

# Justified Representation in Approval-Based Committee Voting



Hariz Aziz

**Markus Brill**

Vincent Conitzer

Edith Elkind

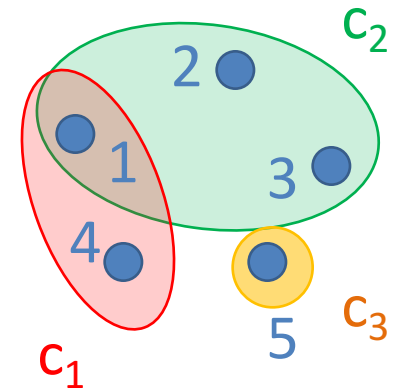
Rupert Freeman

Toby Walsh



# Voting with Approval Ballots

- A set of candidates  $C$
- $n$  voters  $\{1, \dots, n\}$
- Each voter  $i$  **approves** a subset of candidates  $A_i \subseteq C$
- Goal: select  $k$  winners (a **committee**)



1:  $C_1, C_2$   
2:  $C_2$   
3:  $C_2$   
4:  $C_1$   
5:  $C_3$

# Outline

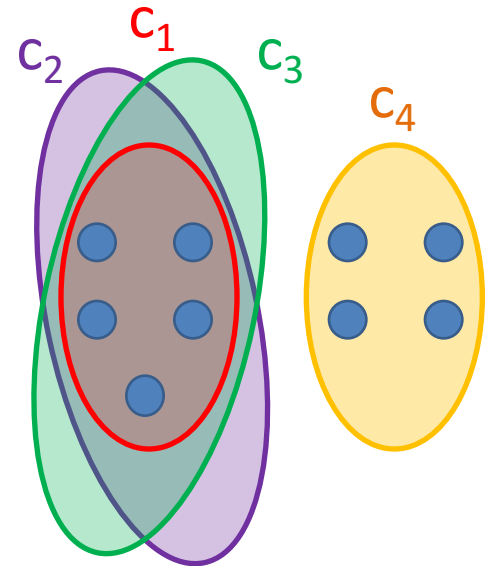
- Approval-based multiwinner rules
- Justified Representation (JR)
- Which rules satisfy JR?
- Extended Justified Representation (EJR)
- (E)JR and core stability

# Outline

- Approval-based multiwinner rules
- Justified Representation (JR)
- Which rules satisfy JR?
- Extended Justified Representation (EJR)
- (E)JR and core stability

# Approval Voting (AV)

- Each candidate gets **one** point from each voter who approves her
- **k** candidates with the **highest score** are selected
  - ties broken **deterministically**



for  $k=3$   
AV outputs  
 $\{C_1, C_2, C_3\}$

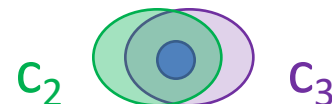
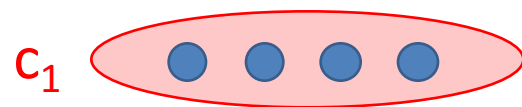
# Minimax Approval Voting (MAV)

- Brams, Kilgour & Sanver '07

- **Distance** from ballot  $A_i$  to a committee  $W$ :

$$d(A_i, W) = |A_i \setminus W| + |W \setminus A_i|$$

- Goal: select a size- $k$  committee that minimizes  $\max_i d(A_i, W)$



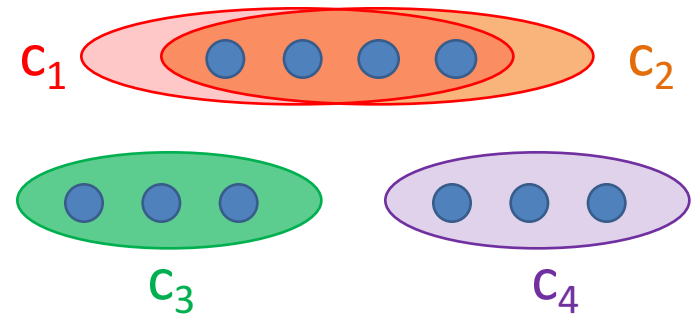
for  $k=1$

AV outputs  $c_1$ ,

MAV outputs  $c_2$  or  $c_3$

# Satisfaction Approval Voting (SAV)

- Brams & Kilgour '14
- Voter  $i$  scores committee  $W$  as  $|A_i \cap W| / |A_i|$
- Goal: select a size- $k$  committee with the **maximum** score

