

## Lecture 17

# Computational Barriers to Manipulation

# Last Time

[Gibbard'73; Satterthwaite'75]

Any **onto** and **non-dictatorial** voting rule  
must be **manipulable**.

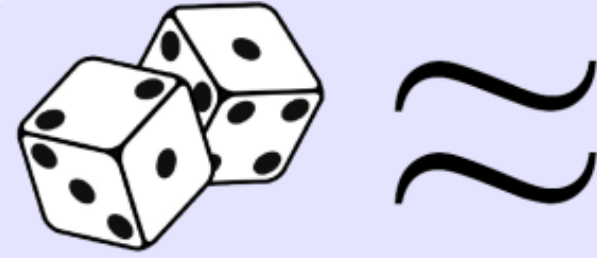
Circumventing GS



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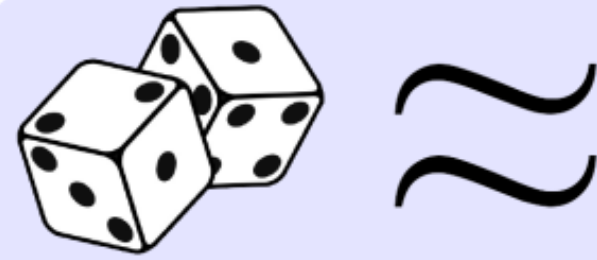


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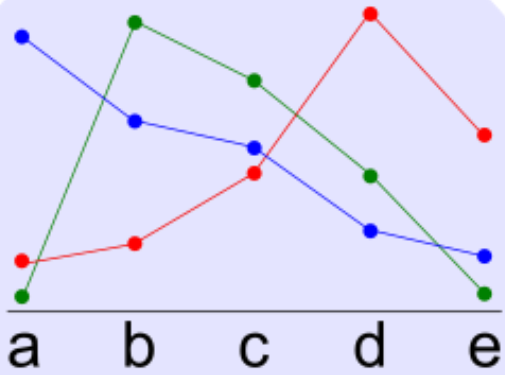


Circumventing GS





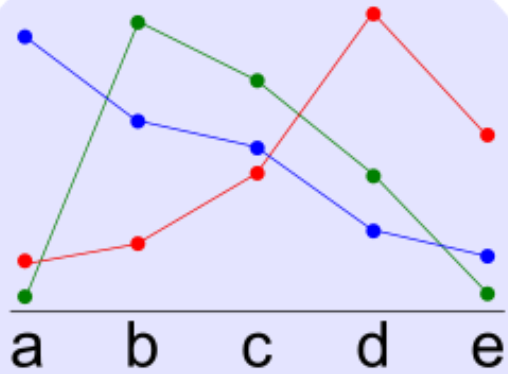
## Circumventing GS



Next lecture



# Circumventing GS



Next lecture



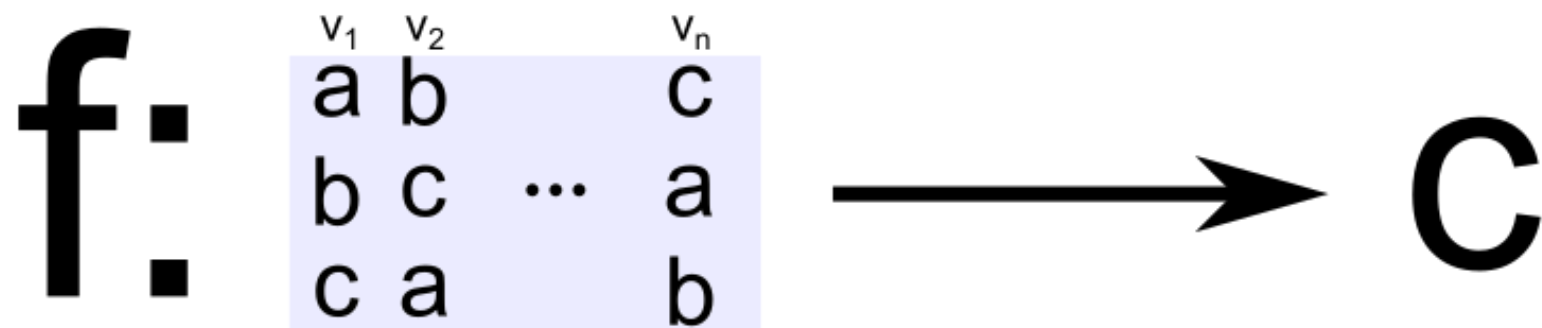
Today





# VOTING RULE

A mapping from preference profiles to candidates.



