

# Monotone Randomized Apportionment

**Ulrike Schmidt-Kraepelin**

(TU Eindhoven)



**José Correa**

(U Chile)



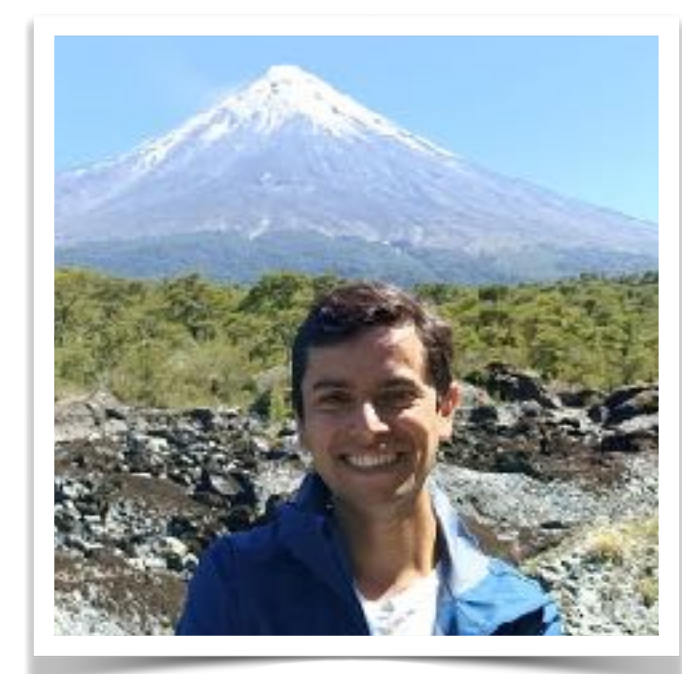
**Paul Gözl**

(UC Berkeley)



**Jamie Tucker-Foltz**

(Harvard)



**Victor Verdugo**

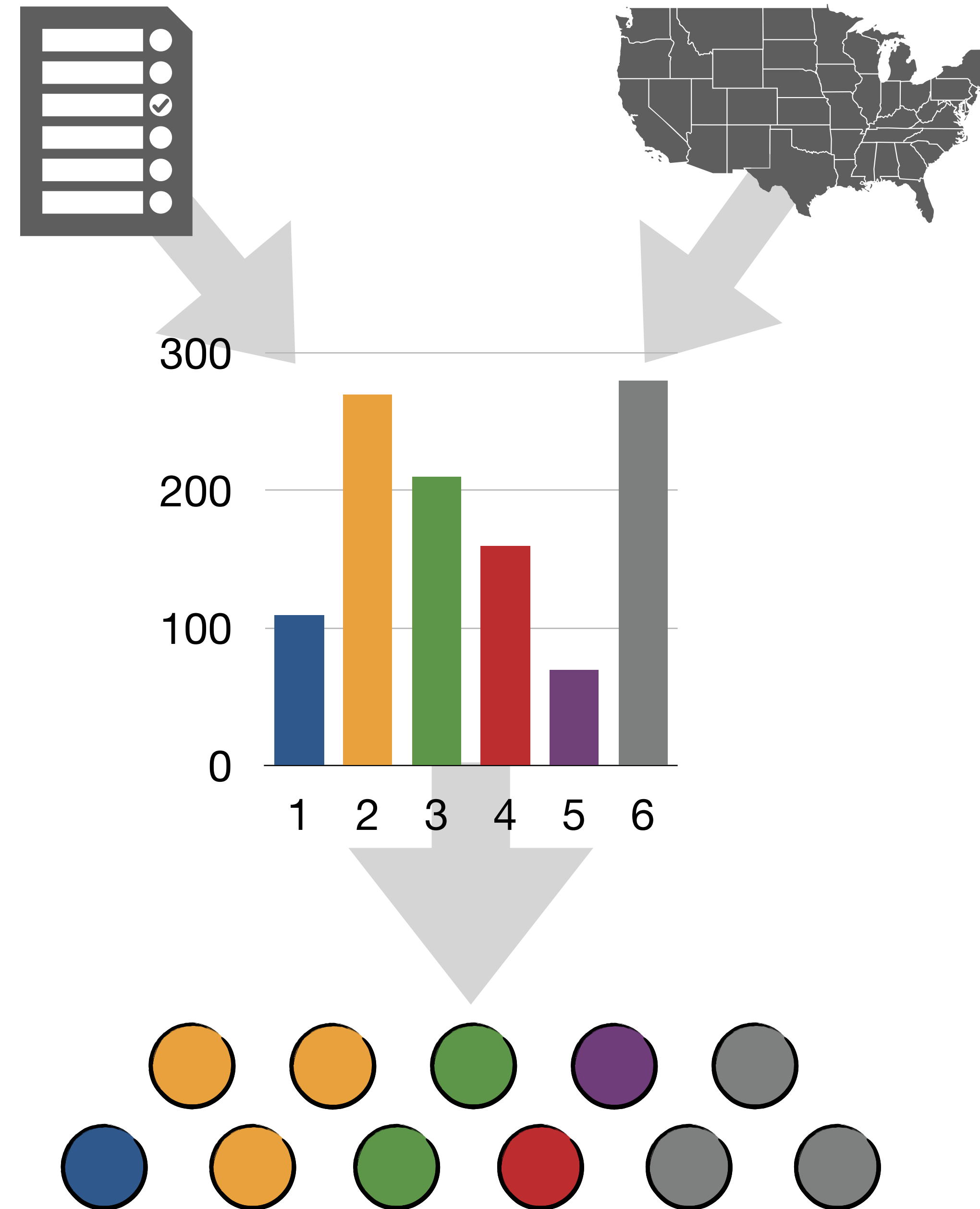
(UC Chile)

# Apportionment

Let  $n$  be the number of **parties**.

**Input:** **vote count** vector  $\vec{v} \in \mathbb{R}^n$ , **house size**  $h$

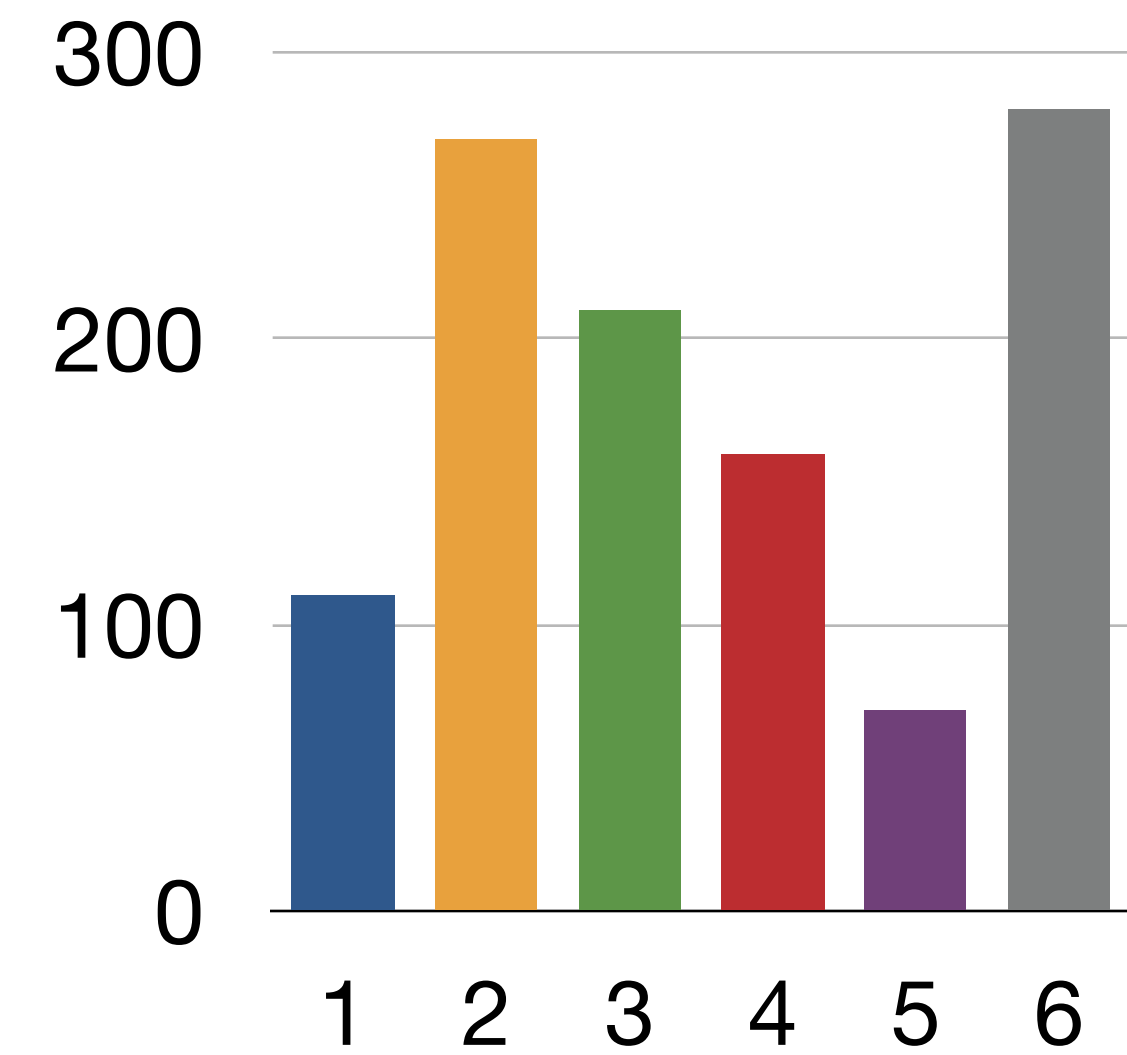
**Output:** **allocation** vector  $\vec{a} \in \mathbb{N}^n$  summing to  $h$



# Quota

The **quota** of party  $i \in [n]$  is  $q_i = \frac{v_i}{\sum_{j \in [n]} v_j} h$ .

An apportionment rule satisfies the **quota** axiom, if  $\lfloor q_i \rfloor \leq a_i \leq \lceil q_i \rceil$  holds for all parties.

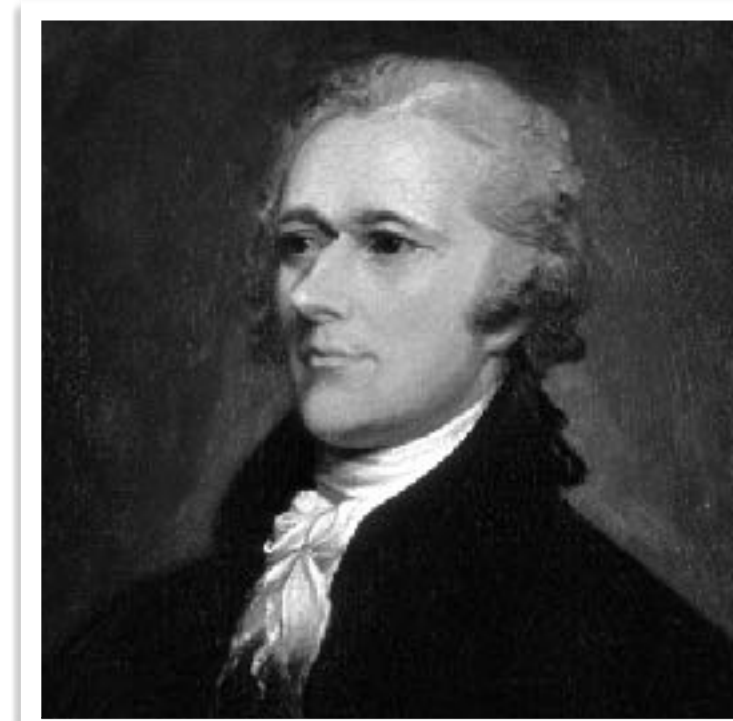


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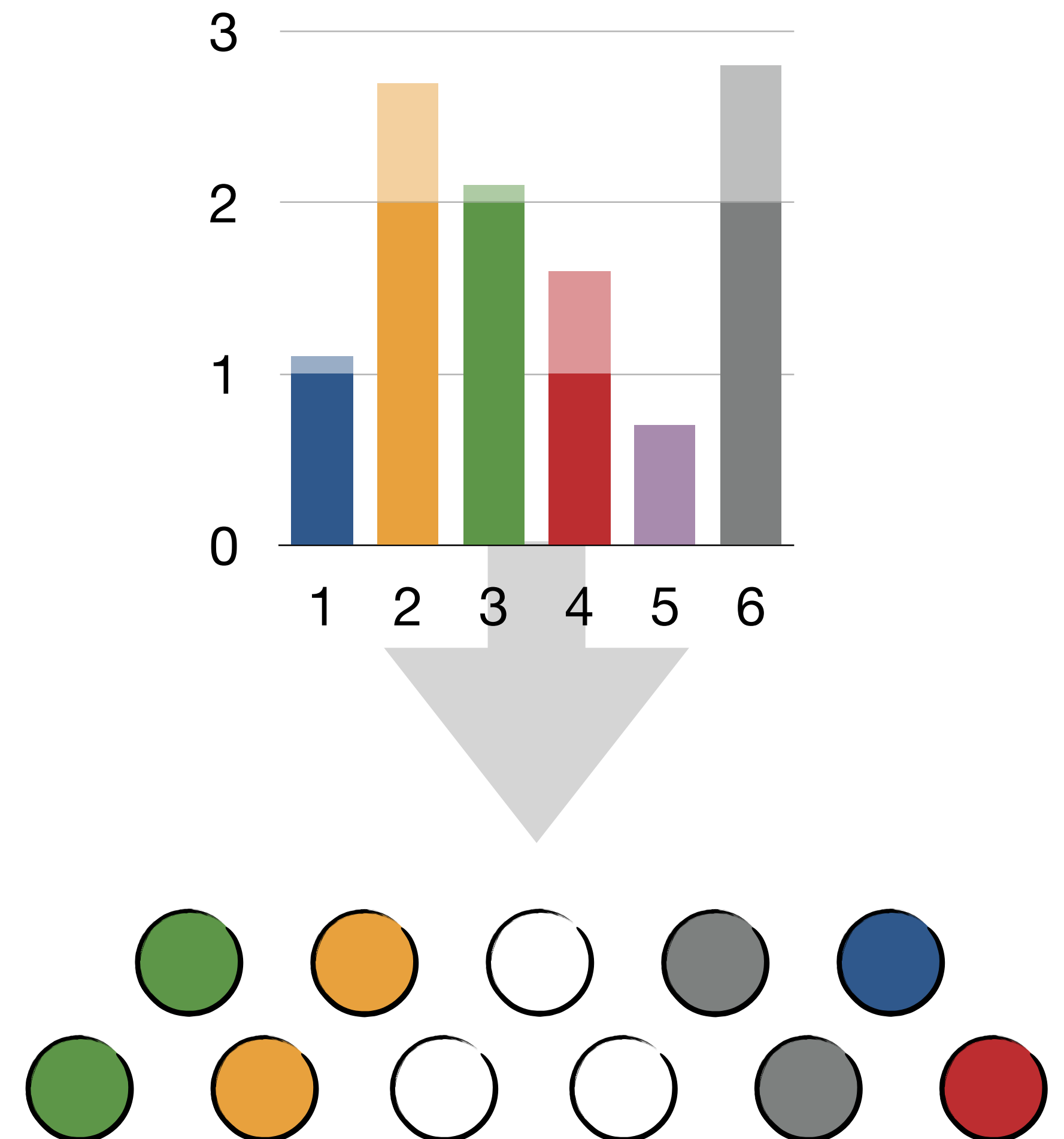
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**Hamilton's method:** First allocate  $\lfloor q_i \rfloor$  to every party. Then, allocate remaining seats by largest residues, i.e.,  $q_i - \lfloor q_i \rfloor$ .



