



Fair and



Efficient



Social Decision-Making

CSCI 699

Voting: Committee Selection

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Credit for the slides : Nisarg Shah and [Dominik Peters' Tutorial](#)

Voting

- Set of n **agents** $N = \{1, \dots, n\}$
- Set of m **candidates** M
- **Votes**
 - Ranked ballots \succ_i (e.g., $a \succ_i b \succ_i c$)
 - Cardinal utilities $u_i: M \rightarrow \mathbb{R}_{\geq 0}$ (less prominent)
 - Approval ballots $A_i \subseteq M$
 - Equivalent to binary cardinal utilities $c \in A_i \Leftrightarrow u_i(c) = 1$
- **Goal**
 - Single-winner voting: choose $c^* \in M$
 - Multiwinner voting: choose $S \subseteq M$ with $|S| \leq k$ (for given k)

“ABC” Voting

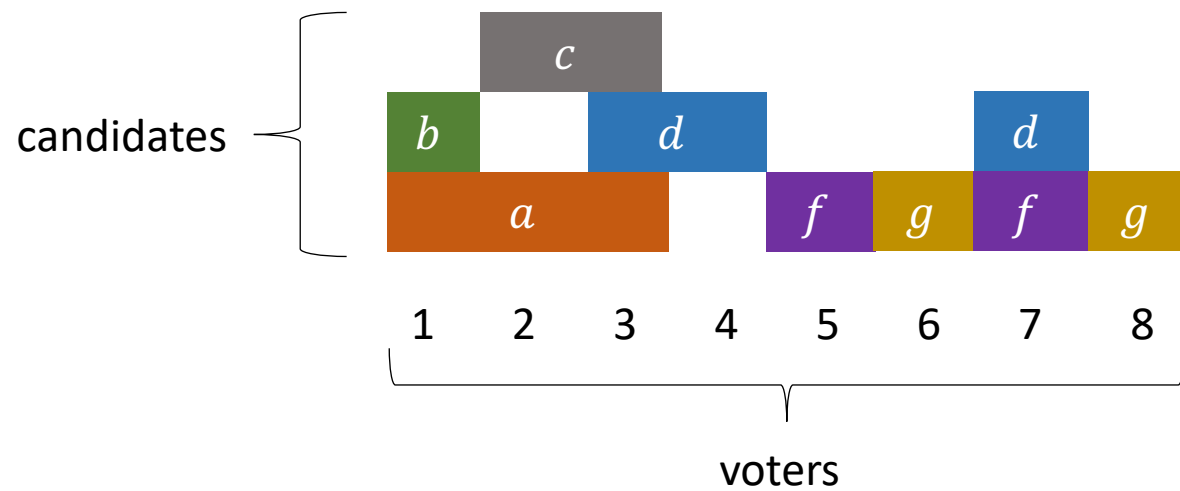
- **Fairness**

- Difficult to define non-trivial fairness notions for single-winner voting
 - Can’t give each individual/group “proportionally deserved” utility
- Much more interesting for multiwinner voting
 - We’ll focus on approval ballots, but many of the notions we’ll see have been extended to ranked ballots and cardinal utilities

- **Approval-Based Multiwinner Voting**

- Each voter i approves a subset of candidates $A_i \subseteq M$
- A subset of candidates $W \subseteq M, |W| \leq k$ is selected
- Each voter i gets utility $u_i(W) = |W \cap A_i|$

“ABC” Voting

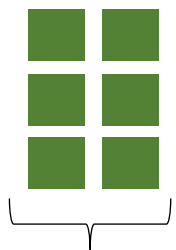


Prominent Rules

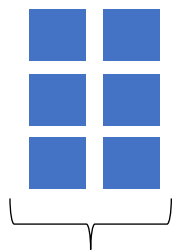
- Thiele's Methods [1895]
 - Given a sequence $s = (s_1, s_2, \dots, s_k)$, select a committee W that maximizes $\sum_{i \in N} s_1 + s_2 + \dots + s_{u_i(W)}$
- Examples
 - Approval voting (AV): $s = (1, 1, 1, \dots, 1)$
 - Selects the k candidates with the highest total approvals