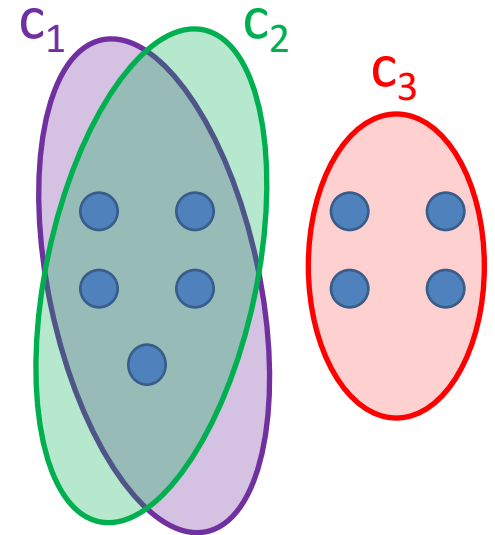


for  $k=2$

AV outputs  $\{C_1, C_2\}$ ,  
SAV outputs  $\{C_3, C_4\}$

# Proportional Approval Voting (PAV)

- Simmons '01
- Voter  $i$  derives utility of 1 from her 1<sup>st</sup> approved candidate, 1/2 from 2<sup>nd</sup>, 1/3 from 3<sup>rd</sup>, etc.
- $u_i(W) = 1 + 1/2 + \dots + 1/|W \cap A_i|$
- Goal: select a size- $k$  committee  $W$  that maximizes  $u(W) = \sum_i u_i(W)$



for  $k=2$

AV outputs  $\{c_1, c_2\}$ ,

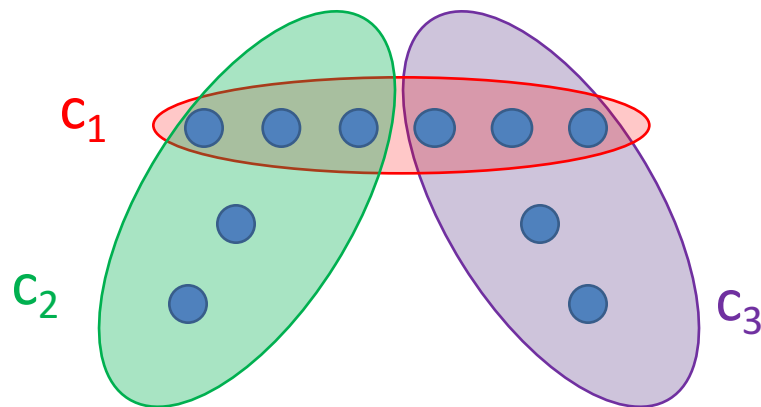
PAV outputs

$\{c_1, c_3\}$  or  $\{c_2, c_3\}$



# Reweight Approval Voting (RAV)

- Thiele, early 20<sup>th</sup> century
- **Sequential** version of PAV
- Initialize:  
 $\omega(i) = 1$  for all  $i$ ,  $W = \emptyset$
- Repeat  $k$  times:
  - add to  $W$  a candidate with **max approval weight**  
$$\omega(c) = \sum_{i \text{ approves } c} \omega(i)$$
  - **update** the weight of each voter to  $\omega(i) = 1/(1 + |A_i \cap W|)$



for  $k=2$

PAV outputs  $\{c_2, c_3\}$ ,  
RAV outputs  
 $\{c_1, c_2\}$  or  $\{c_1, c_3\}$

# Generalizing PAV and RAV: Arbitrary Weights

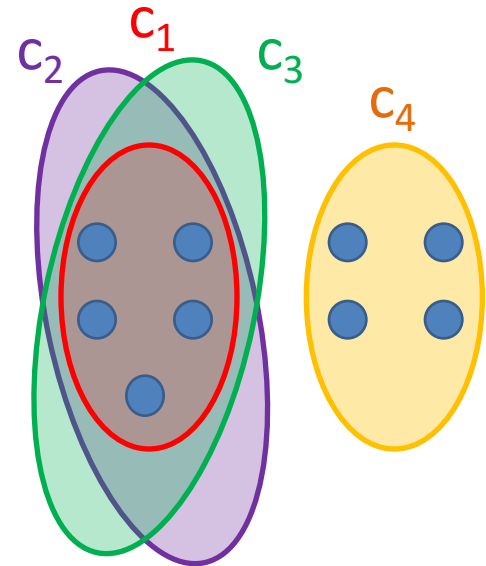
- PAV and RAV both use weight vector  $(1, 1/2, 1/3, \dots)$
- We can use an **arbitrary** weight vector  $(w_1, w_2, \dots)$  with  $w_1 = 1, w_1 \geq w_2 \geq \dots$  instead:  
 $(w_1, w_2, \dots)$ -PAV and  $(w_1, w_2, \dots)$ -RAV
- $(1, 0, \dots)$ -RAV: choose candidates one by one to **cover** as many **uncovered voters** as possible at each step (**Greedy Approval Voting (GAV)**)