# f-Manipulation

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## Input:

- A set of candidates and a set of voters  $v_1, v_2, \dots, v_n$

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- Manipulator  $v_1$ 's favorite candidate  $c$

# f-Manipulation

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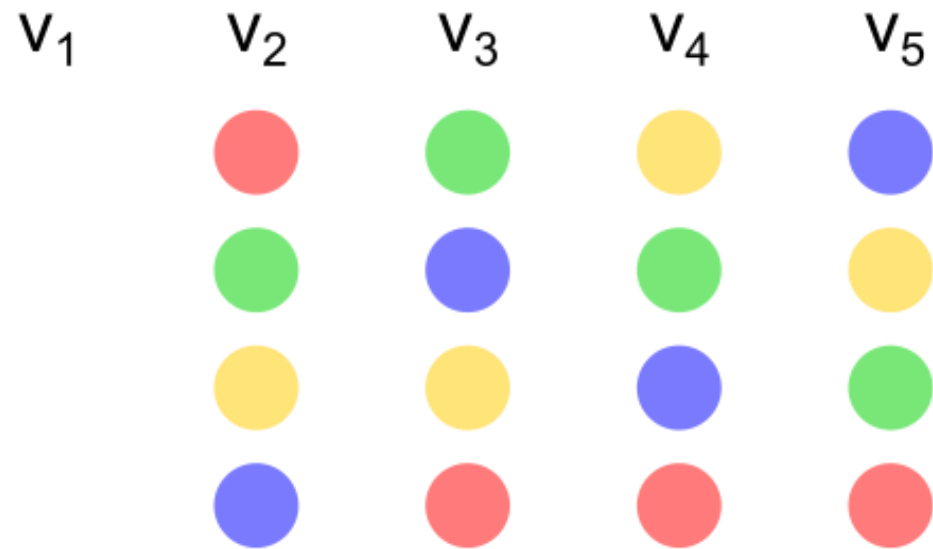
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## Question:

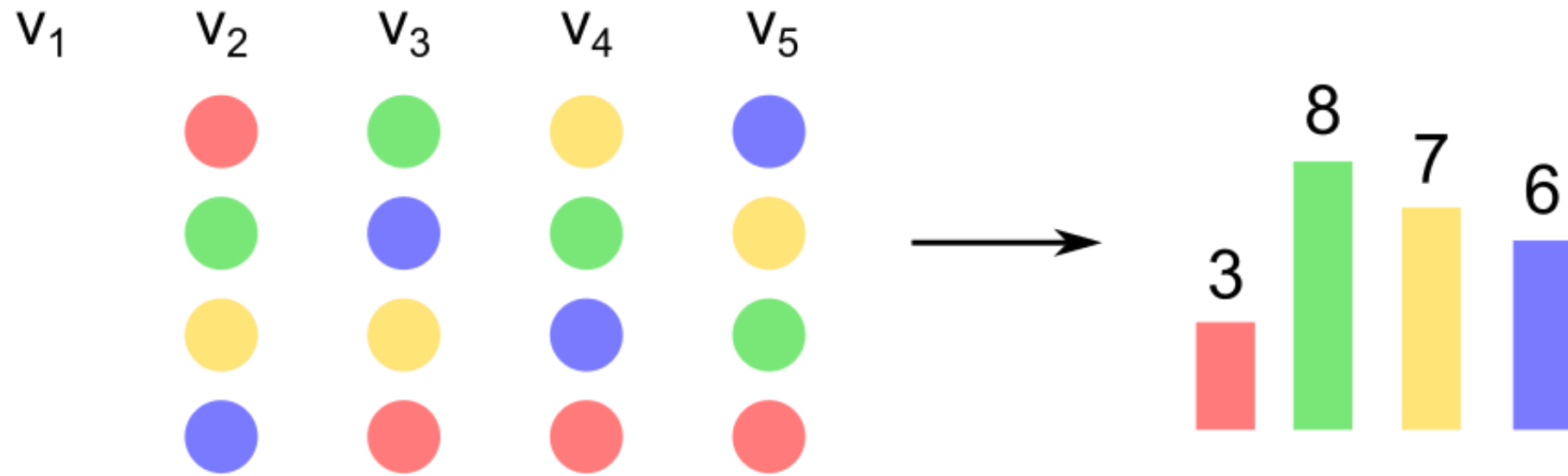
Does there exist a vote  $P_1$  of the manipulator  $v_1$  such that