Approval Voting

$k = 6$



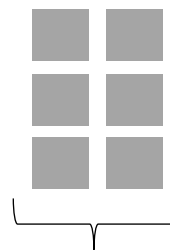
24 voters



1 voter



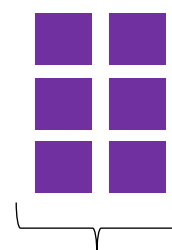
18 voters



12 voters



1 voter



12 voters

1:	+24	+1	+18	+12	+1	+12
2:	+24	+1	+18	+12	+1	+12
3:	+24	+1	+18	+12	+1	+12
4:	+24	+1	+18	+12	+1	+12
5:	+24	+1	+18	+12	+1	+12
6:	+24	+1	+18	+12	+1	+12

$W = \{ \text{green square}, \text{green square}, \text{green square}, \text{green square}, \text{green square}, \text{green square} \}$

Prominent Rules

- Thiele's Methods [1895]

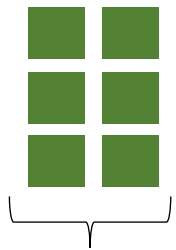
- Given a sequence $s = (s_1, s_2, \dots, s_k)$, select a committee W that maximizes $\sum_{i \in N} s_1 + s_2 + \dots + s_{u_i(W)}$

- Examples

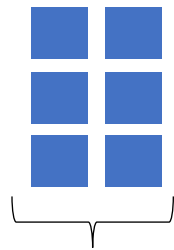
- Approval voting (AV): $s = (1, 1, 1, \dots, 1)$
 - Selects the k candidates with the highest total approvals
- Chamberlin-Courant (CC): $s = (1, 0, 0, \dots, 0)$
 - Maximizes the number of voters for whom at least one approved candidate is selected

Chamberlin-Courant

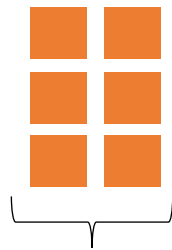
$k = 6$



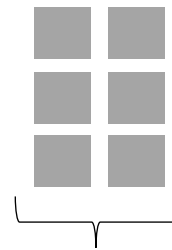
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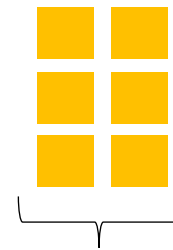
1 voter



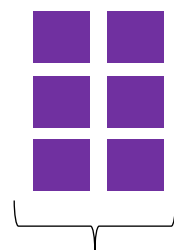
18 voters



12 voters



1 voter



12 voters

1:	+24	+1	+18	+12	+1	+12
2:	+0	+0	+0	+0	+0	+0
3:	+0	+0	+0	+0	+0	+0
4:	+0	+0	+0	+0	+0	+0
5:	+0	+0	+0	+0	+0	+0
6:	+0	+0	+0	+0	+0	+0

$W = \{ \text{green}, \text{blue}, \text{orange}, \text{gray}, \text{yellow}, \text{purple} \}$