# Outline

- Approval-based multiwinner rules
- **Justified Representation (JR)**
- Which rules satisfy JR?
- Extended Justified Representation (EJR)
- (E)JR and core stability

# Representation

- 5 voters get 3 representatives, 4 voters get 0 representatives
- Intuition: each **cohesive** group of voters of size  $n/k$  “deserves” at least **one** representative



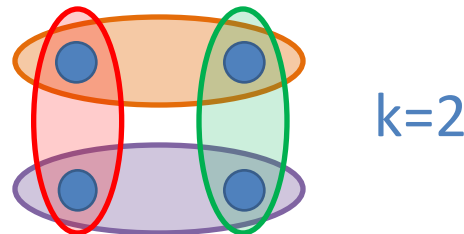
for  $k=3$

AV outputs

$\{C_1, C_2, C_3\}$

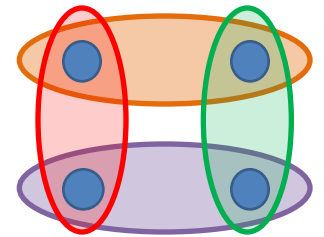
# First Attempt: Strong Justified Representation

- Definition: a committee  $W$  provides **strong justified representation (SJR)** for a list of ballots  $(A_1, \dots, A_n)$  and committee size  $k$  if for every set of voters  $X$  with  $|X| \geq n/k$  and  $\bigcap_{i \in X} A_i \neq \emptyset$  it holds that  $W$  contains at least one candidate from  $\bigcap_{i \in X} A_i$ .
- **Bad news**: for some profiles, no committee provides SJR



# Justified Representation

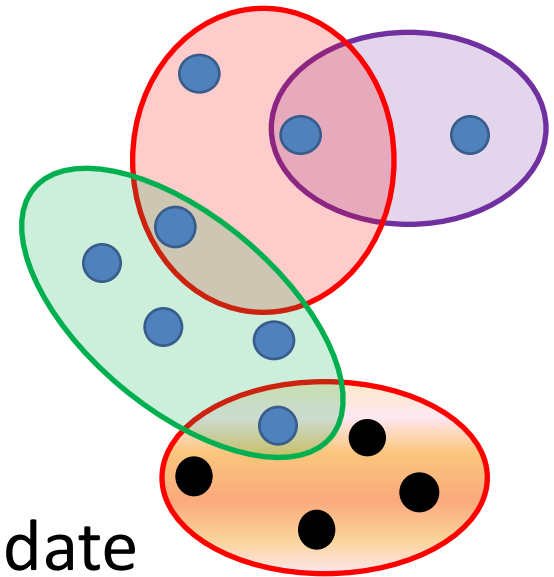
- Definition: a committee  $W$  provides **justified representation (JR)** for a list of ballots  $(A_1, \dots, A_n)$  and committee size  $k$  if for every set of voters  $X$  with  $|X| \geq n/k$  and  $\bigcap_{i \in X} A_i \neq \emptyset$  it holds that  $W$  contains at least one candidate from  $\bigcup_{i \in X} A_i$ .



- Equivalently: there does **not** exist a cohesive group of  $n/k$  voters that is totally **unrepresented**

# Can We Always Satisfy JR?

- Claim: GAV (aka  $(1, 0, \dots)$ -RAV) **always** outputs a committee that provides JR.
- Proof:
  - Suppose after  $k$  steps we have  $n/k$  uncovered voters who all approve  $a$
  - $a$ 's weight is  $\geq n/k$
  - then at each step we chose a candidate that covered  $\geq n/k$  uncovered voters
  - thus we should have covered all  $n$  voters