Alexander Hamilton

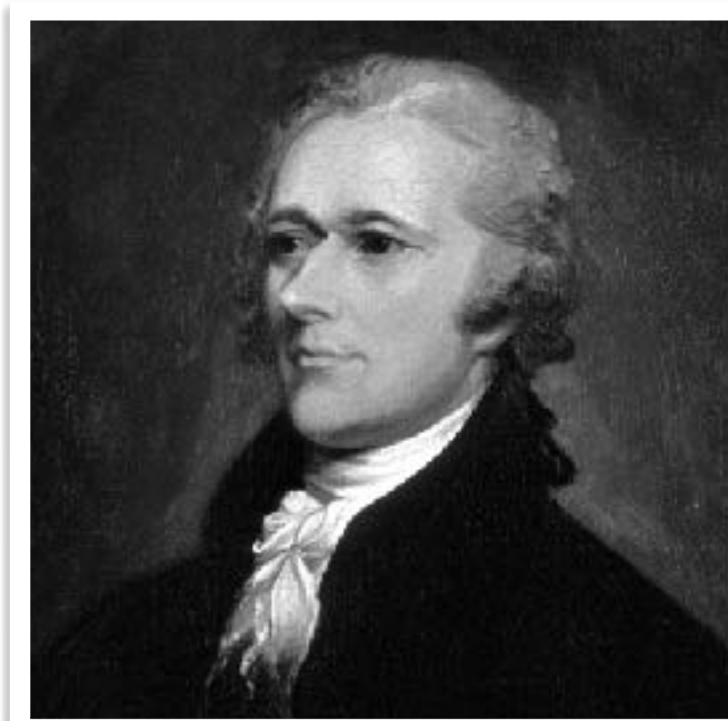


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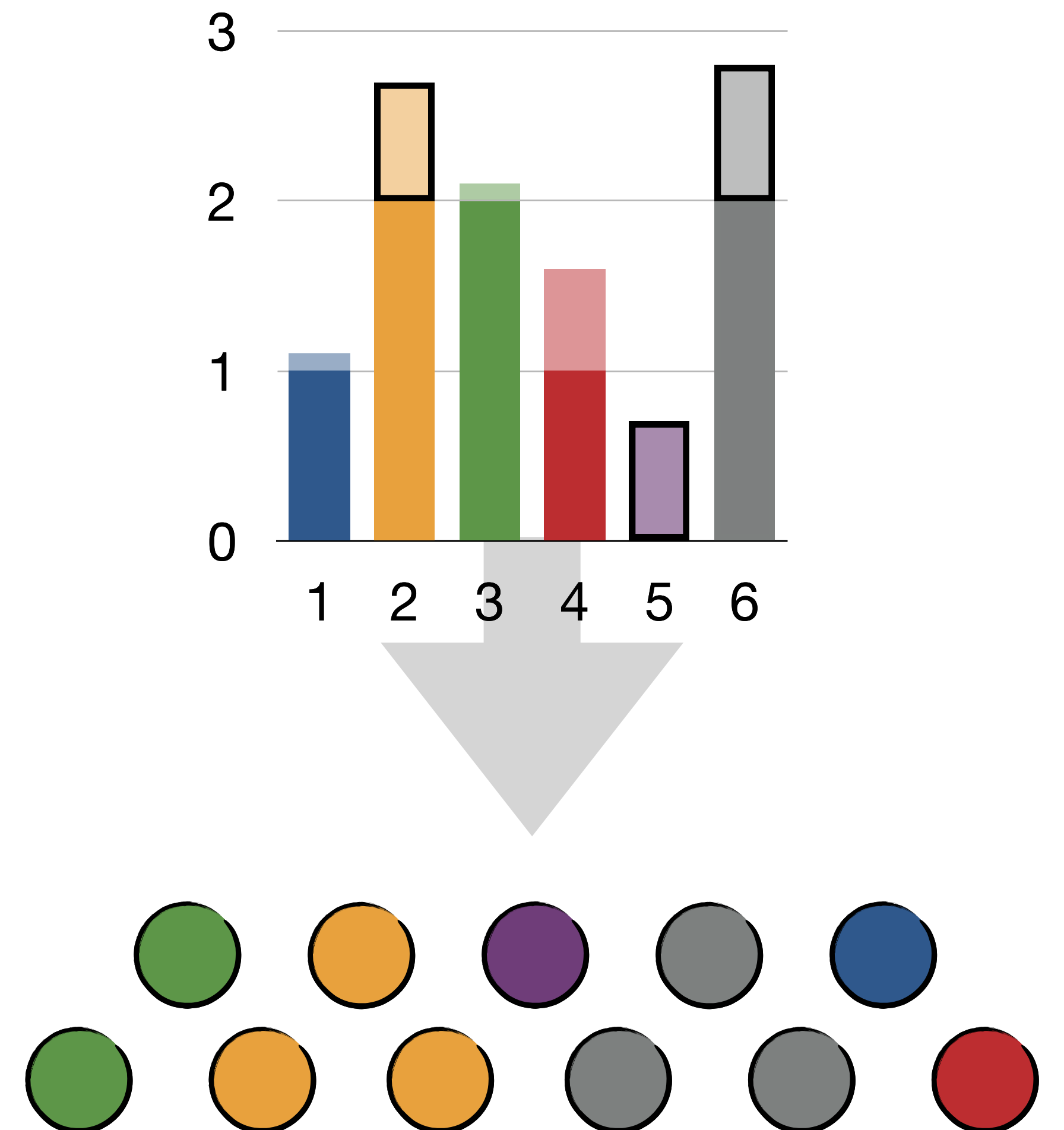
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# Population Monotonicity

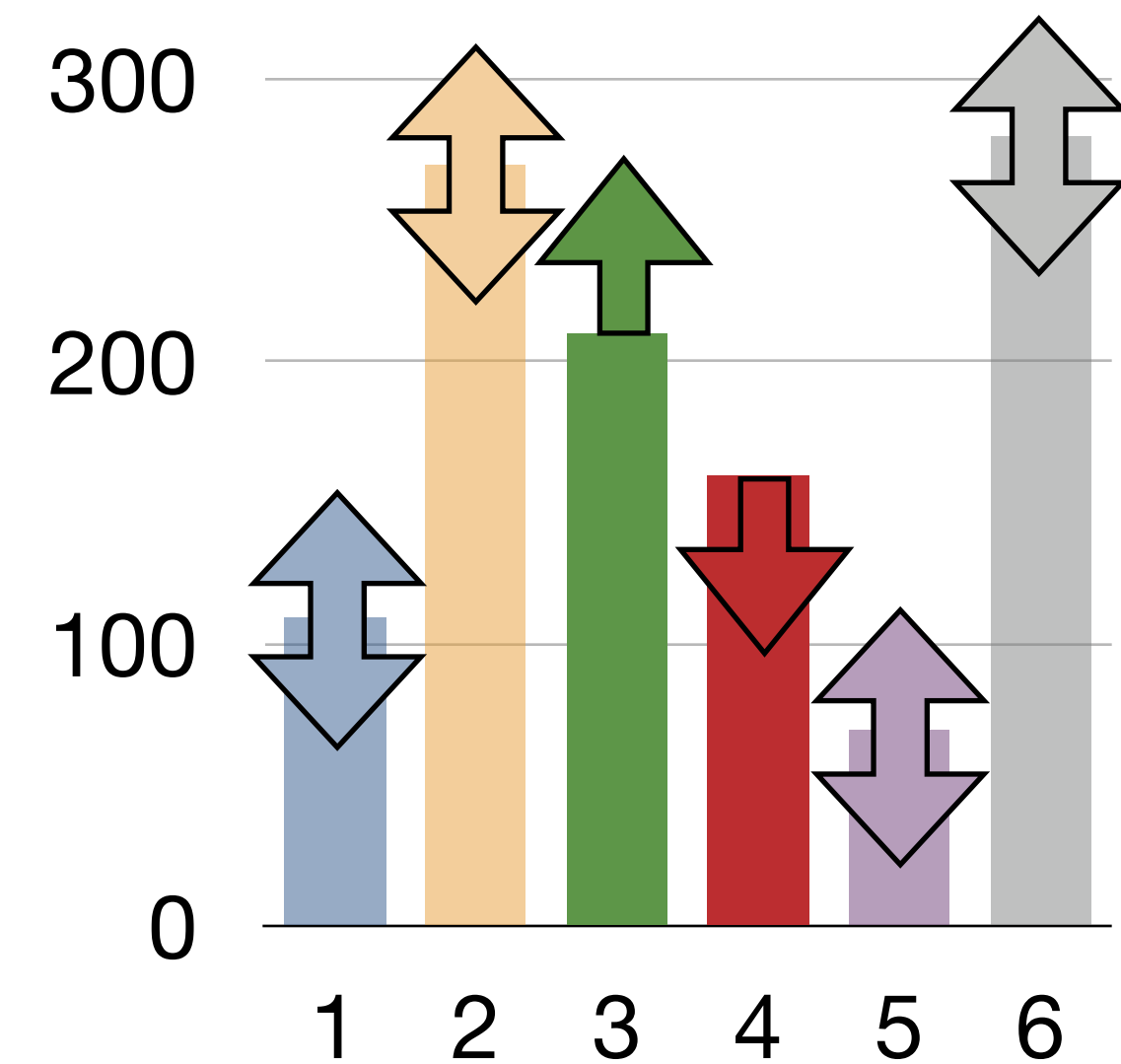
An apportionment rule is **population monotone**

if for every vote count vectors  $v$  and  $v'$  with

- $v'_i > v_i$  and  $v'_j < v_j$  it **does not** hold that
- $a'_i < a_i$  and  $a'_j > a_j$ .

**Impossibility (Balinski and Young, 1982):**

There exists no apportionment rule that satisfies **quota** and is **population monotone**.



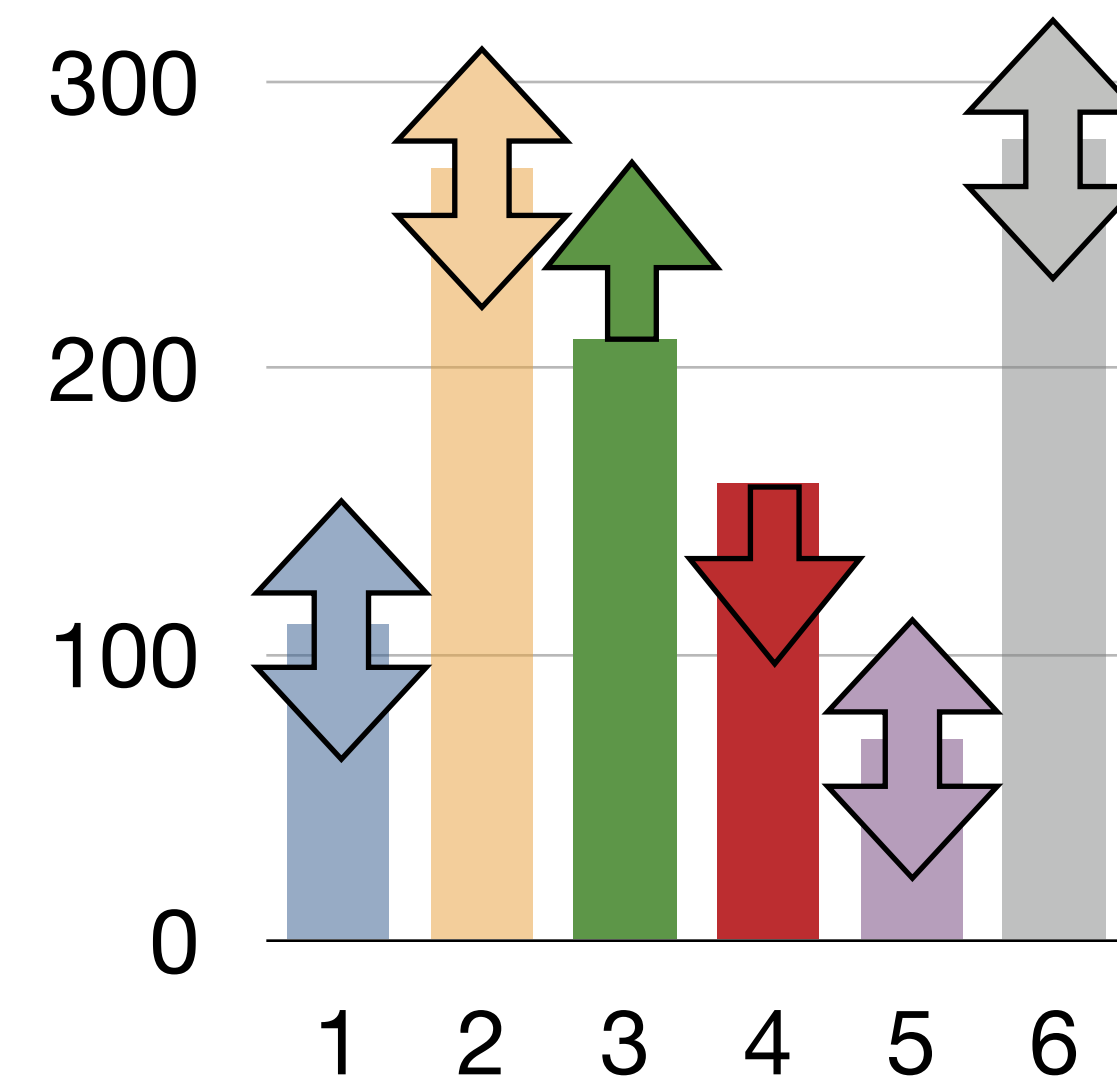
# Randomized Apportionment

[Grimmett 04]

**Goal:** randomized apportionment rule satisfying

- **ex-ante proportionality**, i.e.,  $\mathbb{E}[a_i] = q_i$
- **ex-post quota**, i.e.,  $\lfloor q_i \rfloor \leq a_i \leq \lceil q_i \rceil$

**Observation:** An apportionment rule satisfying **ex-ante proportionality** also satisfies **ex-ante population monotonicity**.



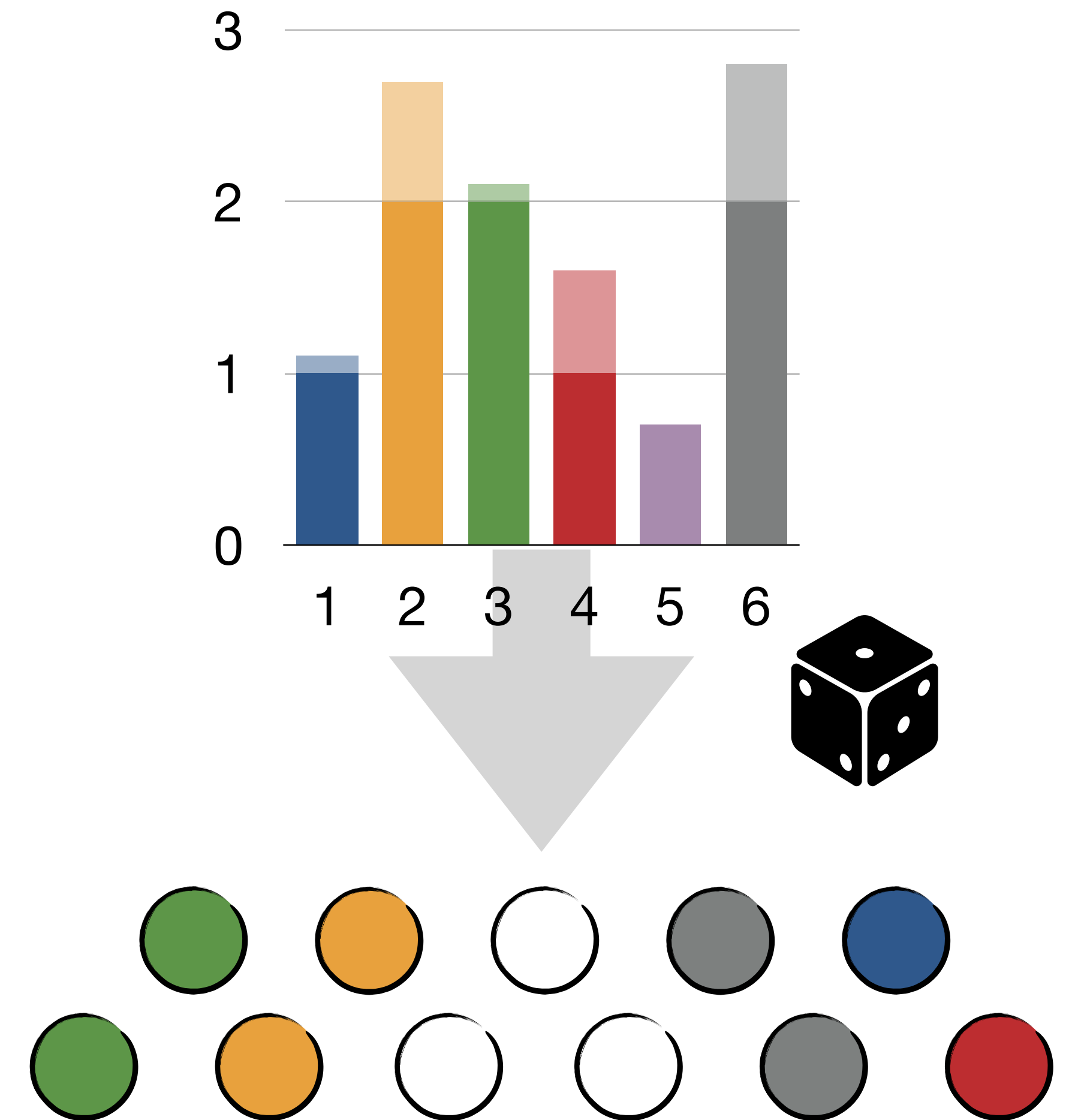
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**Idea:** Give every party  $\lfloor q_i \rfloor$  seats and one additional seat with **probability**  $p_i = q_i - \lfloor q_i \rfloor$ .