Prominent Rules

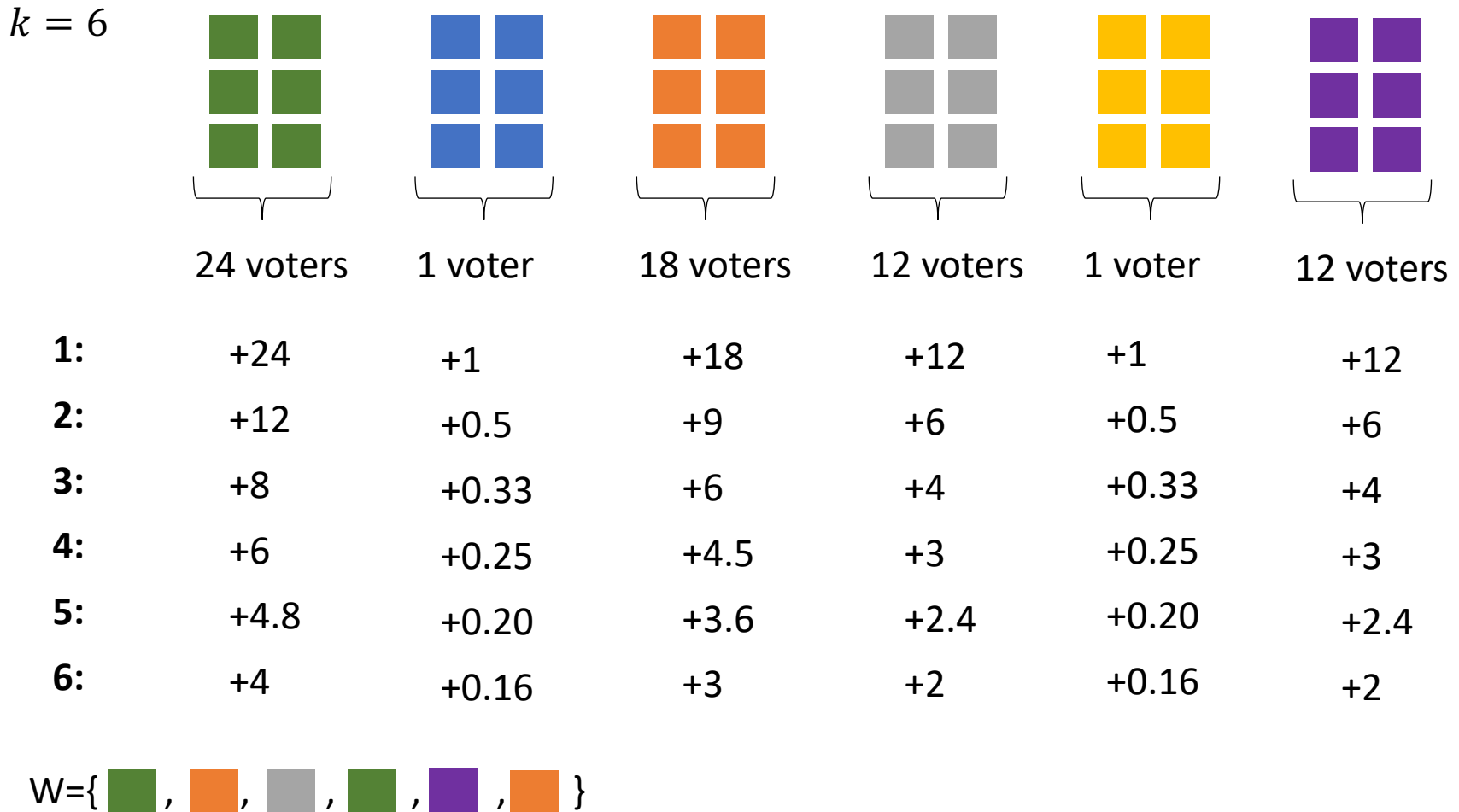
- Thiele's Methods [1895]

- Given a sequence $s = (s_1, s_2, \dots, s_k)$, select a committee W that maximizes $\sum_{i \in N} s_1 + s_2 + \dots + s_{u_i(W)}$

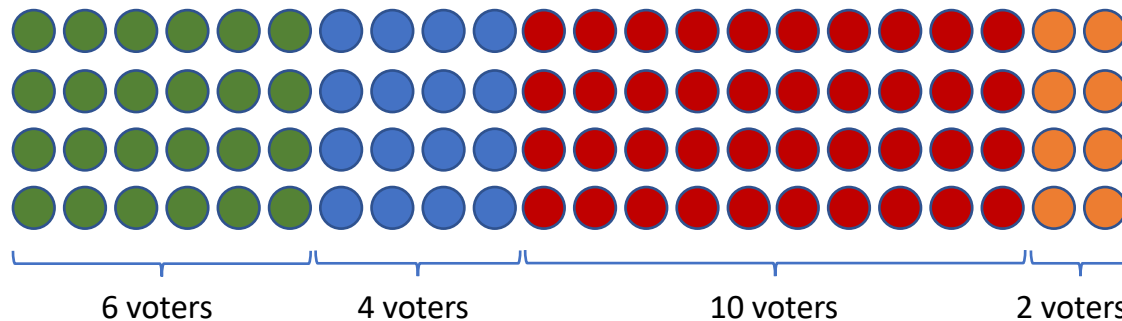
- Examples

- Approval voting (AV): $s = (1, 1, 1, \dots, 1)$
 - Selects the k candidates with the highest total approvals
- Chamberlin-Courant (CC): $s = (1, 0, 0, \dots, 0)$
 - Maximizes the number of voters for whom at least one approved candidate is selected
- Proportional Approval Voting (PAV): $s = (1, 1/2, 1/3, \dots, 1/k)$
 - In between AC and CC, but why exactly harmonic scores?

Proportional Approval Voting



Why Harmonic Numbers?