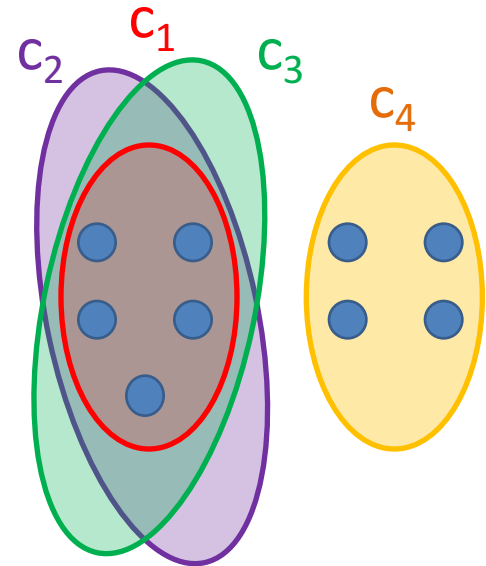
# Outline

- Approval-based multiwinner rules
- Justified Representation (JR)
- Which rules satisfy JR?
- Extended Justified Representation (EJR)
- (E)JR and core stability



# Rules that fail JR

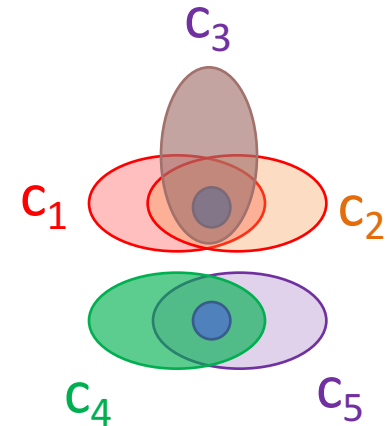
- AV fails JR for  $k \geq 3$
- SAV fails JR for  $k \geq 2$
- MAV fails JR for  $k \geq 2$ 
  - except if each ballot is of size  $k$  and ties are broken in favour of JR



for  $k=3$   
AV outputs  
 $\{C_1, C_2, C_3\}$

# SAV Fails JR

- SAV:
  - voter  $i$  scores committee  $W$  as  $|A_i \cap W| / |A_i|$
  - SAV select a size- $k$  committee with the **maximum** score



$k=n=2$

SAV outputs  
 $\{C_4, C_5\}$

- SAV fails JR

# PAV, RAV and JR

- Theorem: PAV **satisfies** JR
  - $(w_1, w_2, \dots)$ -PAV satisfies JR **iff**  $w_j \leq 1/j$  for all  $j$
- Theorem: RAV **fails** JR for  $k \geq 10$ 
  - $k = 3, \dots, 9$  is open!
  - $(w_1, w_2, \dots)$ -RAV **fails** JR if  $w_2 > 0$
  - $(1, 0, \dots)$ -RAV is GAV and **satisfies** JR
  - $(1, 1/n, \dots)$ -RAV **satisfies** JR

# PAV Satisfies JR

- $u_i(W) = 1 + 1/2 + \dots + 1/|W \cap A_i|$
- Goal: select a size- $k$  committee  $W$  that maximizes  $u(W) = \sum_i u_i(W)$
- Theorem: PAV satisfies JR
- Proof idea:
  - if not, there is some  $c \in C$  that could **increase** the total utility by  $\geq n/k$
  - we will show that some candidate  $a \in W$  **contributes**  $< n/k$

# PAV Satisfies JR

- Proof:

- $MC(a) := u(W) - u(W \setminus a)$ : marginal utility of  $a$

- $MC(a, i) := u_i(W) - u_i(W \setminus a)$ : marginal utility of  $a$  for  $i$

- $\sum_a MC(a) =$

- $MC(a) < n/k$  for some  $a$  in  $W$

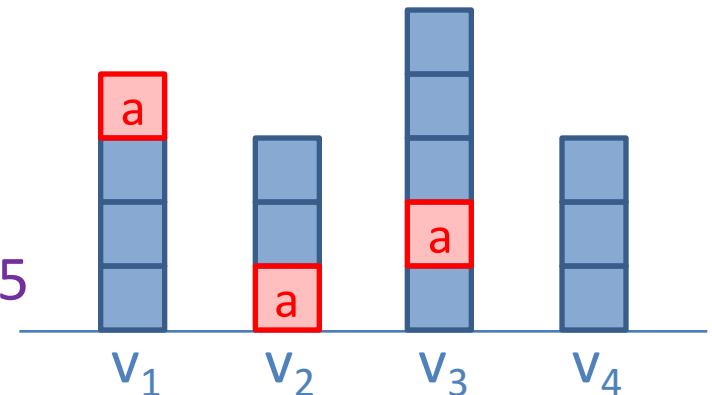
- $u(W \cup c \setminus a) > u(W)$

$$MC(a, 1) = 1/4$$

$$MC(a, 2) = 1/3$$

$$MC(a, 3) = 1/5$$

$$MC(a) = 1/4 + 1/3 + 1/5$$



# Summary: JR

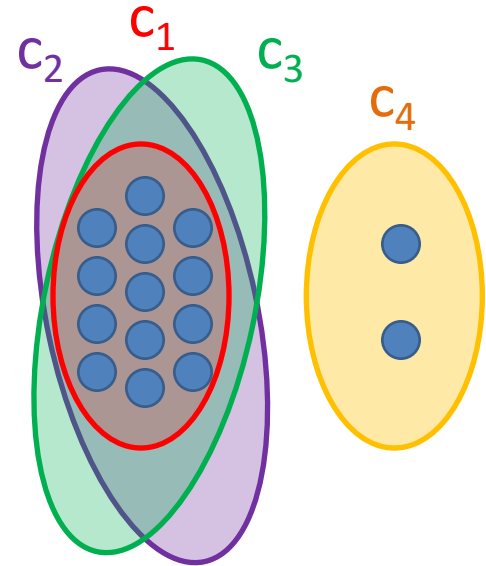
	Satisfies JR	
AV	No	
SAV	No	
MAV	No	
PAV	Yes	
RAV	No	
GAV	Yes	

# Outline

- Approval-based multiwinner rules
- Justified Representation (JR)
- Which rules satisfy JR?
- Extended Justified Representation (EJR)
- (E)JR and core stability

# Is JR Enough?

- Should we choose  $c_4$  ???
- Perhaps a **very large** cohesive group of voters “deserves” **several** representatives?
- Idea: if  $n/k$  voters who agree on a candidate “deserve” **one** representative, then maybe  $\ell \cdot n/k$  voters who agree on  $\ell$  candidates “deserve”  $\ell$  representatives?





# Extended Justified Representation

- Definition: a committee  $W$  provides **extended justified representation (EJR)** for a list of ballots  $(A_1, \dots, A_n)$  and committee size  $k$  if for every  $\ell > 0$ , every set of voters  $X$  with  $|X| \geq \ell \cdot n/k$  and  $|\bigcap_{i \in X} A_i| \geq \ell$  it holds that  $|W \cap A_i| \geq \ell$  for at least one  $i \in X$ .
- $\ell = 1$ : justified representation

# Satisfying EJR

- Observation: GAV **fails** EJR
- Theorem: PAV **satisfies** EJR
  - $(w_1, w_2, \dots)$ -PAV **fails** EJR if  $(w_1, w_2, \dots) \neq (1, 1/2, 1/3, \dots)$
- But PAV is **NP-hard** to compute [AGGMMW'14]
  - Are there any other rules satisfying EJR?
- Theorem: **checking** if a committee provides EJR is **coNP-complete**
- Open: complexity of **finding** an EJR committee

# Outline

- Approval-based multiwinner rules
- Justified Representation (JR)
- Which rules satisfy JR?
- Extended Justified Representation (EJR)
- (E)JR and core stability

# A Cooperative Game

- Given  $k$  and  $(A_1, \dots, A_n)$ , consider **NTU game** with players  $\{1, \dots, n\}$ 
  - each coalition of size  $x$  with  $\ell \cdot n/k \leq x \leq (\ell+1) \cdot n/k$  can **“purchase”**  $\ell$  alternatives
  - players evaluate committees using **PAV utility function**
  - a coalition has a **profitable deviation** if they can purchase a set of candidates that is **strictly preferred** by everybody in the coalition
  - **core**: outcomes w/o profitable deviations

# (E)JR and Core Stability

- Theorem: Committee provides **JR** iff no coalition of size  $\leq \lceil n/k \rceil$  has a profitable deviation.
- Theorem: Committee provides **EJR** iff for every  $\ell \geq 0$ , no coalition  $X$  with  $\ell \cdot n/k \leq |X| \leq (\ell+1) \cdot n/k$  and  $|\bigcap_{i \in X} A_i| \geq \ell$  has a profitable deviation.
  - not true for arbitrary coalitional deviations!
- Open problems:
  - Is the **core** always **non-empty**?
  - Find a rule that **selects from the core** (if non-empty)

# Conclusion

- New properties for approval-based committee voting rules
  - capture **representation**
  - EJR **characterizes** PAV weight vector  $(1, \frac{1}{2}, \dots)$
- Open problems:
  - tractable rules satisfying EJR
  - core-selecting rules
  - restricted domains

	JR	EJR
AV	No	No
SAV	No	No
MAV	No	No
PAV	Yes	Yes
RAV	No	No
GAV	Yes	No

**Thank you!**