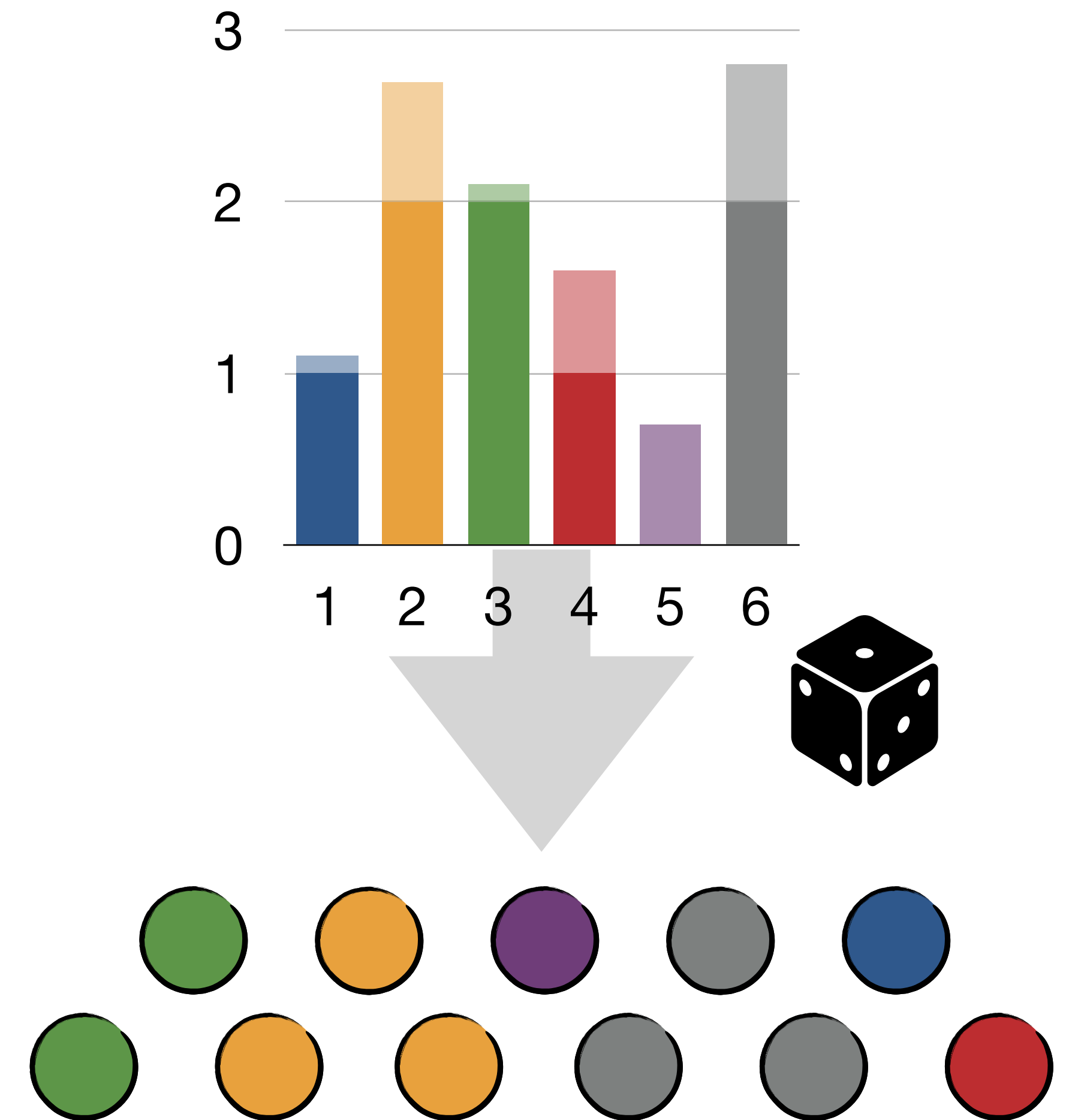
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# Randomized Apportionment

[Grimmett 04]

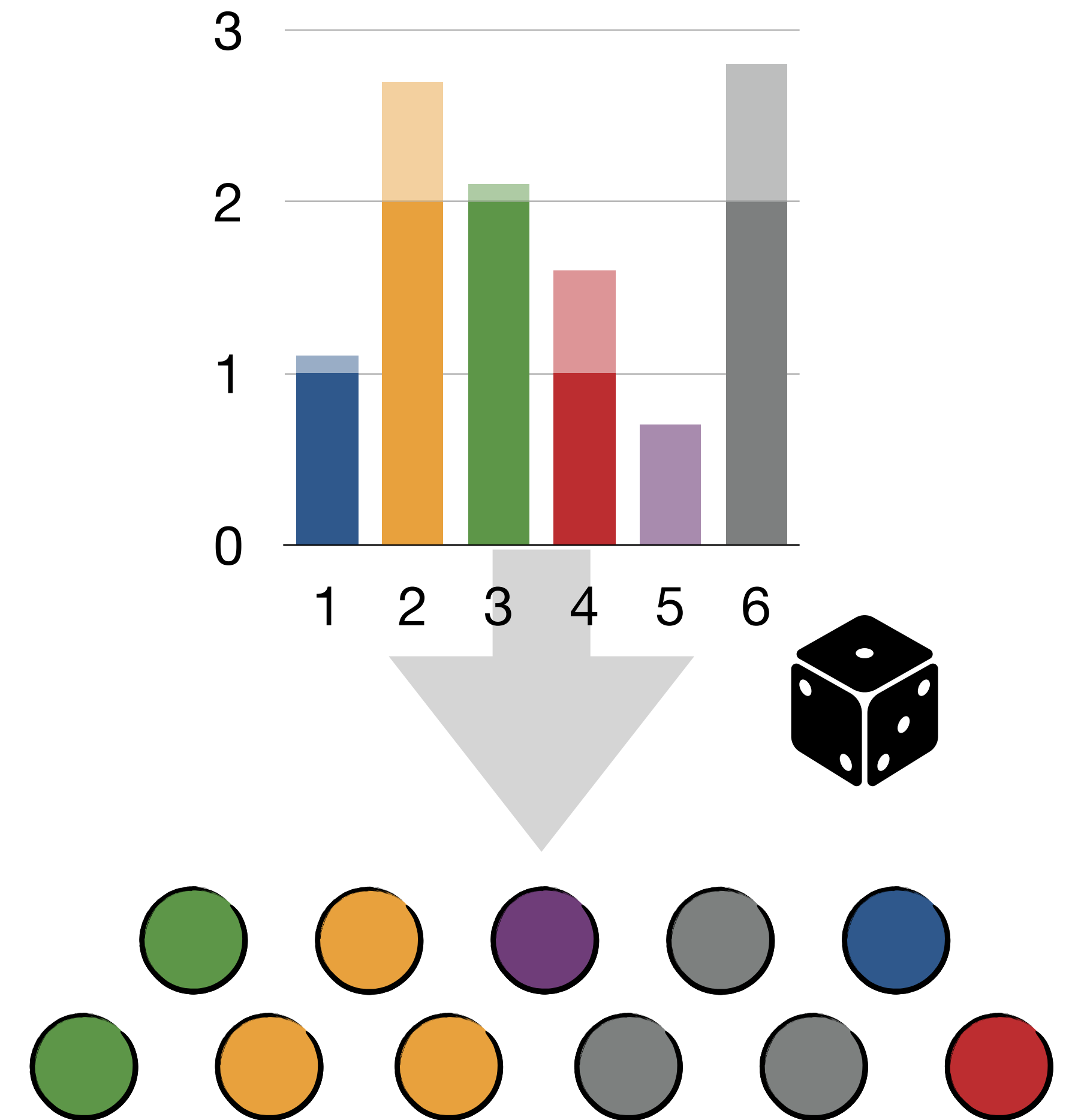
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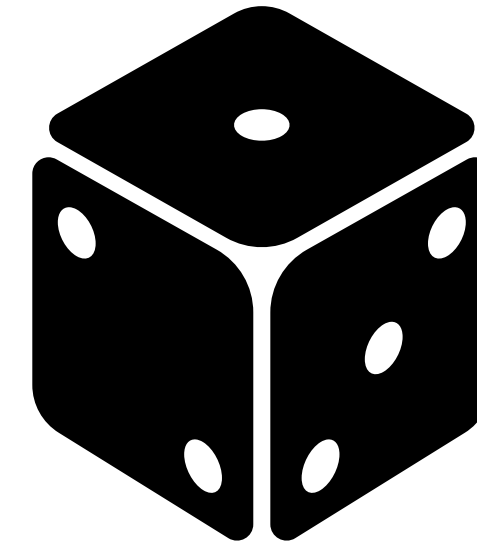
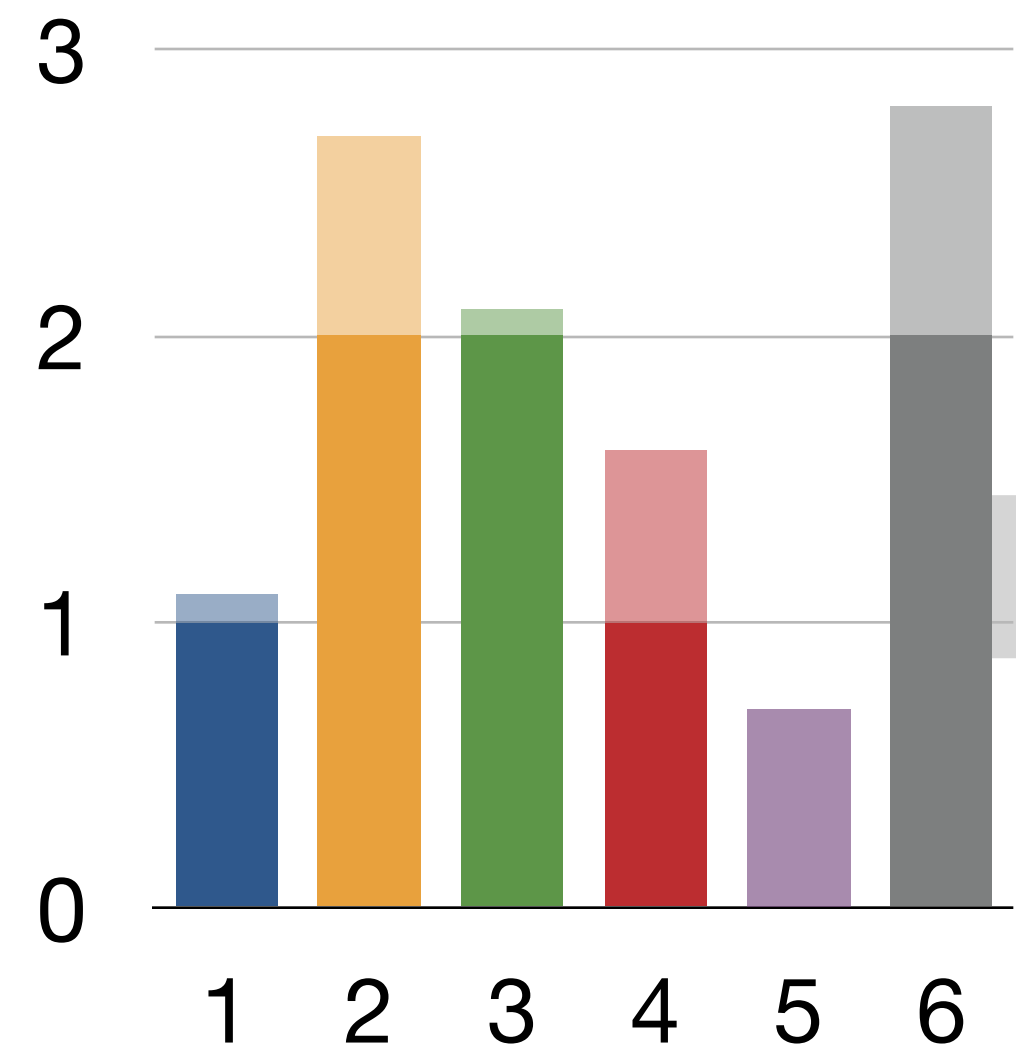
A **rounding rule** maps residues  $\vec{p} \in [0,1)^n$  to a **random set**  $S \subset [n]$  of size  $k := \sum_{i \in [n]} p_i$  such that:

$$\mathbb{P}[i \in S] = p_i$$

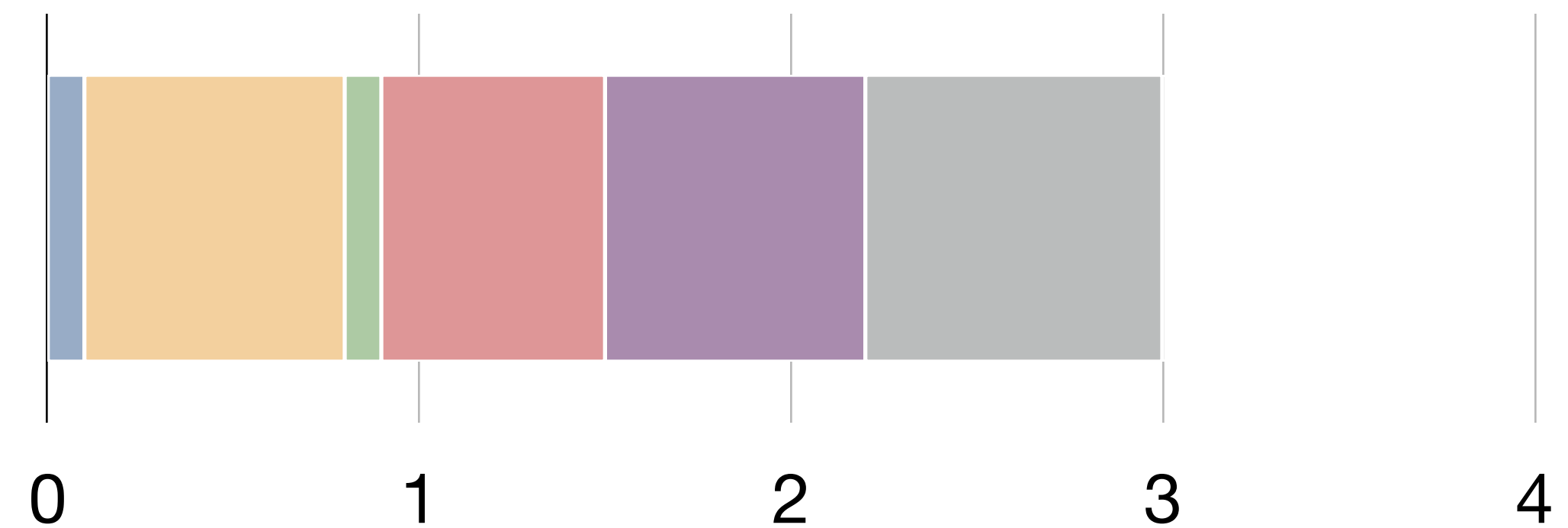


# Grimmett's Rounding Rule

[Grimmett 04]

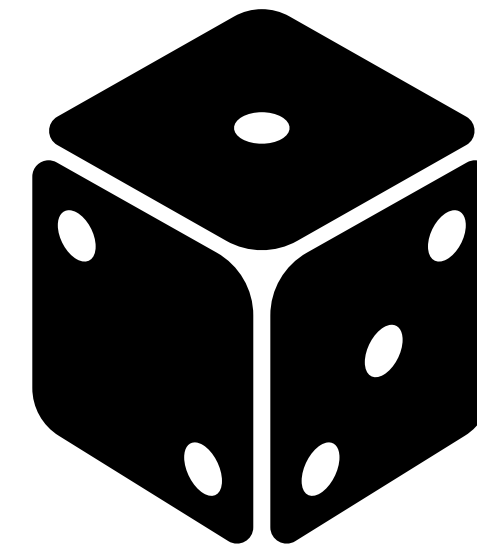
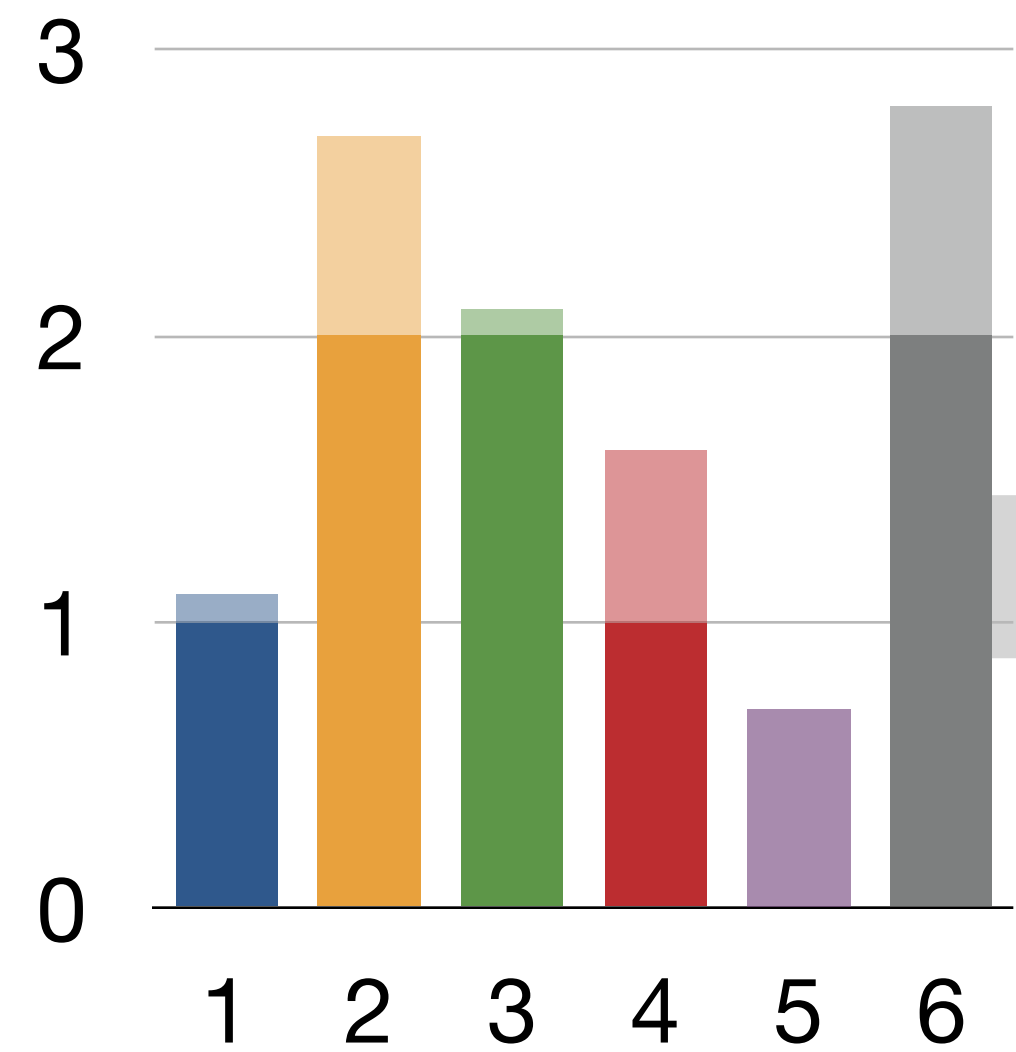