$k = 11$

- “Proportionality”
 - We should select 3 , 2 , 5 , 1 

Party-List PR

- Party-list instances

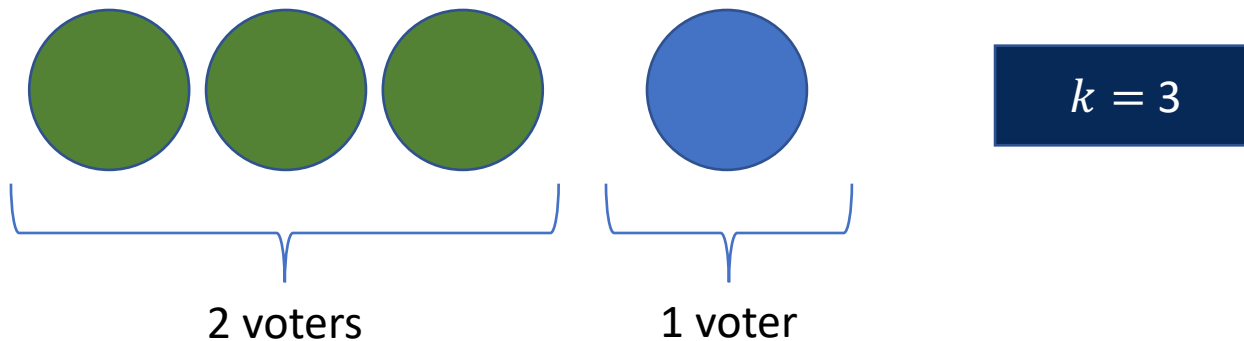
- For all $i, j \in N$: either $A_i = A_j$ or $A_i \cap A_j = \emptyset$
- For all $i \in N$: $|A_i| \geq k$

- Lower quota for party-list instances

- For every party-list instance, $u_i(W) \geq \lfloor k \cdot n_i/n \rfloor$ for all $i \in N$, where $n_i = |\{j \in N: A_j = A_i\}|$

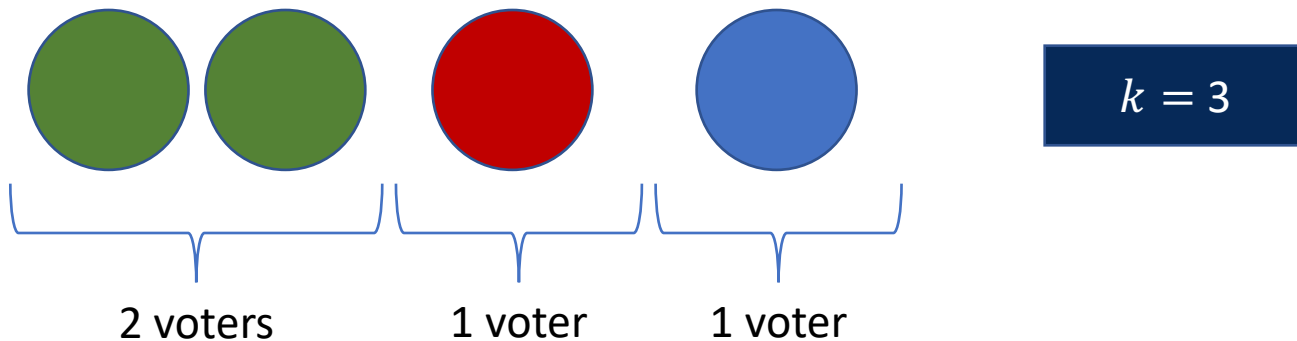
Party-List PR

- AV violates lower quota for party-list instances
 - 4 candidates $\{a, b, c, d\}$, $k = 3$
 - 2 voters approve $\{a, b, c\}$ and 1 voter approves d

