a T-cohesive group.
- First case: N' was "picked" by the algorithm in some round. Then EJR-μ<sup>c</sup><sub>i</sub> is satisfied by construction.
- Second case: N' was never picked.
- Then, either all projects in T have been picked...
- ... or at least one agent i ∈ N' has been part of another group that has been picked.
- By the maximality criterion for picking groups, this implies c(A<sub>i</sub> ∩ W) ≥ c(T).

# **Relaxing EJR**- $\mu_i^c$

# **EJR**- $\mu_i^c$

A bundle  $W \subseteq P$  satisfies  $EJR-\mu_i^c$  if for every  $T \subseteq P$  and every T-cohesive group N', there exists a  $i \in N'$  such that  $c(A_i \cap W) \ge c(T)$ .

#### **EJR**- $\mu_i^c$ up to one

A bundle  $W \subseteq P$  satisfies  $\text{EJR}-\mu_i^c$  up to one if for every  $T \subseteq P$ and every T-cohesive group N', there exists a  $i \in N'$  such that either  $c(A_i \cap W) \ge c(T)$  or there exists a  $p \in P \setminus W$  such that  $c(A_i \cap (W \cup \{p\})) > c(T)$ .

In the unit cost case, we have  $c(A_i \cap W) \ge c(T)$  iff  $c(A_i \cap (W \cup \{p\})) > c(T)$ . Therefore, EJR, EJR- $\mu_i^{\#}$ , EJR- $\mu_i^{c}$  and EJR- $\mu_i^{c}$  up to one are equivalent in the unit-cost case.

We adapt MES to take cost into account.  $MES[\mu_i^c]$  is defined as

- Every agent starts with a budget of b/n.
- The price of project p is c(p).

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• A project p is  $\alpha$ -affordable in round t if

$$\sum_{\substack{\in \mathcal{N}; p \in A_i}} \min lpha \cdot c(p), b_i(t) \geq c(p)$$

• In every round, the project that is  $\alpha$ -affordable for the smallest  $\alpha$  is selected.

#### Theorem

 $MES[\mu_i^c]$  satisfies EJR- $\mu_i^c$  up to one.

# Satisfying EJR- $\mu_i^c$ up to one: Proof idea

- First observe that  $1/\alpha$  is the satisfaction per money of an agent that pays "full price".
- Let N' be a T-cohesive group.
- Assume round k is the first round after which an agent i in N' could not pay "in full" for a project p in T. Let W\* be the projects selected in rounds 1 to k.
- To get A<sub>i</sub> ∩ (W<sup>\*</sup> ∪ {p}) agent i would need to spend more than b/n.
- Before round k, all agents in N' could pay for all projects in T in full. Hence projects in W\* give at least as much satisfaction per money as agents in N' get by buying the projects in T by themselves.
- It follows that  $c(A_i \cap (W^* \cup \{p\})) > c(T)$ .

#### **EJR**- $\mu_i^c$ up to any

A bundle  $W \subseteq P$  satisfies  $\text{EJR}-\mu_i^c$  up to any if for every  $T \subseteq P$ and every T-cohesive group N', there exists a  $i \in N'$  such that either  $c(A_i \cap W) \ge c(T)$  or for every  $p \in P \setminus W$  we have  $c(A_i \cap (W \cup \{p\})) > c(T)$ .

#### Theorem

 $MES[\mu_i^c]$  satisfies EJR- $\mu_i^c$  up to any.

- PB is a generalization of mulitwinner voting.
- We can lift proportionality axioms like EJR from multiwinner voting to PB.
- In order to talk about proportionality, we have to fix a satisfaction function for the agents.
- If we assume  $\mu_i^{\#}$  describes agents' satisfaction, then we can achieve EJR- $\mu_i^{\#}$  in polynomial time using MES.
- If we assume μ<sup>c</sup><sub>i</sub> describes agents' satisfaction, then we can only achieve EJR-μ<sup>c</sup><sub>i</sub> up to any in polynomial time using MES[μ<sup>c</sup><sub>i</sub>].