$$u \sim U(0,1)$$

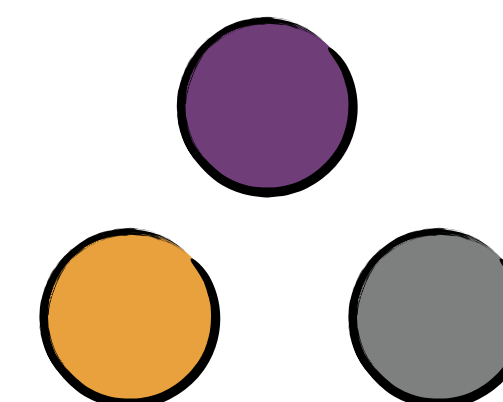
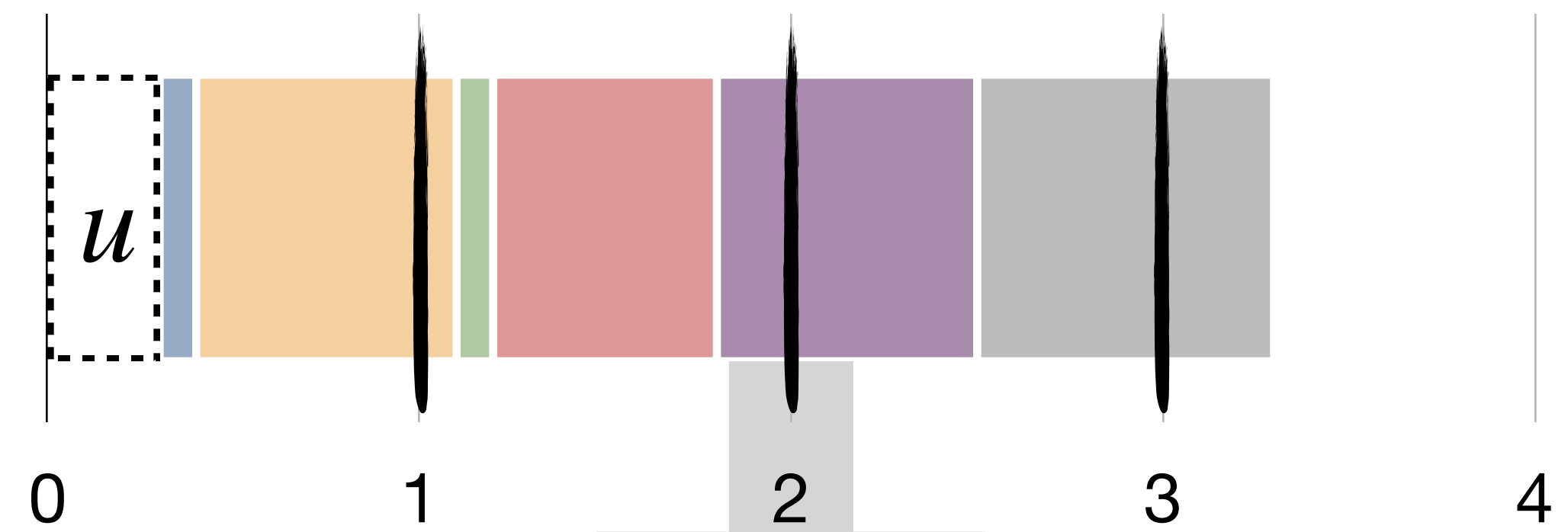


# Grimmett's Rounding Rule

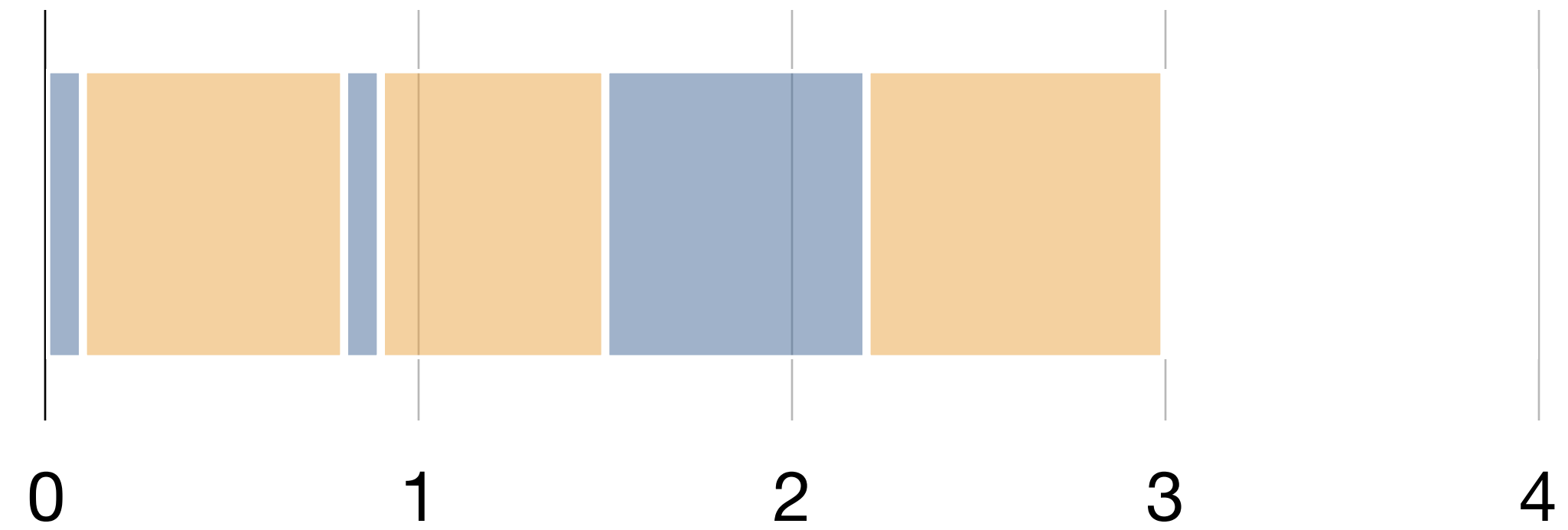
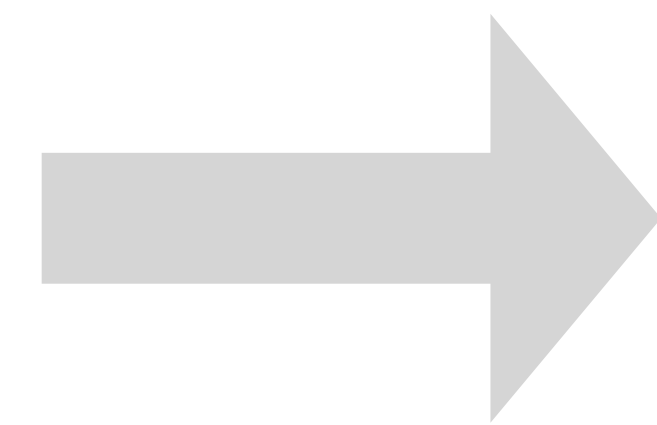
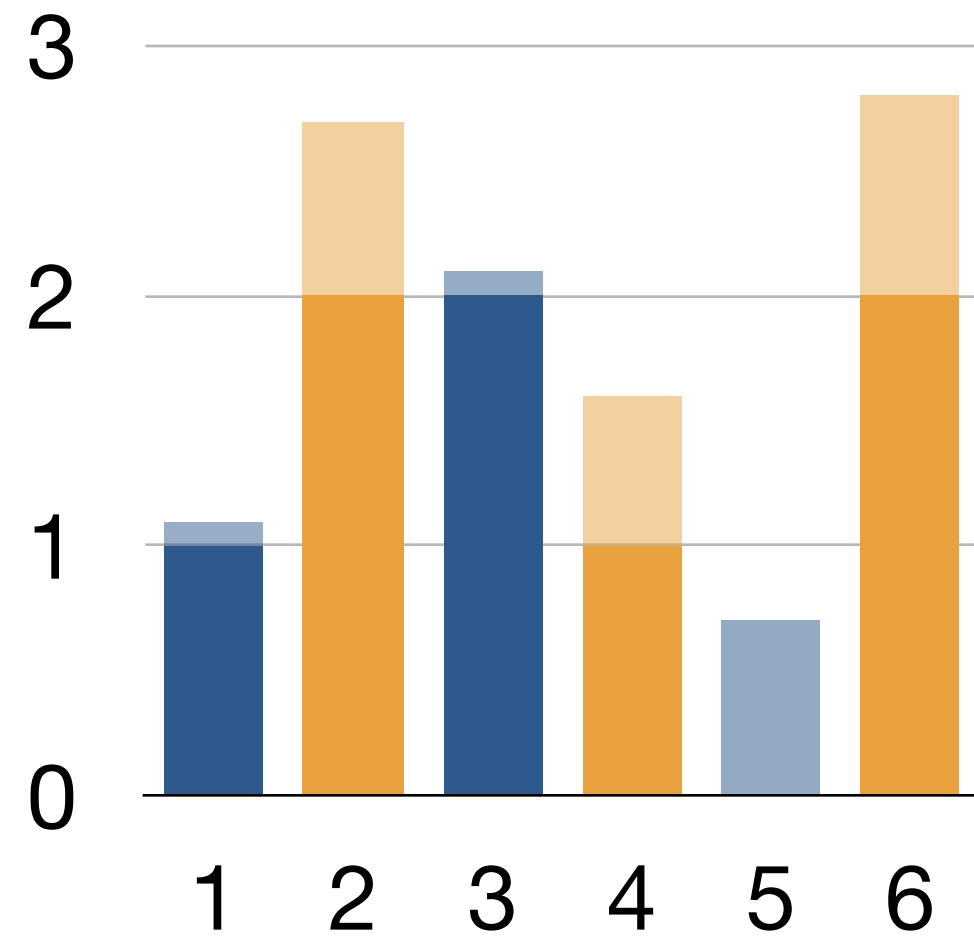
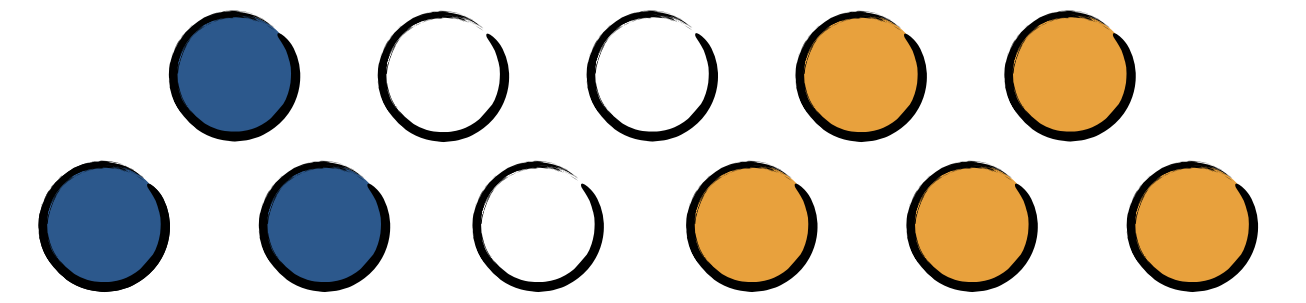
[Grimmett 04]



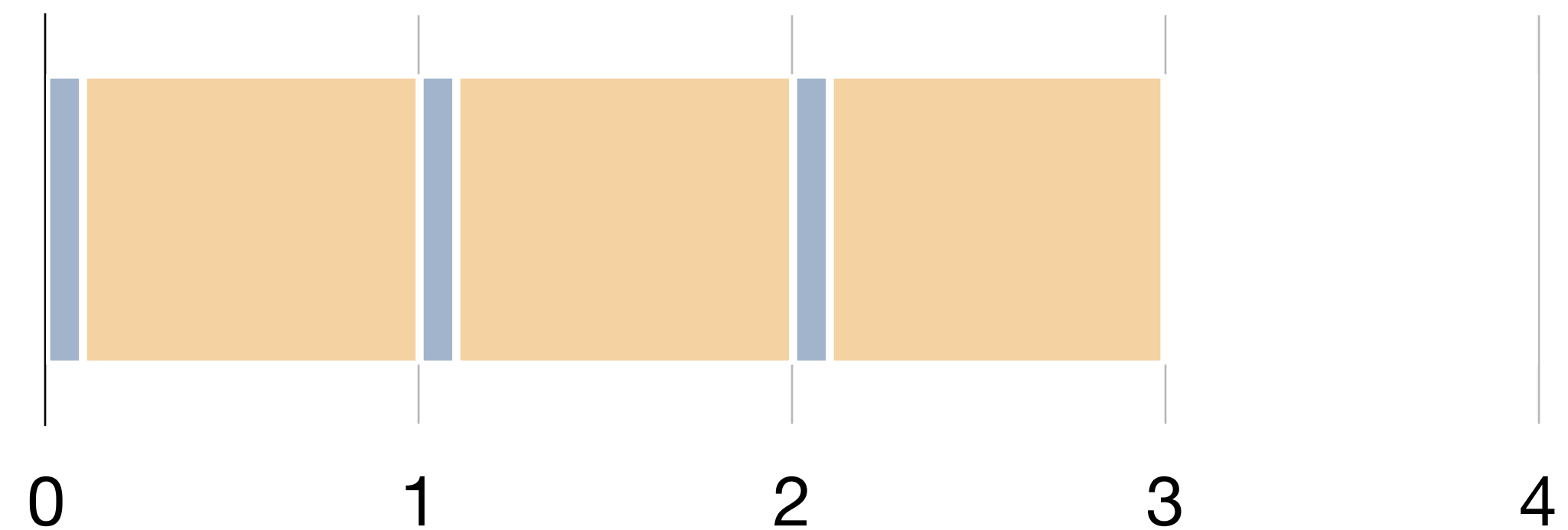
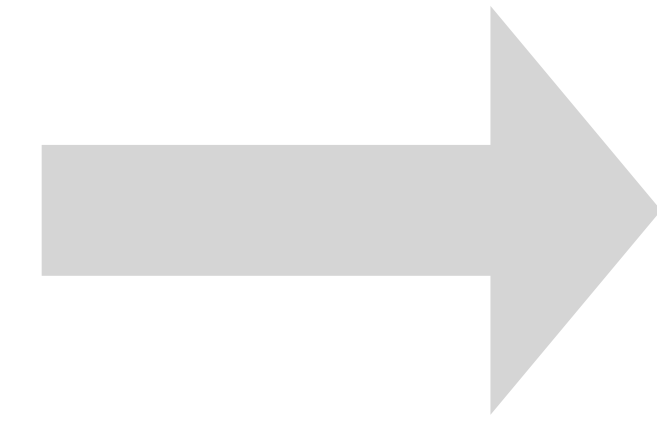
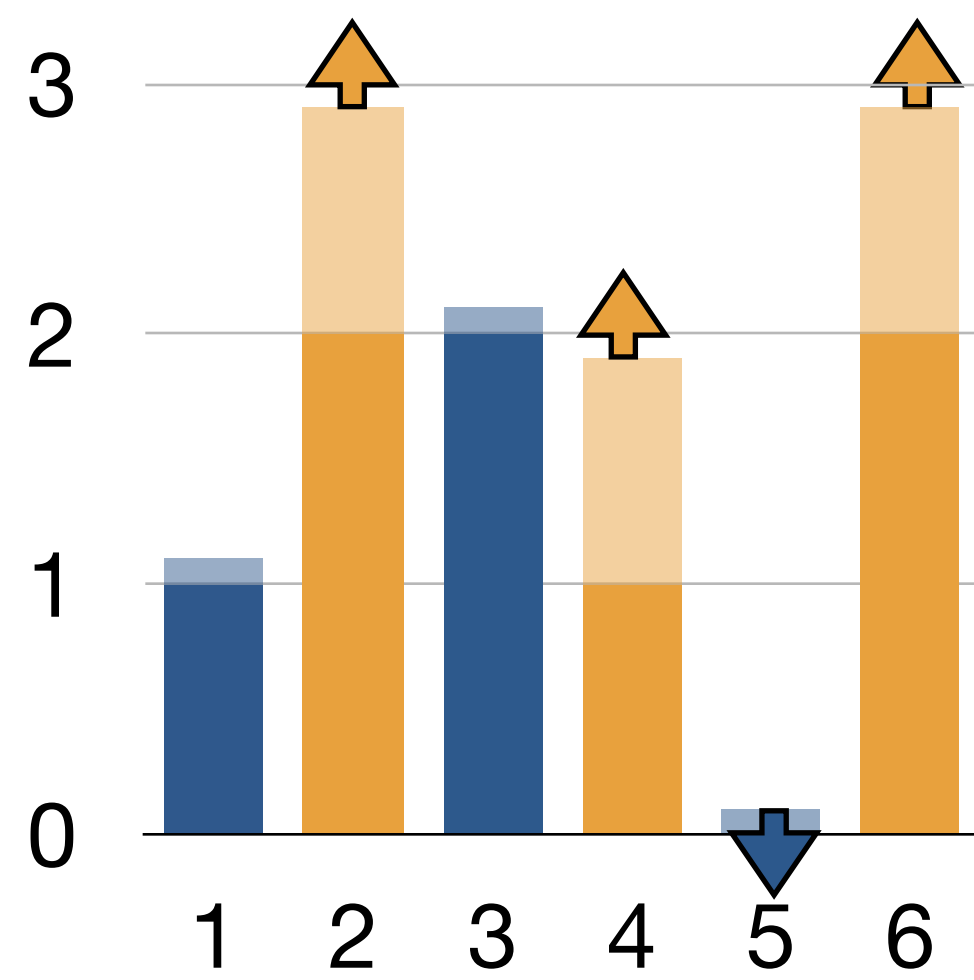
$$u \sim U(0,1)$$