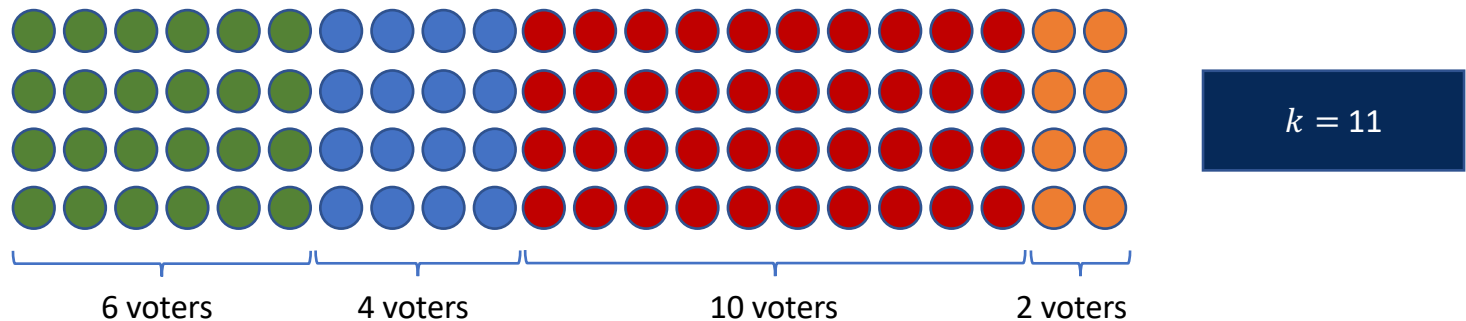


Party-List PR

- CC violates lower quota for party-list instances
 - 6 candidates $\{a, b, c, d\}$, $k = 3$
 - 2 voters approve $\{a, b\}$, 1 voter approves $\{c\}$, 1 voter approves $\{d\}$



Intuition Behind PAV

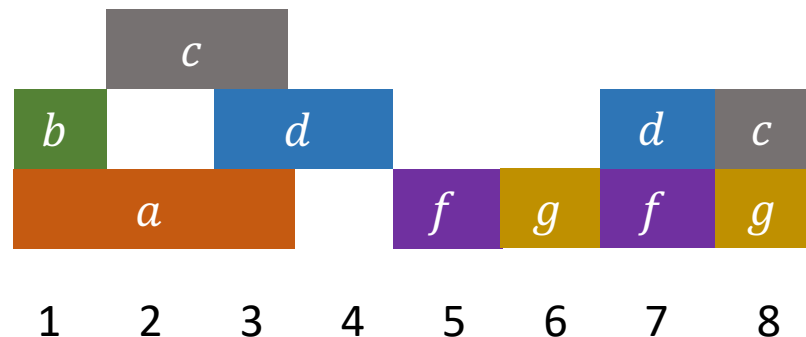


- Party-list PR

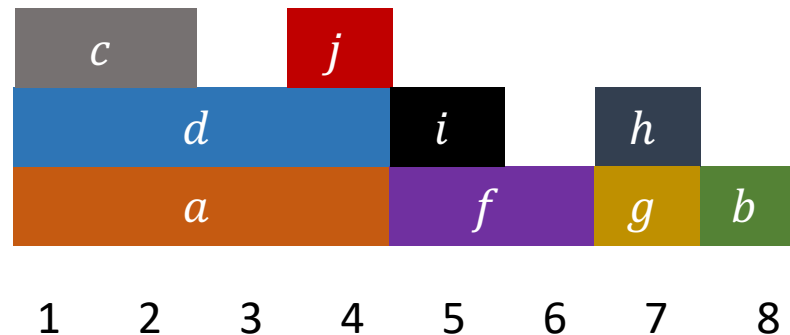
- We should select 3 ●, 2 ●, 5 ●, 1 ●
- PAV would have the desired result because:
 - 3rd ●, 2nd ●, 5th ●, 1st ● have the same marginal contribution = 2
 - We'll see a formal proof of PAV satisfying something stronger later
 - PAV known to be the only Thiele's method (and subject to additional axioms the only ABC rule) achieving this

Fairness for General Instances

- Issues
 - No well-separated “groups” of voters
 - A subset of voters may not be “fully cohesive” (having identical approval sets)
- We want to provide a utility guarantee to
 - ...**every** possible subset (group) of voters that is...
 - ...sufficiently large and cohesive and...
 - ...their guarantee scales with their size and cohesiveness



Fairness for General Instances



- For all $S \subseteq N$
- If $|S| \geq \ell \cdot n/k$ (large) and $|\bigcap_{i \in S} A_i| \geq \ell$ (cohesive)
- Then $|W \cap \bigcap_{i \in S} A_i| \geq \ell$
- **Question:** Is this property always satisfiable?

First Attempt

- For all $S \subseteq N$
- If $|S| \geq \ell \cdot n/k$ (large) and $|\bigcap_{i \in S} A_i| \geq \ell$ (cohesive)
- Then $|W \cap \bigcap_{i \in S} A_i| \geq \ell$

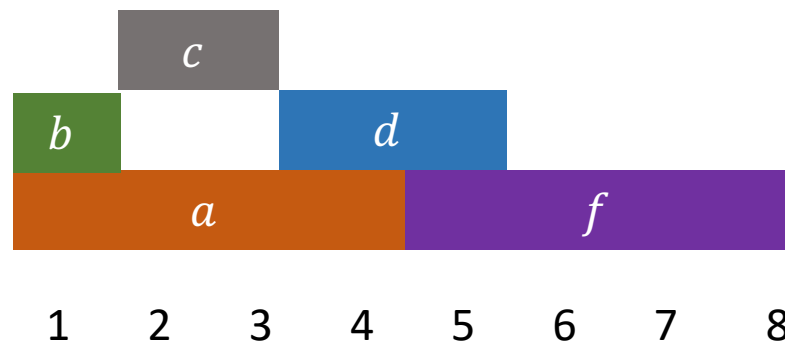
- $k=2$

c	b	c	b
a		d	
1	2	3	4

- $A_1 \cap A_2 = a$
- $A_2 \cap A_4 = b$
- $A_1 \cap A_3 = c$
- $A_3 \cap A_4 = d$

Justified Representation (JR)

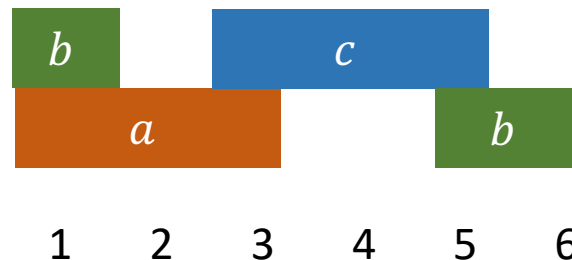
- **Definition:** W satisfies JR if
 - For all $S \subseteq N$
 - If $|S| \geq n/k$ (large) and $|\bigcap_{i \in S} A_i| \geq 1$ (cohesive)
 - Then $u_i(W) \geq 1$ for some $i \in S$
 - “If a group deserves one candidate and has a commonly approved candidate, then not every member should get 0 utility”
- **Question:** Find all the committees that satisfy JR for $k = 2$



Justified Representation (JR)

- **Definition:** W satisfies JR if
 - For all $S \subseteq N$
 - If $|S| \geq n/k$ (large) and $|\bigcap_{i \in S} A_i| \geq 1$ (cohesive)
 - Then $u_i(W) \geq 1$ for some $i \in S$
 - “If a group deserves one candidate and has a commonly approved candidate, then not every member should get 0 utility”
- **Question:** Can we ask $u_i(W) \geq 1$ for all $i \in S$?

➤ $k = 2$



Justified Representation (JR)

- Approval Voting violates JR

$k = 3$



24 voters



12 voters

1:	+24	+12
2:	+24	+12
3:	+24	+12

Justified Representation

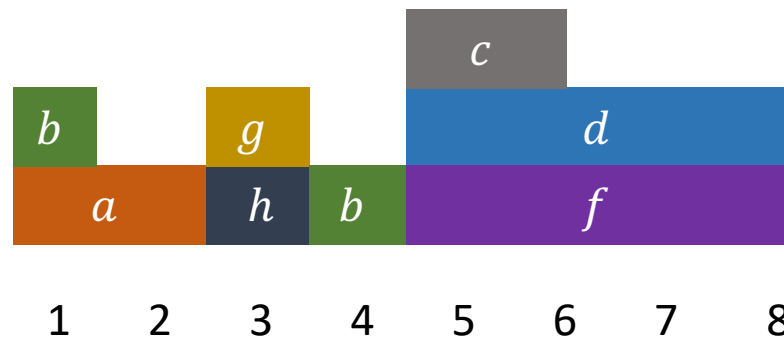
- **Theorem:** Chamberlin-Courant satisfies JR
- **Proof:**
 - Suppose CC selects W , which violates JR
 - Then, there is a group $S \subseteq N$ such that
 - $|S| \geq n/k$
 - No $i \in S$ is “covered” ($u_i(W) = 0 \forall i \in S$)
 - There is a candidate $c^* \in \cap_i A_i$
 - Since W covers less than n voters in total, some $c \in W$ covers (is approved by) less than n/k voters
 - Replacing c with c^* gives a new committee that covers strictly more voters, a contradiction to W already maximizing this metric!