# A New Apportionment Paradox



$$\mathbb{P}[\bullet \bullet \bullet] = 0$$



$$\mathbb{P}[\bullet \bullet \bullet] = 0.1$$

# Monotone Rounding Rules



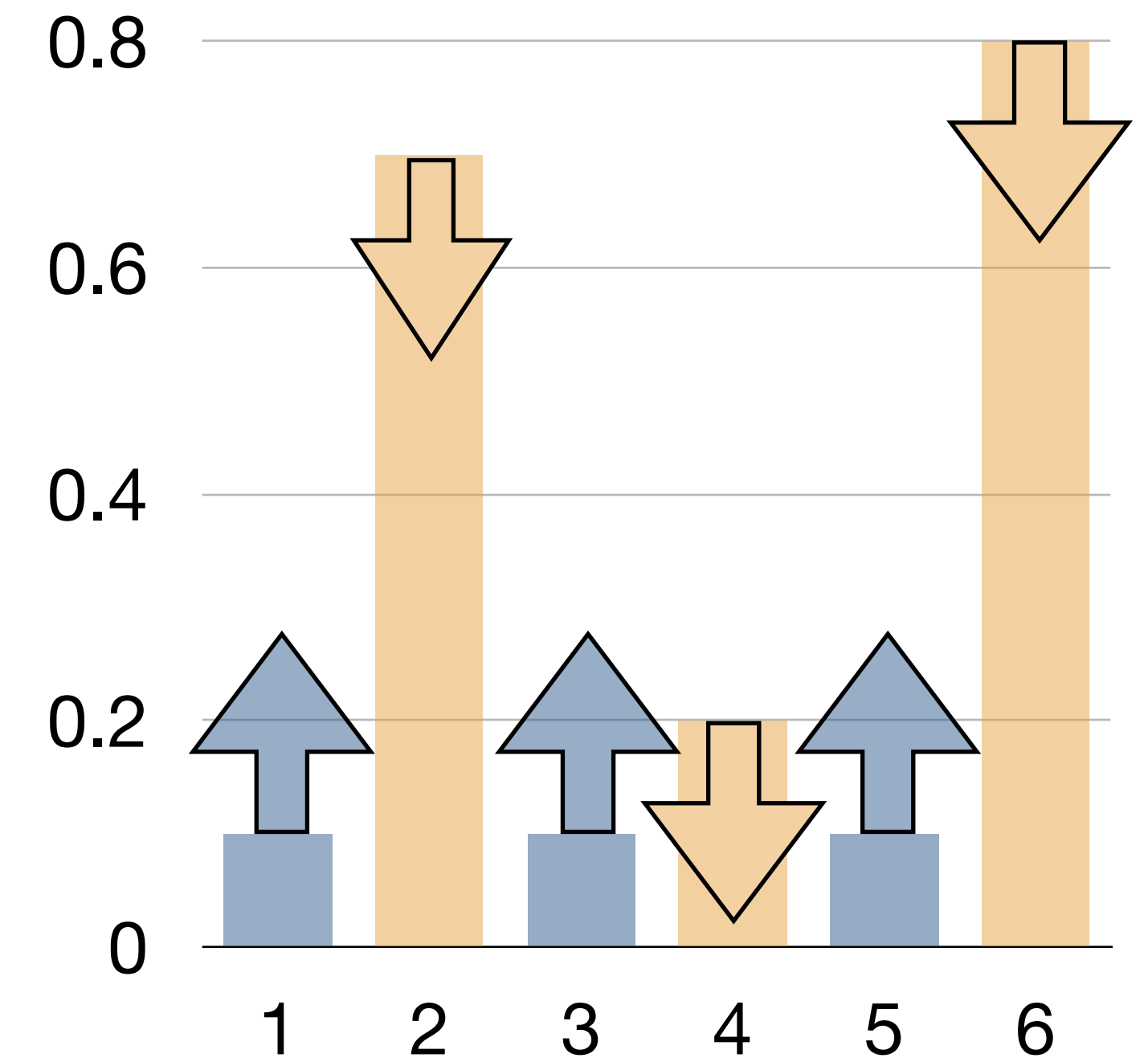
# Selection Monotonicity

Let  $\vec{p}$  and  $\vec{p}'$  be two residue vectors summing to  $k$  and  $T$  be a coalition of  $k$  parties such that

- $p'_i \geq p_i$  for  $i \in T$ , and
- $p'_i \leq p_i$  for  $i \notin T$ .

A rounding rule satisfies **selection monotonicity** if

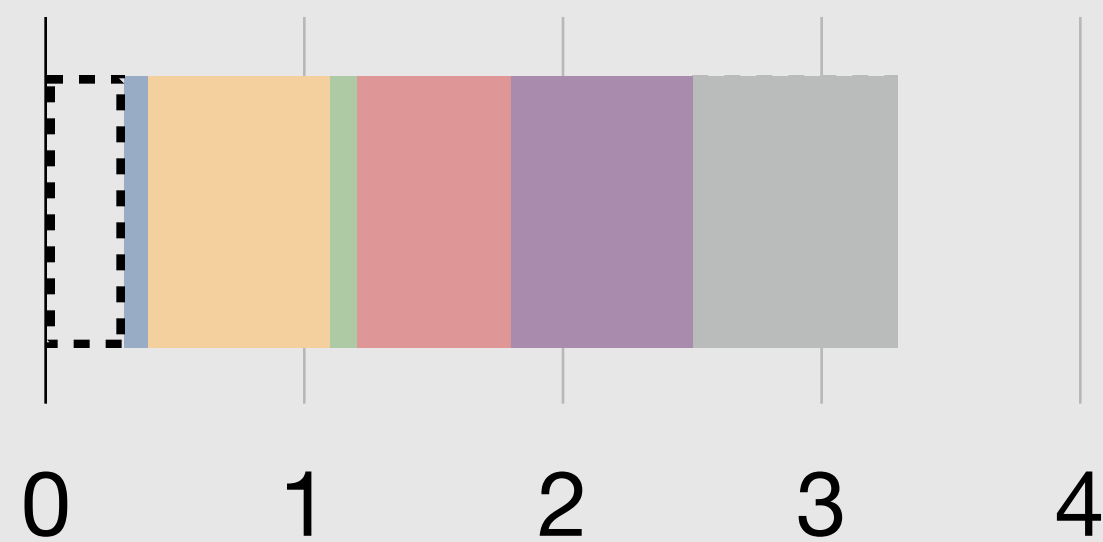
$$\mathbb{P}[S' = T] \geq \mathbb{P}[S = T].$$



*If a  $k$ -sized coalition gains residues, their **joint selection probability** may not decrease.*

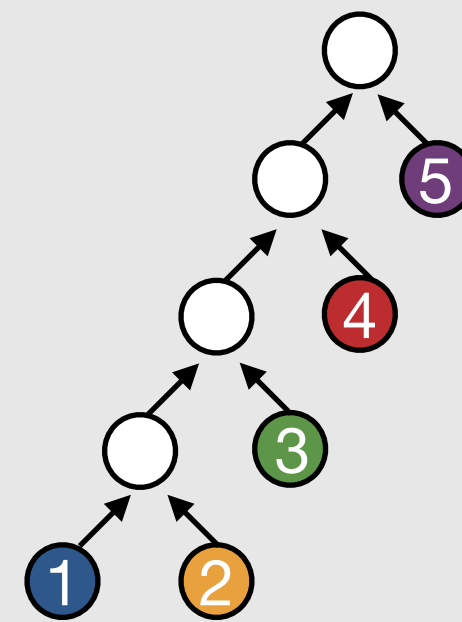
# Rounding Rules Violating Selection Monotonicity

**Grimmett's**  
(systematic rounding)



[Grimmett 04, Madow 49]

**Pipage**  
(pivotal method)



[Deville/Tillee 98, Srinivasan 01]

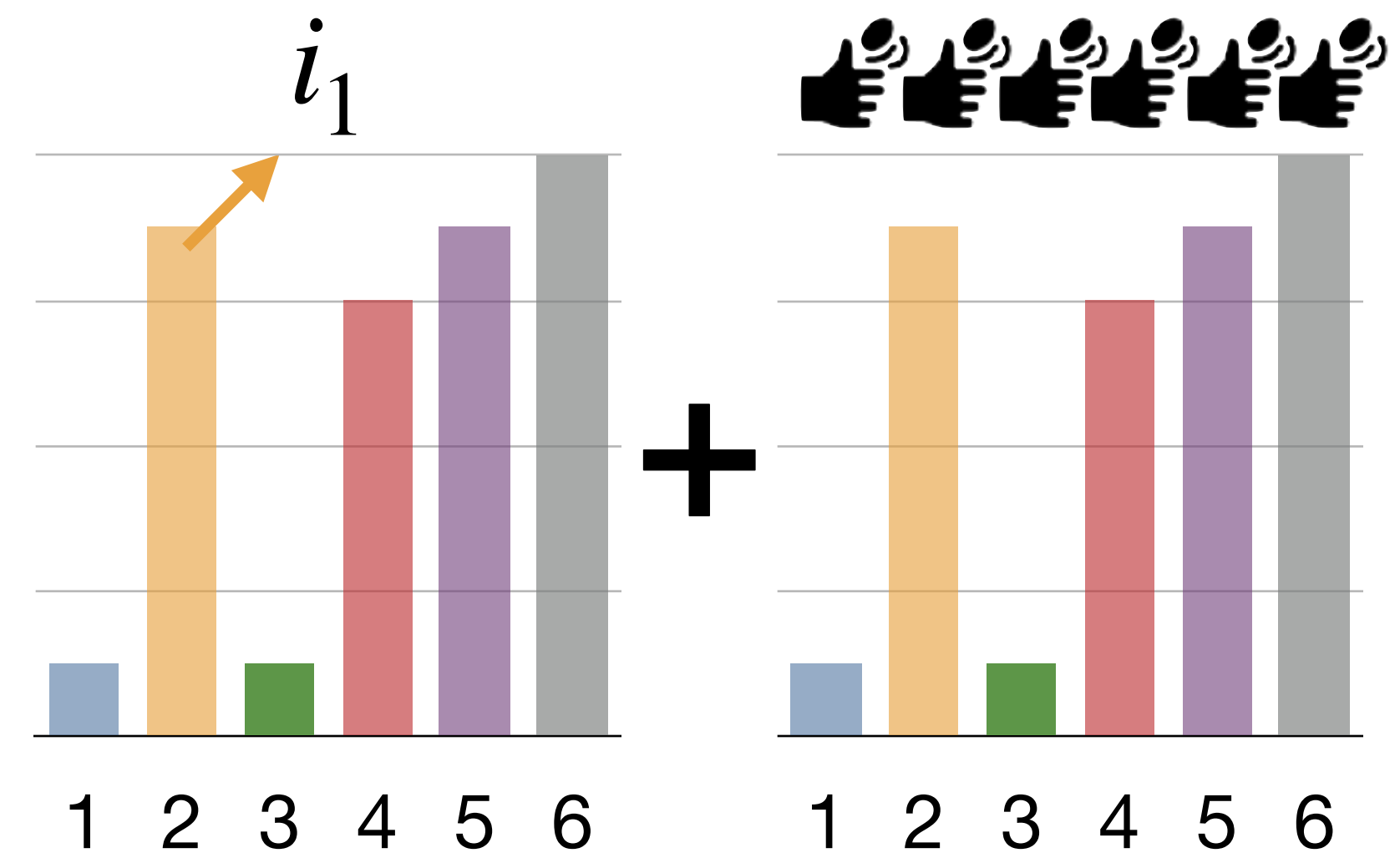
**Conditional Poisson**  
(maximum entropy)

$$\Pr[S = T] = \prod_{i \in T} \pi_i$$

[Chen/Dempster/Liu 94]

# Sampford Sampling

1. Sample  $i_1$  from  $[n]$  with probability  $\propto p_i$
2. For every  $i \in [n]$ , perform Bernoulli trial with success probability  $p_i$
3. If we observed  $k - 1$  **successes** and a **failure** for  $i_1$  return. Else, start over.



$$f(A) = \sum_{i \in A} (1 - p_i) \prod_{j \in A} p_j \prod_{j \notin A} (1 - p_j)$$

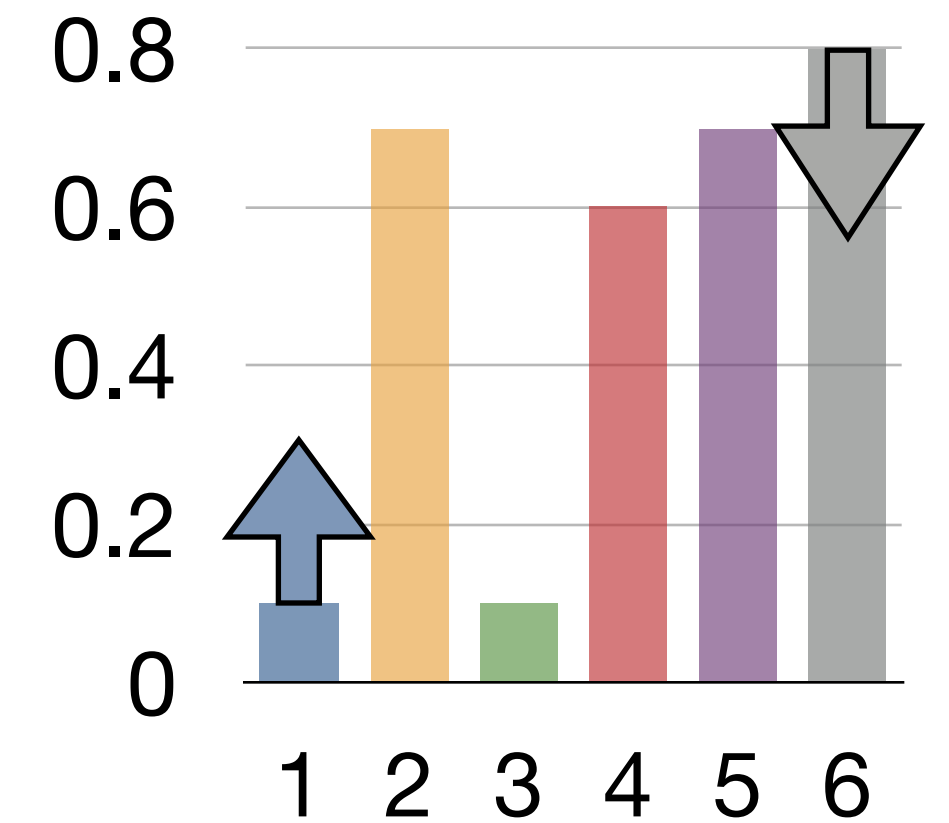
$$\Pr[S = T] = \frac{f(T)}{\sum_{A \in \binom{[n]}{k}} f(A)}$$

# Magic Lemma

$$\Pr[S = T] = \frac{f(T)}{\sum_{A \in \binom{[n]}{k}} f(A)}$$

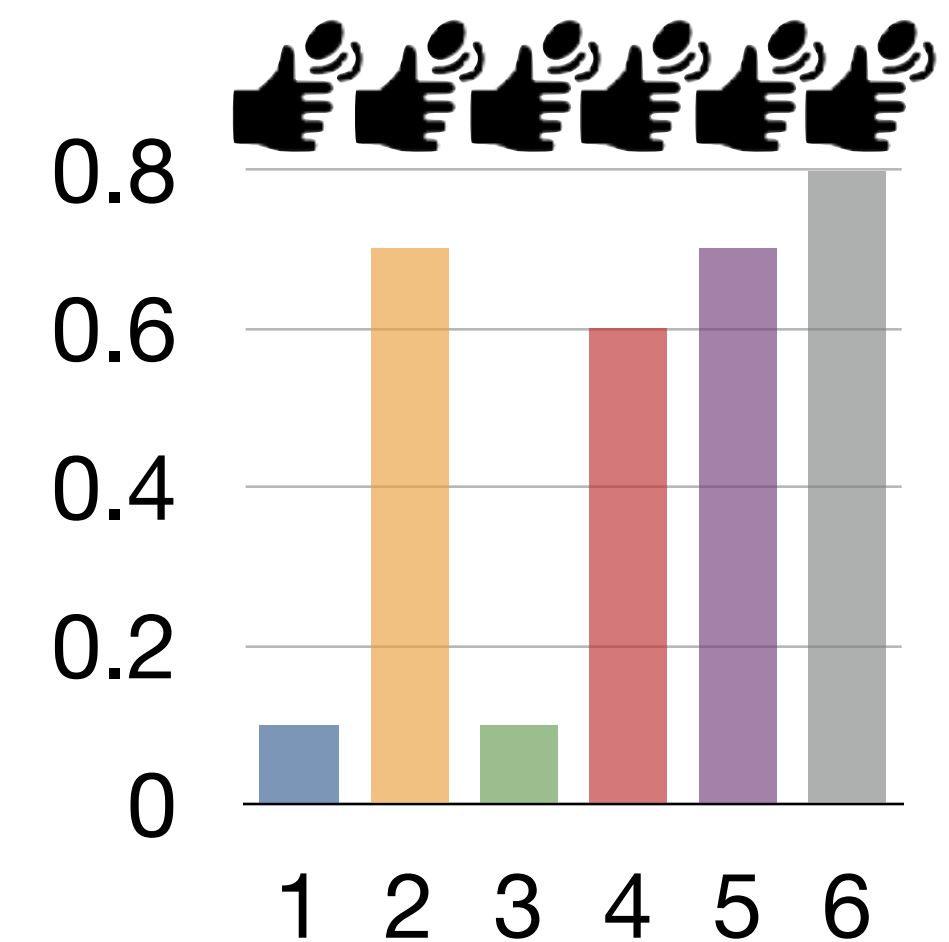
**Observation:** To prove selection monotonicity, it suffices to show that for any  $\vec{p} \in [0,1)^n$  summing to  $k$  and  $T = [k]$  it holds that:

$$\left( \frac{\partial}{\partial p_1} - \frac{\partial}{\partial p_n} \right) P[S = T] \geq 0.$$