Extended Justified Representation (EJR)

- **Definition:** W satisfies EJR if
 - For all $S \subseteq N$ and $\ell \in \{1, \dots, k\}$
 - If $|S| \geq \ell \cdot n/k$ (large) and $|\bigcap_{i \in S} A_i| \geq \ell$ (cohesive)
 - Then $u_i(W) \geq \ell$ for some $i \in S$
 - “If a group deserves ℓ candidates and has ℓ commonly approved candidates, then not every member should get less than ℓ utility”
 - JR imposes this but only for $\ell = 1$, so $\text{EJR} \Rightarrow \text{JR}$

Extended Justified Representation (EJR)

- **Question:** What is a committee that satisfies EJR? Is there a committee that satisfies EJR but not JR?



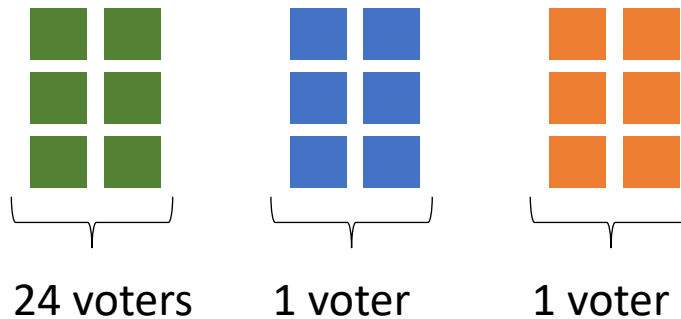
Extended Justified Representation (EJR)

- **Question:** What is the relationship between JR, EJR and proportionality in the case of party lists?
1. JR \Rightarrow party-list PR
 2. EJR \Rightarrow party-list PR
 3. None
 4. Both

Extended Justified Representation (EJR)

- Chamberlin-Courant violates EJR

$k = 3$



1:	+24	+1	+1
2:	+0	+0	+0
3:	+0	+0	+0

Extended Justified Representation (EJR)

- **Theorem [Aziz et al. (2016)]:** PAV satisfies EJR
- **Proof:**
- Suppose PAV selects W , which violates EJR
 - $PAV(W) = \sum_{i \in N} 1 + \frac{1}{2} + \dots + \frac{1}{u_i(W)}$
- Then, there is a group $S \subseteq N$ and $\ell \in \{1, \dots, k\}$ such that
 - $|S| \geq \ell \cdot n/k$
 - $u_i(W) < \ell, \forall i \in S$
 - $|\cap_{i \in S} A_i| \geq \ell \Rightarrow$ there exists $c^* \in \cap_{i \in S} A_i \setminus W$ (Why?)
- Consider $\tilde{W} = W \cup \{c^*\}$
 - $PAV(\tilde{W}) \geq PAV(W) + |S| \cdot \frac{1}{\ell} \geq PAV(W) + \frac{n}{k}$
- **Claim:** Can remove some $c \in \tilde{W}$ and lower score by $< \frac{n}{k}$

Extended Justified Representation (EJR)

- **Claim:** Can remove some $c \in \tilde{W}$ and lower score by $< \frac{n}{k}$

- **Proof:**

- Suffices to prove that average reduction across $c \in \tilde{W}$ is less than $\frac{n}{k}$

- Reduction when removing $c \in \tilde{W} = \sum_{i:c \in A_i} \frac{1}{u_i(\tilde{W})}$

- Average reduction:

$$\begin{aligned} \frac{1}{k+1} \cdot \sum_{c \in \tilde{W}} \sum_{i:c \in A_i} \frac{1}{u_i(\tilde{W})} &= \frac{1}{k+1} \cdot \sum_{i \in N} \sum_{c \in A_i \cap \tilde{W}} \frac{1}{u_i(\tilde{W})} \\ &= \frac{1}{k+1} \cdot \sum_{i \in N} 1 \\ &= \frac{n}{k+1} < \frac{n}{k} \end{aligned}$$

Computation of PAV

- Computing PAV is NP-complete
- What about a greedy approximation?
 - Sequential PAV
 - $W \leftarrow \emptyset$
 - **while** $|W| < k$ **do**
 - Find c which maximizes $PAV(W \cup \{c\})$
 - $W \leftarrow W \cup \{c\}$
 - Achieves at least $\left(1 - \frac{1}{e}\right)$ fraction of optimal PAV score
 - PAV score is a submodular function
 - But fails to satisfy EJR

Computation of PAV

- In practice, exact PAV solution can be computed via a BILP

- **Binary variables:**

- $y_c \rightarrow$ Is candidate c selected?
- $x_{i,\ell} \rightarrow$ Is $u_i(\{c: y_c = 1\}) \geq \ell$?

- Maximize $\sum_{i \in N} \sum_{\ell=1}^k \frac{1}{\ell} \cdot x_{i,\ell}$

subject to $\sum_{\ell=1}^k x_{i,\ell} = \sum_{c \in A_i} y_c$ for all i

$$\sum_c y_c = k$$

$$y_c, x_{i,\ell} \in \{0,1\} \text{ for all } i, \ell, c$$

← Why does this work?

Is EJR enough?

$$k = 12$$

			c_9	c_{12}	c_{15}
c_4	c_5	c_6	c_8	c_{11}	c_{14}
$c_1 - c_3$			c_7	c_{10}	c_{13}
1	2	3	4	5	6

Fully Justified Representation (FJR)

- **Definition:** W satisfies FJR if
 - For all $S \subseteq N, T \subseteq M$ and $\beta \in \{1, \dots, k\}$
 - If $|S| \geq |T| \cdot n/k$ (large) and $u_i(T) \geq \beta, \forall i \in S$ (cohesive)
 - Then $u_i(W) \geq \beta$ for some $i \in S$
 - “If a group deserves ℓ candidates and can propose a set of ℓ candidates from which each member gets at least β utility, then not every member should get less than β utility”
 - EJR imposes this but only for $\beta = |T|$, which would imply $T \subseteq \bigcap_{i \in S} A_i$, so we just wrote $|\bigcap_{i \in S} A_i| \geq \ell$
 - FJR \Rightarrow EJR
- **Bad news:** PAV (and every other known “natural” rule) violates FJR

Fully Justified Representation (FJR)

- FJR is satisfiable via a simple polynomial-time greedy rule
- **Greedy Cohesive Rule (GCR):**
 - $W \leftarrow \emptyset$
 - $N^a \leftarrow N$ (“active voters”)
 - **while** $\exists \beta > 0, S \subseteq N^a, T \subseteq M \setminus W$
s.t. $|S| \geq |T| \cdot \frac{n}{k}$ and $\min_{i \in S} u_i(T) \geq \beta$ **do**
 - Pick such (β, S, T) with the highest β (break ties arbitrarily)
 - $W \leftarrow W \cup T, N^a \leftarrow N^a \setminus S$
 - **return** W
- Greedily find the most cohesive group of voters and add their suggested group of candidates

Fully Justified Representation (FJR)

- **Theorem[Peters et al. (2022)]:** Greedy Cohesive Rule satisfies FJR
- **Proof:**
 - Suppose for contradiction that Greedy Cohesive Rule does not satisfy FJR
 - Then, there is a group $S \subseteq N, T \subseteq M$ and $\beta \in \{1, \dots, k\}$ such that
 - $|S| \geq |T| \cdot n/k$ and $u_i(T) \geq \beta, \forall i \in S$
 - $u_i(W) < \beta, \forall i \in S$
 - Let i^* be the first agent in S that was removed from N^a as part of the group S' and subcommittee T' , with $\min_{i \in S'} u_i(T') \geq \beta'$
 - Just before S' is chosen, S was available since i^* is the first agent in S that that was removed from N^a
 - From the definition of the algorithm, this means $\min_{i \in S'} u_i(T') \geq \min_{i \in S} u_i(T) \Rightarrow \beta' \geq \beta$
 - But since $T' \subseteq W$, we get $\beta > u_{i^*}(W) \geq u_{i^*}(T') \geq \beta'$ which is a contradiction

Is FJR enough?

$$k = 12$$

c_5			c_9	c_{12}	c_{15}
c_4		c_6	c_8	c_{11}	c_{14}
$c_1 - c_3$			c_7	c_{10}	c_{13}
1	2	3	4	5	6

Core

- **Definition:** W satisfies core if
 - For all $S \subseteq N$ and $T \subseteq M$
 - If $|S| \geq |T| \cdot n/k$ (large)
 - Then $u_i(W) \geq u_i(T)$ for some $i \in S$
 - “If a group can afford T , then T should not be a strict Pareto improvement for the group”
 - FJR only imposes $\max_{i \in S} u_i(W) \geq \min_{i \in S} u_i(T)$, so core \Rightarrow FJR
- **Major open question**
 - For ABC voting, does there always exist a committee in the core?

Notes

- Other fairness definitions
 - EJR+, SJR, AJR, PJR, PRJ+, UJR, CS, proportionality degree, ...
 - See [Justified Representation wiki](#) for more details