**Magic Lemma:** Let  $B$  be the random set containing each  $i \in [n]$  independently with probability  $p_i$ . Then,

$$\sum_{A \in \binom{[n]}{k}} f(A) = \frac{1}{2} \mathbb{E} [ B - k ].$$



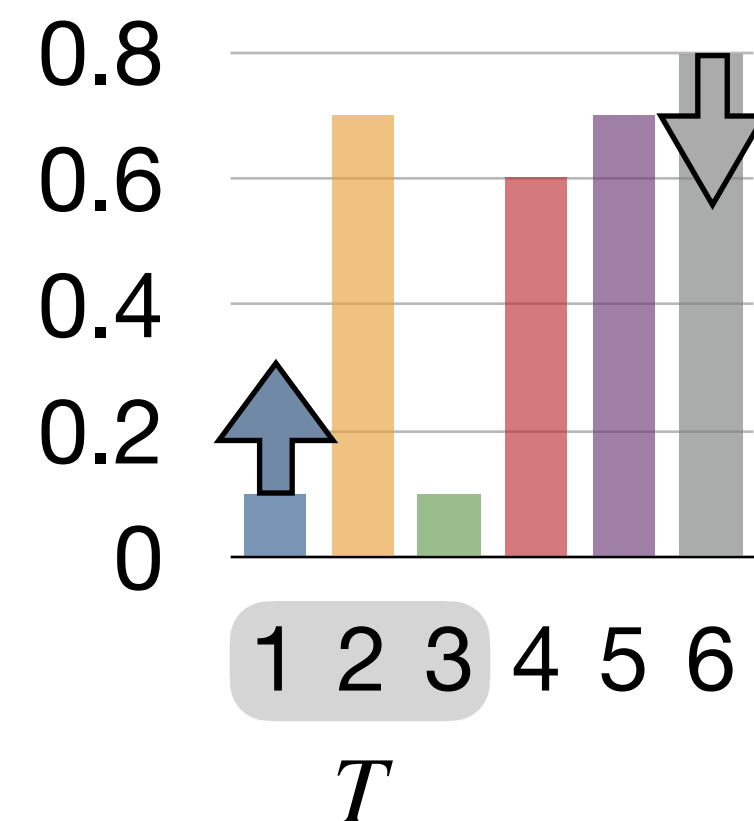
# Sampford Sampling is Selection Monotone

**Main Result:** Sampford sampling is selection monotone.

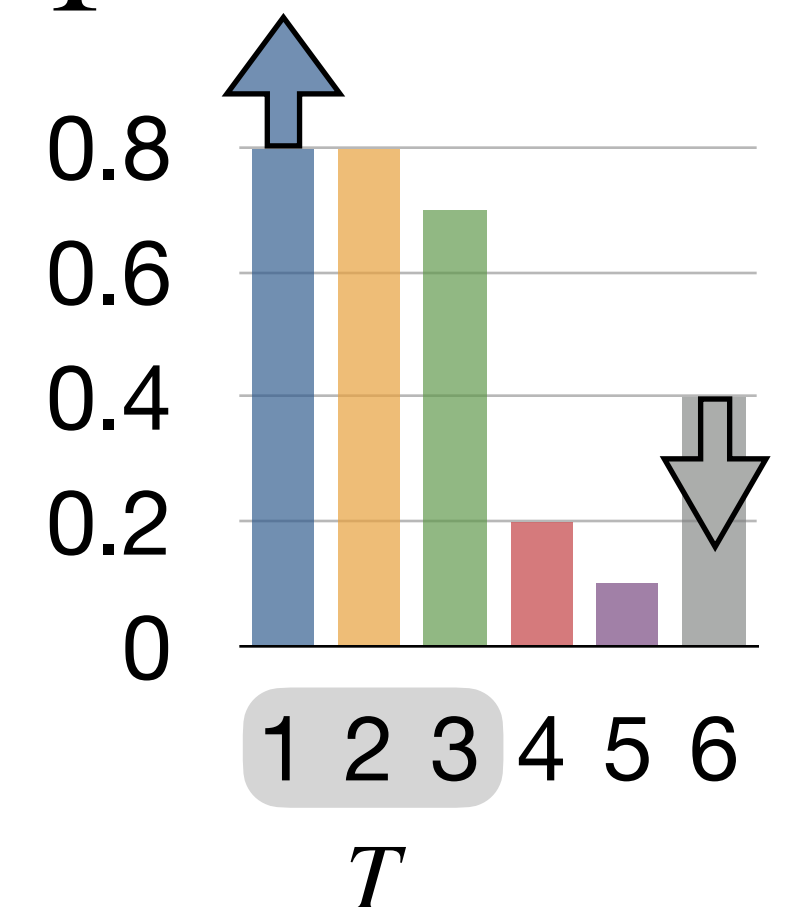
**(Very rough) proof sketch:** From the Magic Lemma we know that

$$P[S = T] = \frac{2 f(T)}{\mathbb{E}[B - k]}.$$

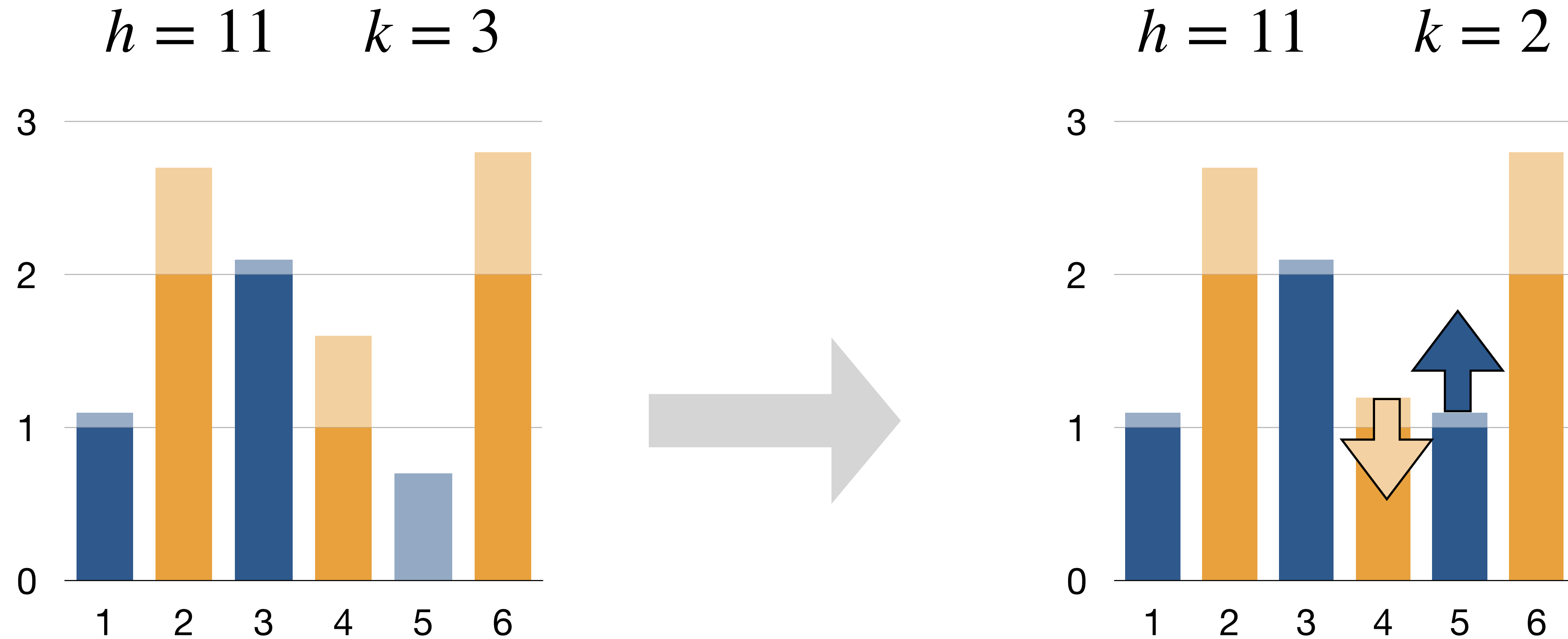
**Easy Case:**  $\sum_{i \in T} p_i \leq k - 1$



**Hard Case:**  $\sum_{i \in T} p_i > k - 1$



# Selection Monotonicity Revisited



What if lower quotas change?



# Monotone Apportionment Rules

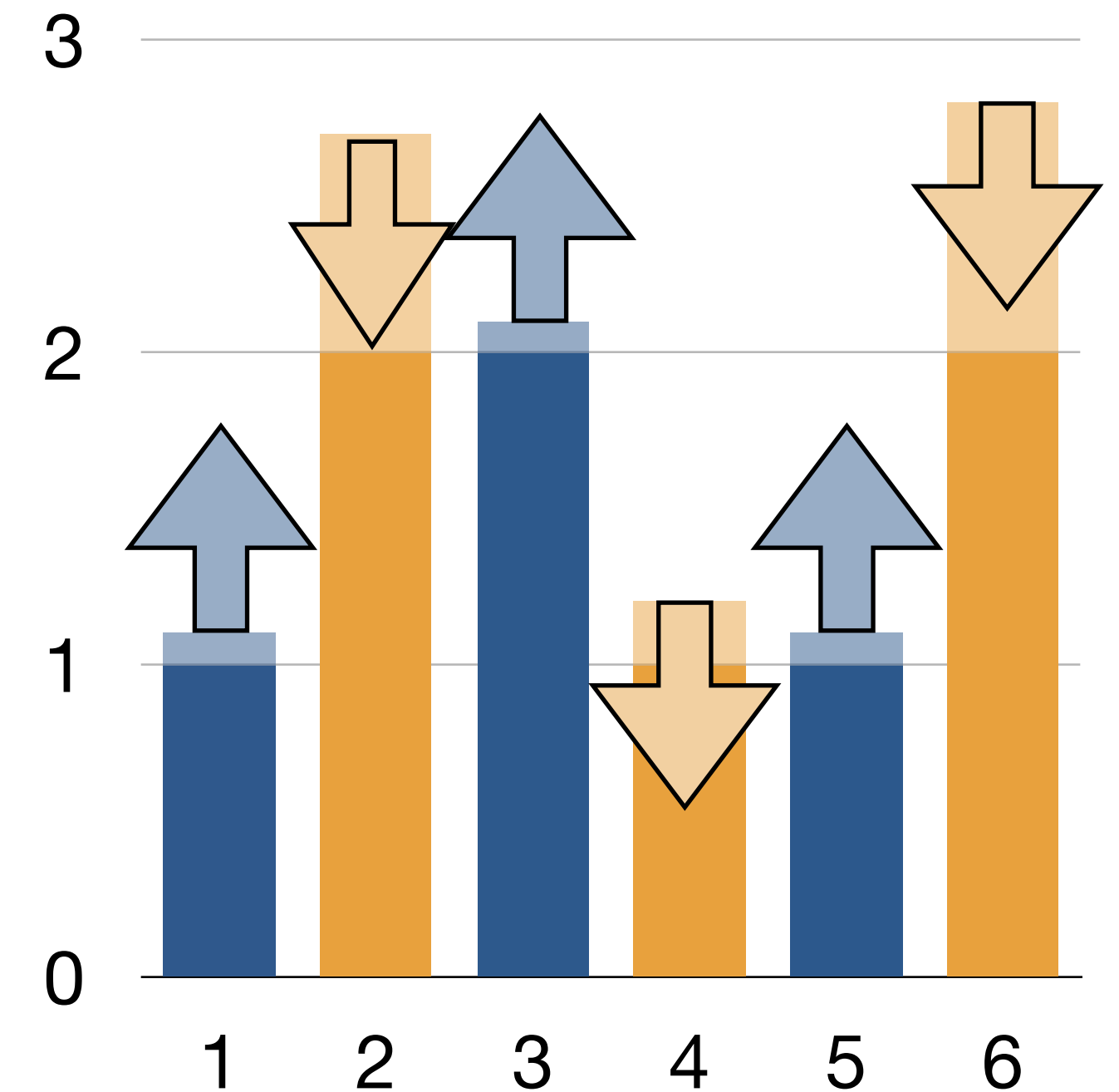
# Threshold Monotonicity

Let  $\vec{q}$  and  $\vec{q}'$  be two vote share (or quota) vectors and  $T$  be a coalition such that

- $q'_i \geq q_i$  for  $i \in T$ , and
- $q'_i \leq q_i$  for  $i \notin T$ .

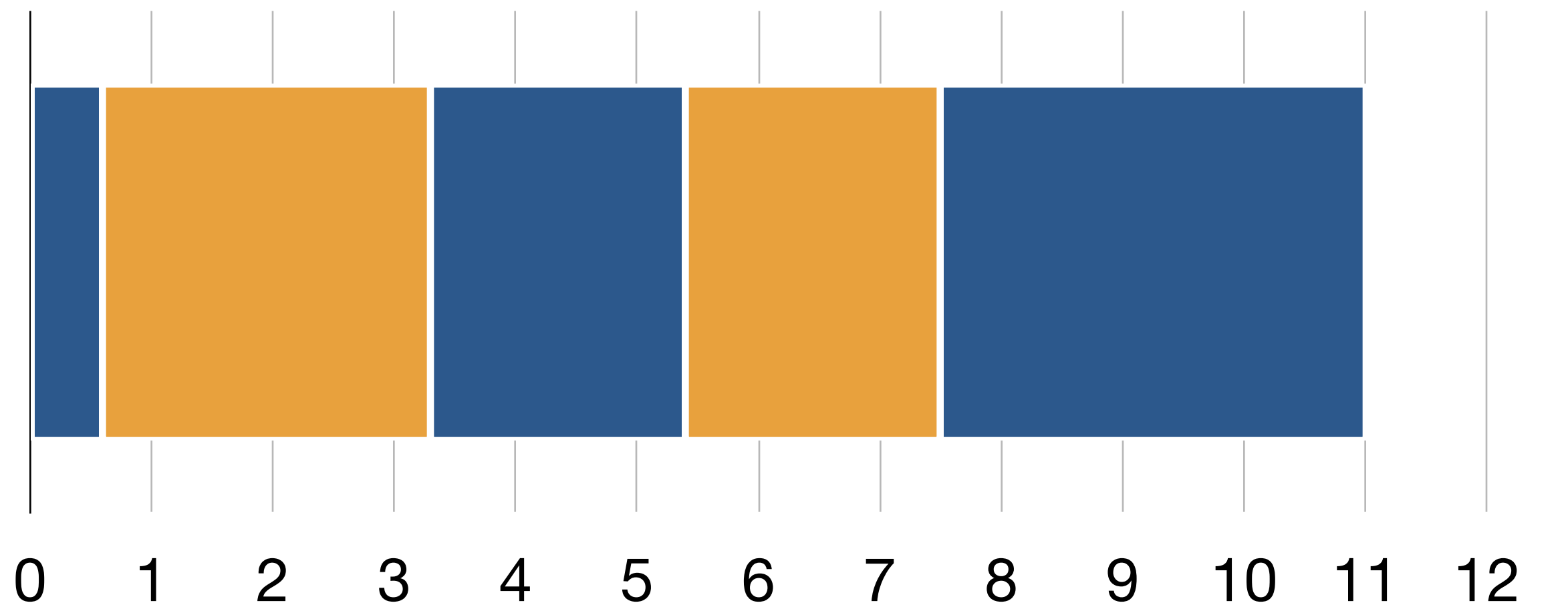
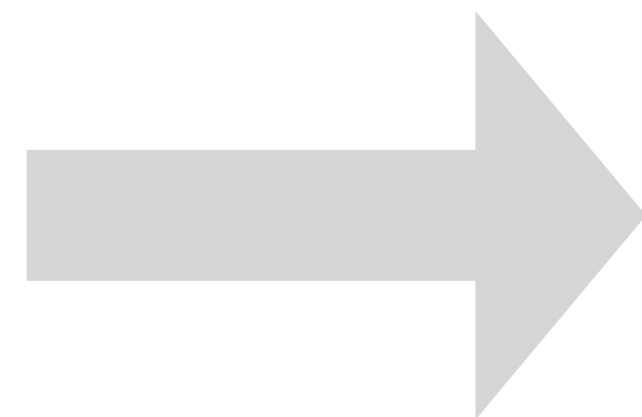
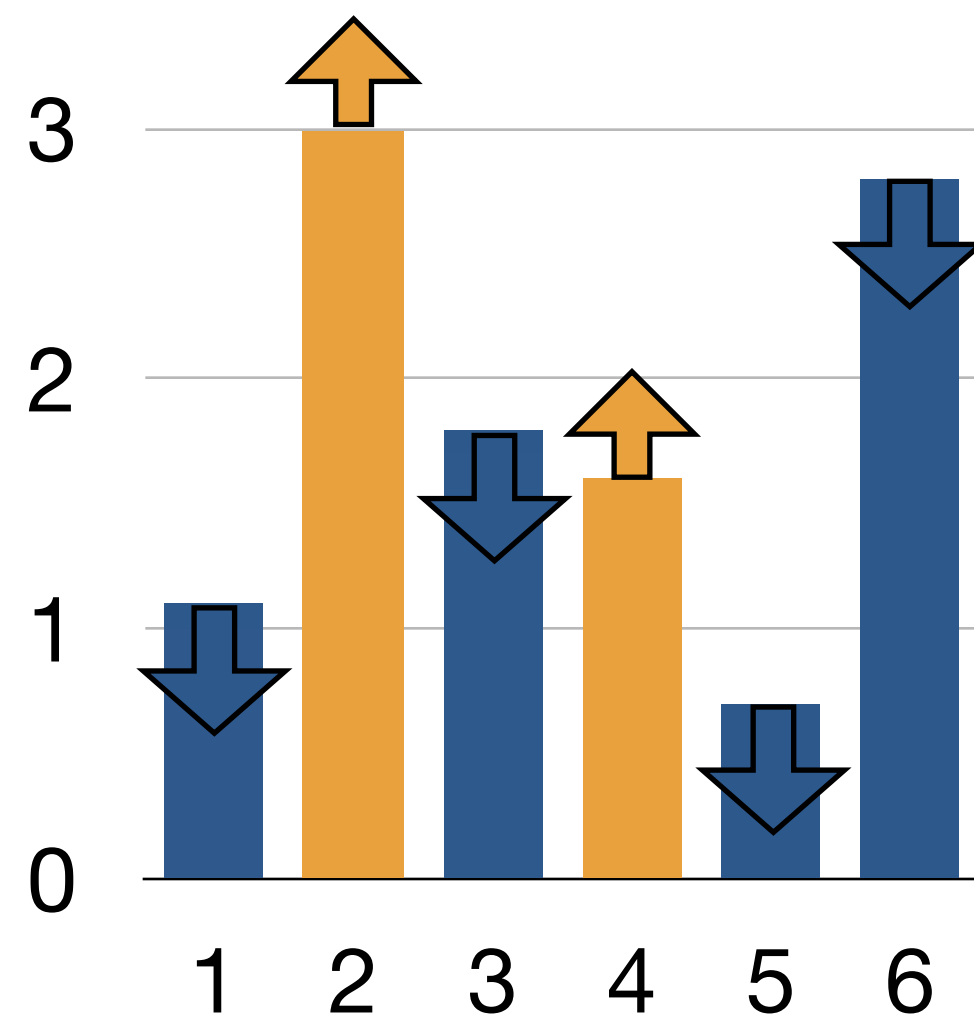
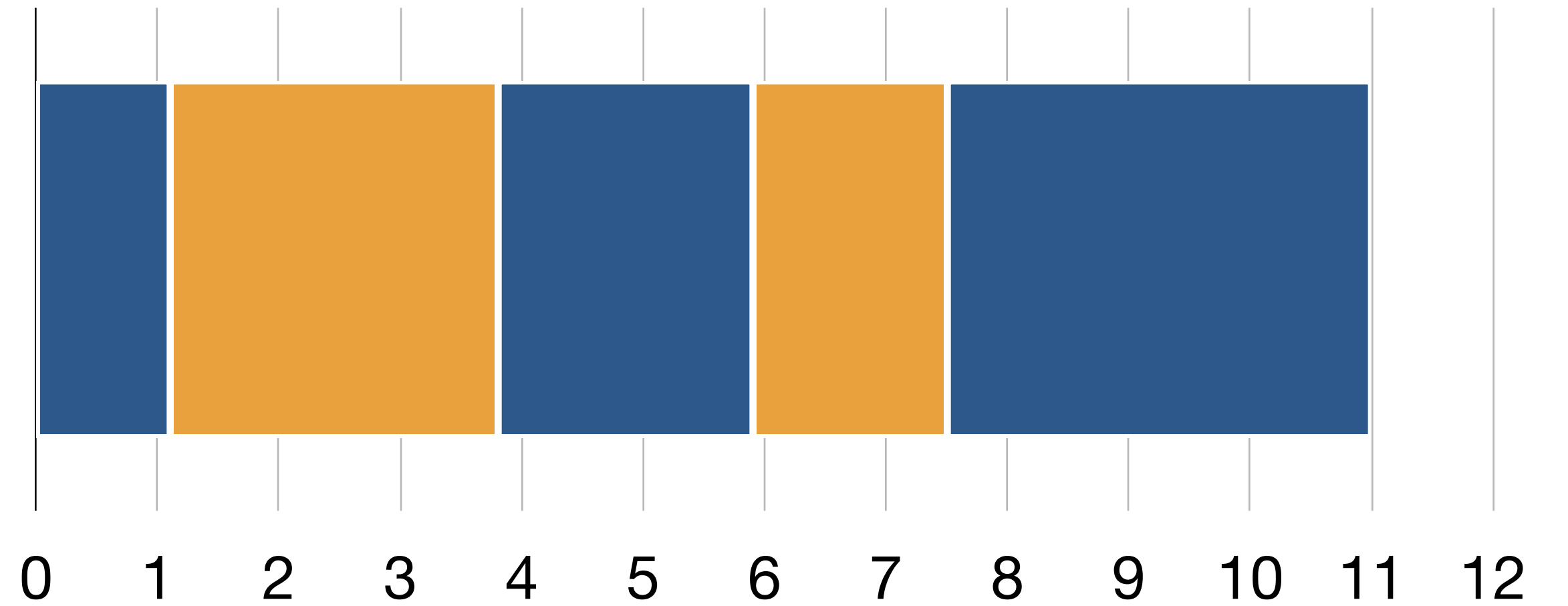
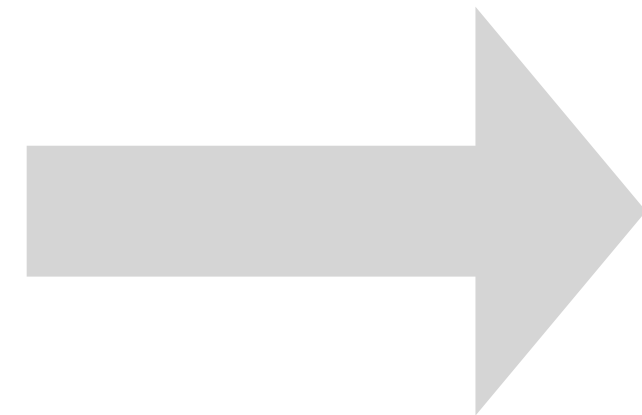
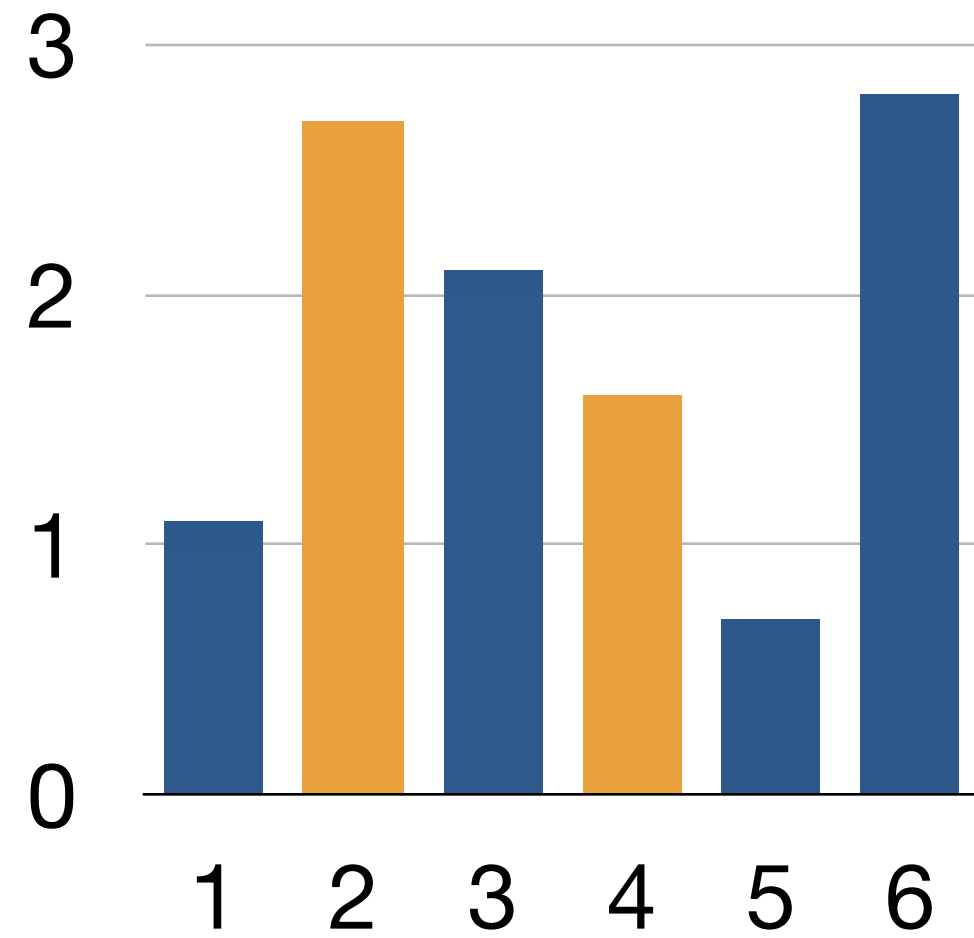
An apportionment rule is **threshold-monotone** if for all  $\ell \in [h]$  it holds that:

$$\mathbb{P} \left[ \sum_{i \in T} a'_i \geq \ell \right] \geq \mathbb{P} \left[ \sum_{i \in T} a_i \geq \ell \right].$$

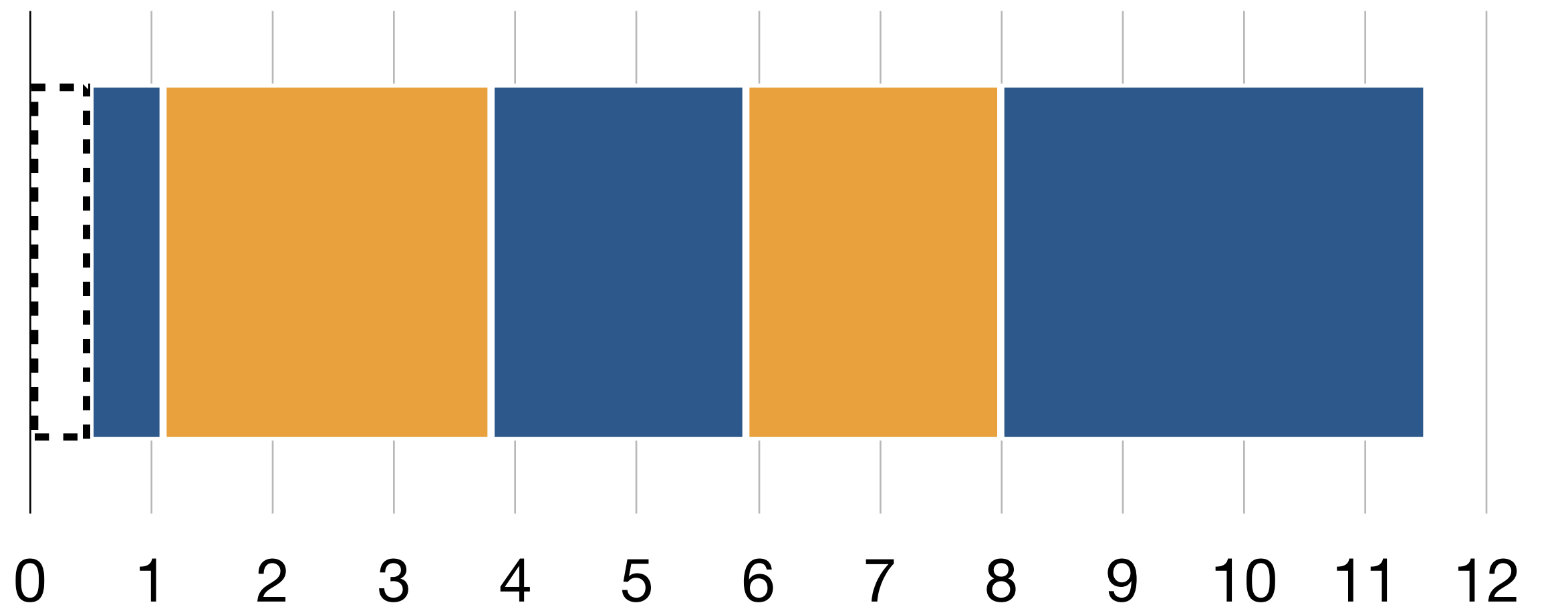
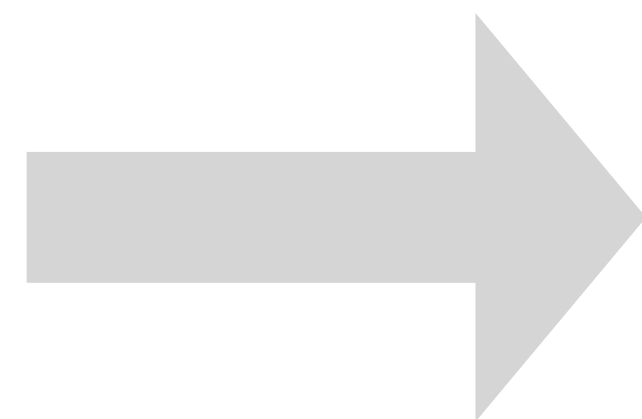
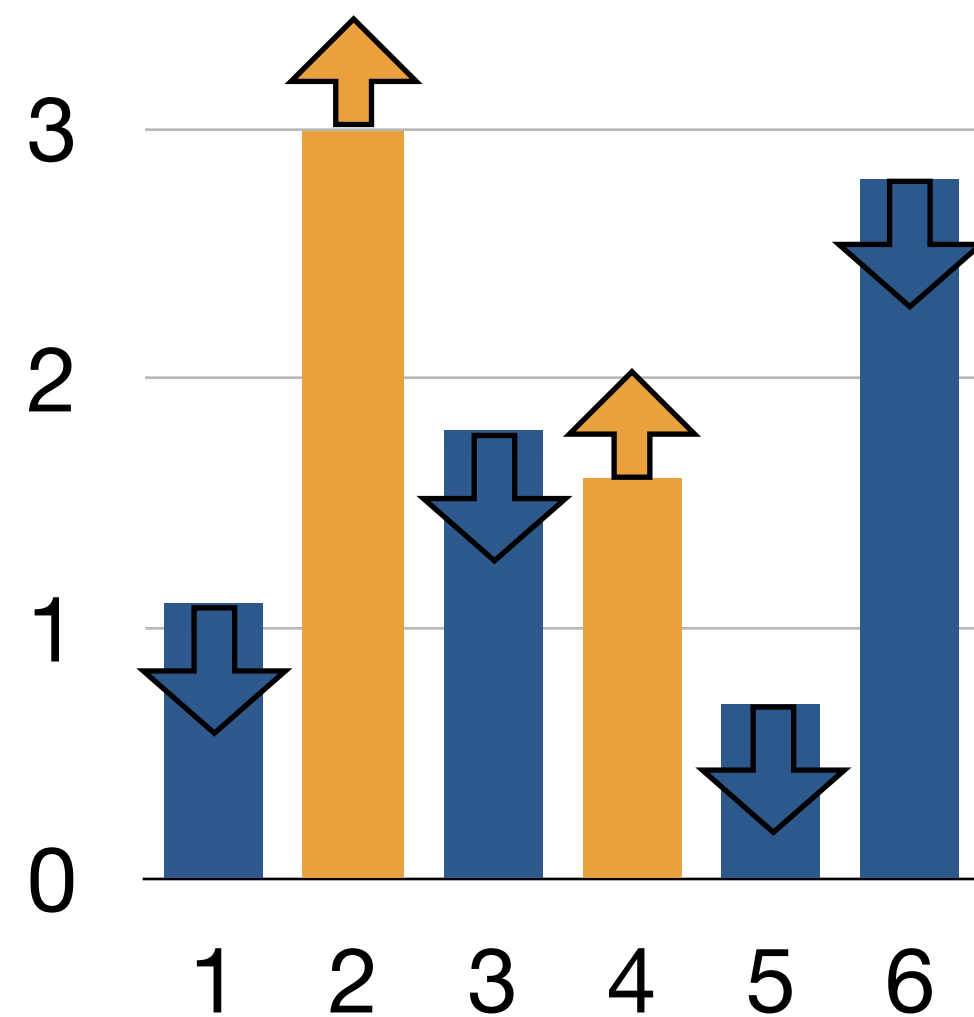
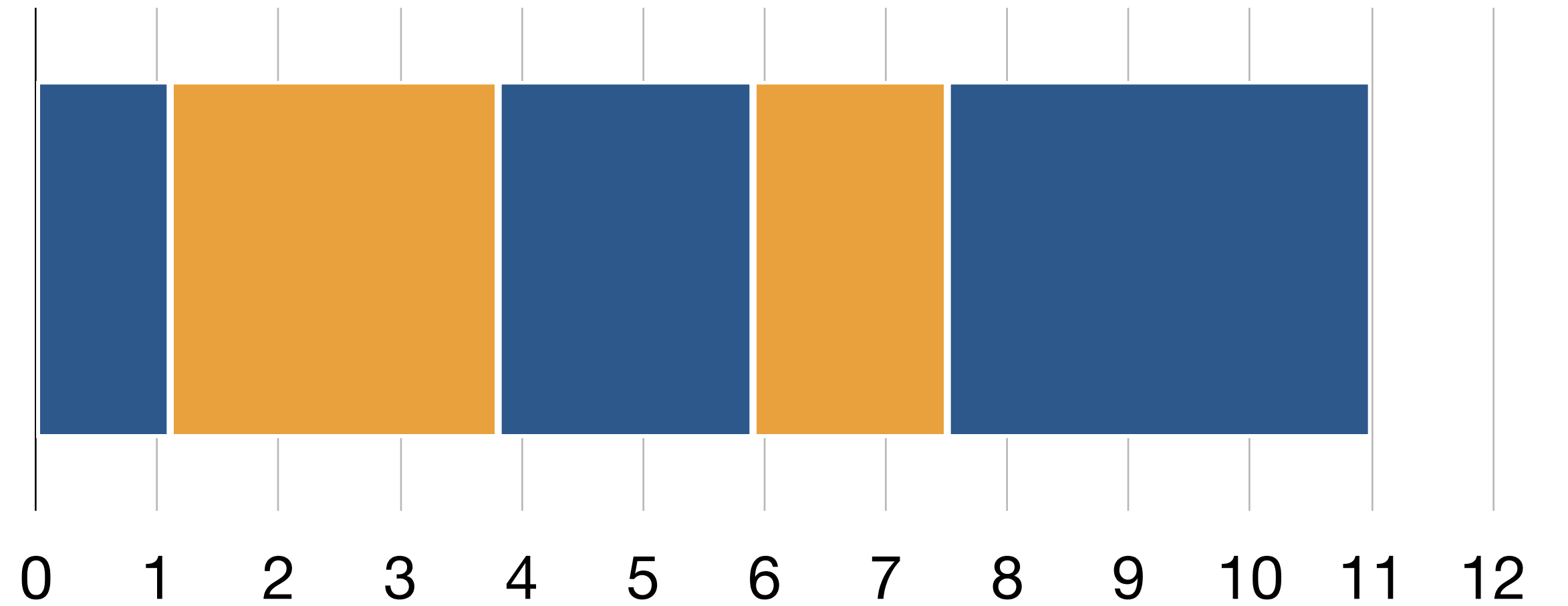
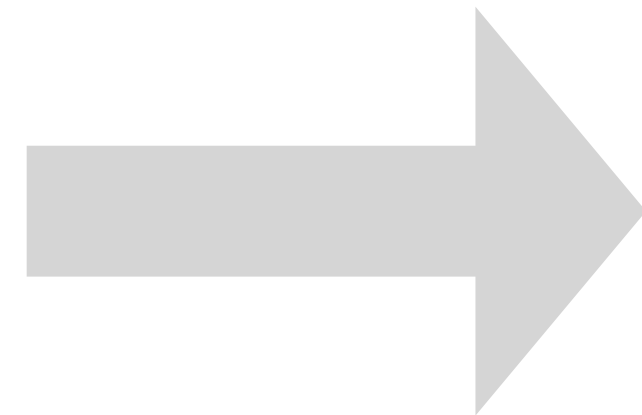
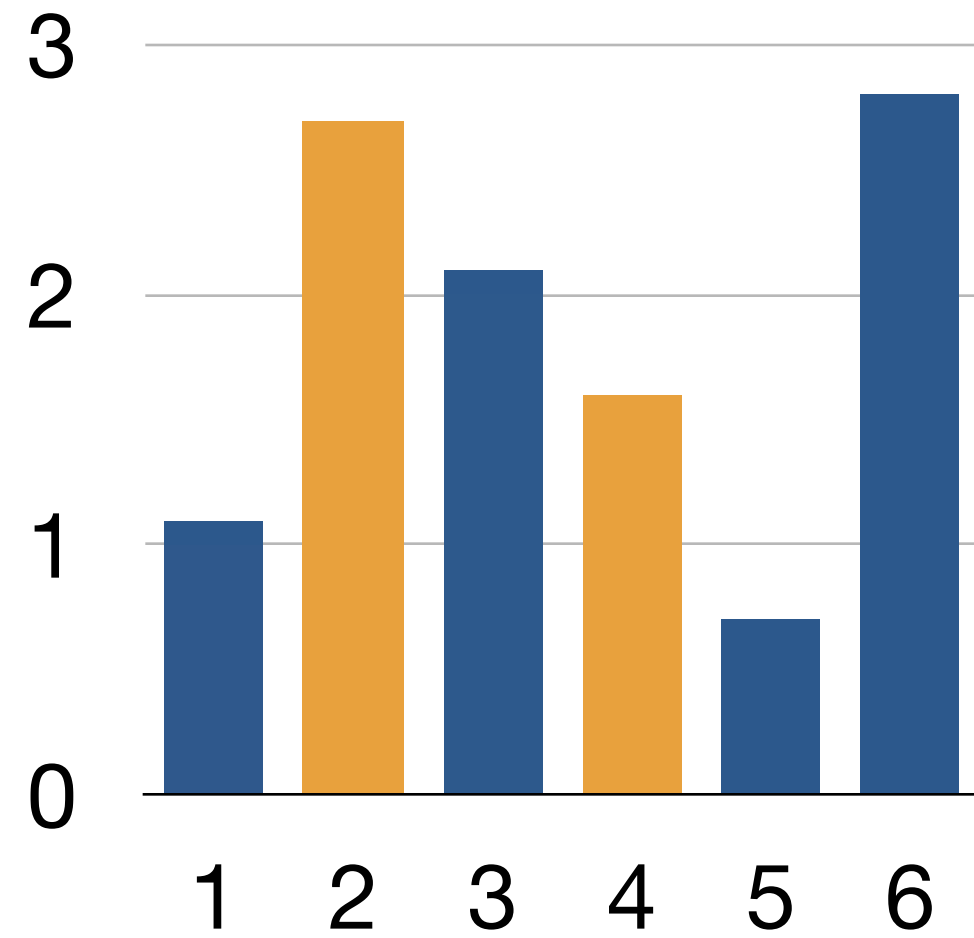


*If a coalition gains vote share, their probability of receiving **any threshold** of seats may not decrease.*

# Grimmett's Satisfies Threshold Monotonicity For Coalitions of Size 2



# Grimmett's Satisfies Threshold Monotonicity For Coalitions of Size 2



**Conjecture: Sampford's** apportionment method satisfied **threshold monotonicity.**

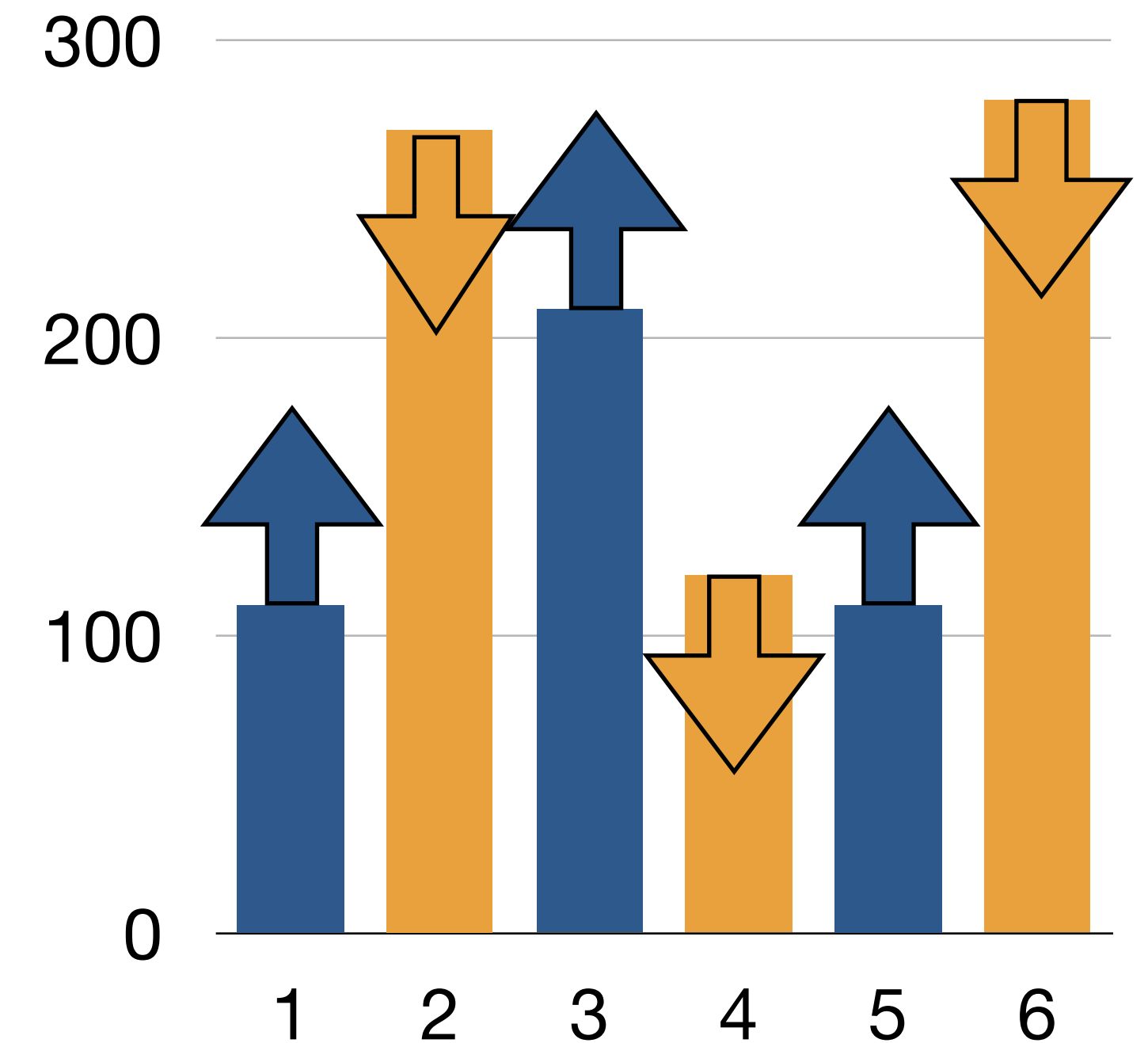
# Vote-Count Threshold Monotonicity

Let  $\vec{v}$  and  $\vec{v}'$  be two **vote vectors** and  $T$  be a coalition such that

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An apportionment rule is **vote-count threshold-monotone** if for all  $\ell \in [h]$  it holds that:

$$\mathbb{P} \left[ \sum_{i \in T} a'_i \geq \ell \right] \geq \mathbb{P} \left[ \sum_{i \in T} a_i \geq \ell \right].$$



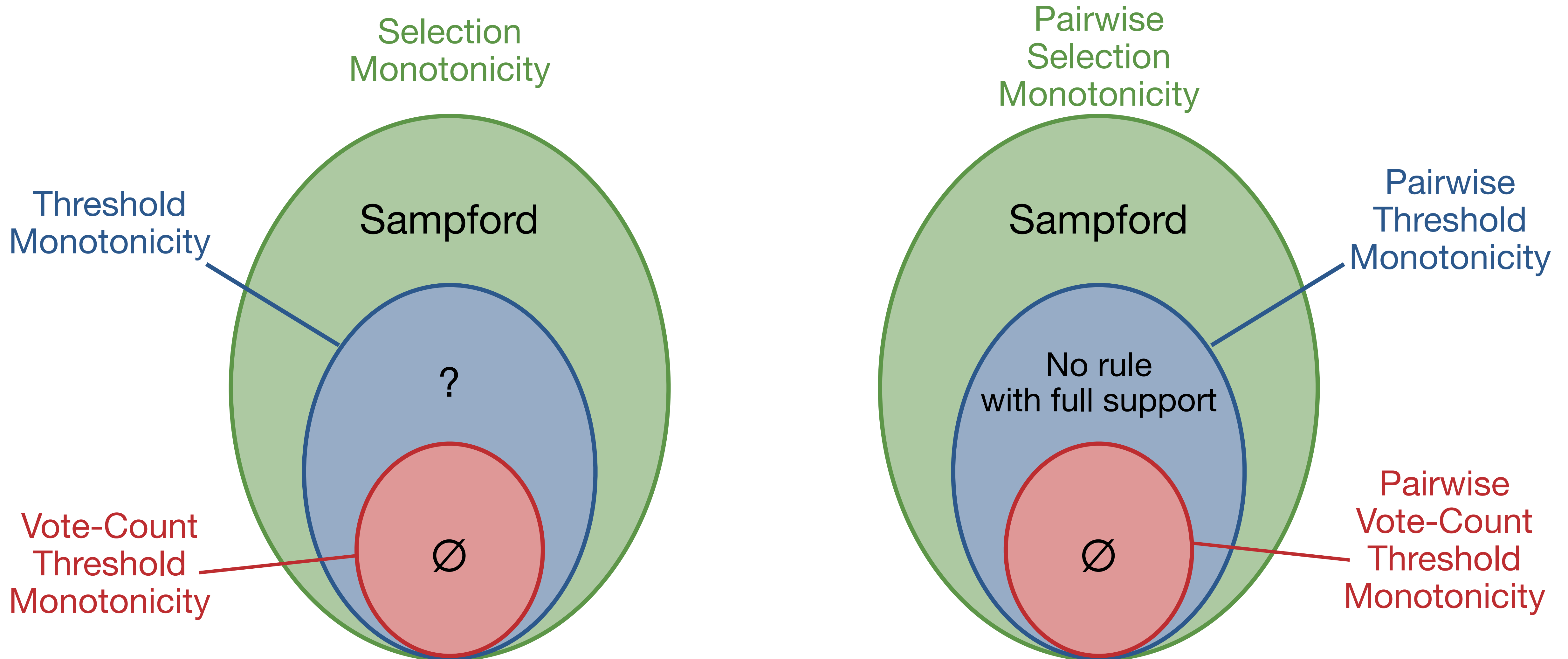
*If a coalition gains **votes**, their probability of receiving any threshold of seats may not decrease.*



**Impossibility:** No apportionment method satisfying ex-ante proportionality and ex-post quota can satisfy **vote-count threshold monotonicity.**

# Conclusion

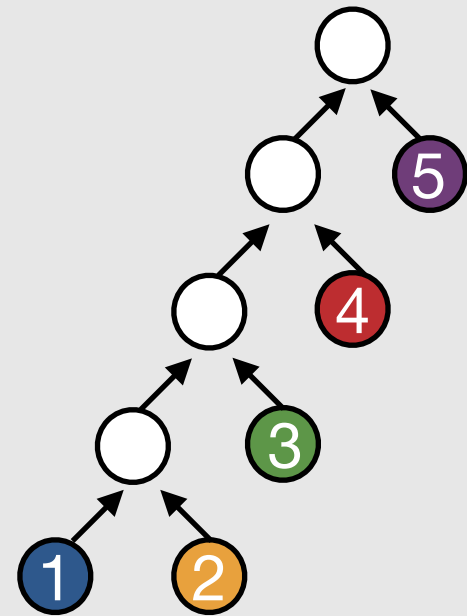
# The Axiomatic Landscape Of Monotone Randomized Apportionment



# Applications Beyond Apportionment

Pipage rounding yields approximation algorithms for **Steiner tree problems**, **k-median**, **committee selection** and **online algorithms**.

**Pipage**  
(pivotal method)



[Deville/Tilee 98, Srinivasan 01]

**Important properties:**

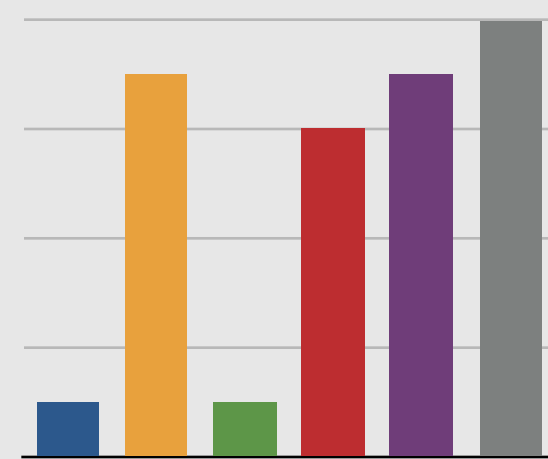
1. ex-ante proportionality
2. selection of k elements
3. negative correlation

Sampford sampling satisfies properties 1-3 plus **selection monotonicity**.

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## Sampford



1 2 3 4 5 6

[Sampford 67]

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1. ex-ante proportionality
2. selection of k elements
3. negative correlation

Sampford sampling satisfies properties 1-3 plus **selection monotonicity**.

# Thank you!