$$f(P_1, P_2, \dots, P_n) = c?$$

# Manipulation under Borda Count



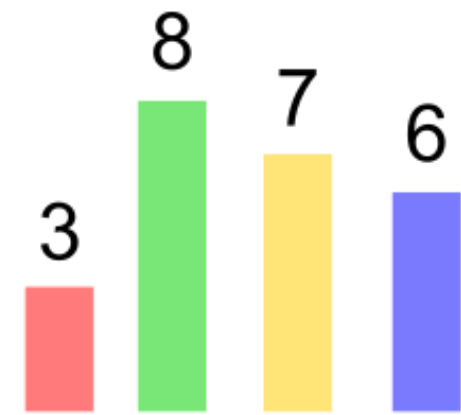
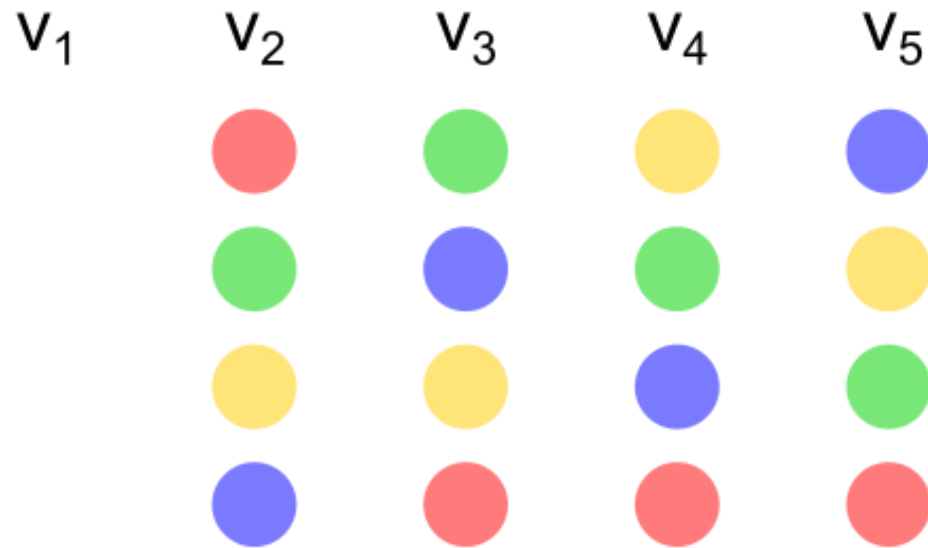
# Manipulation under Borda Count





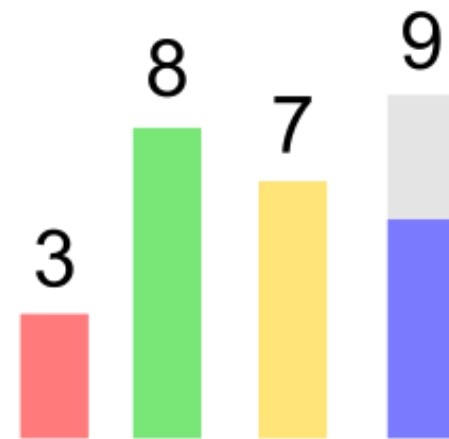
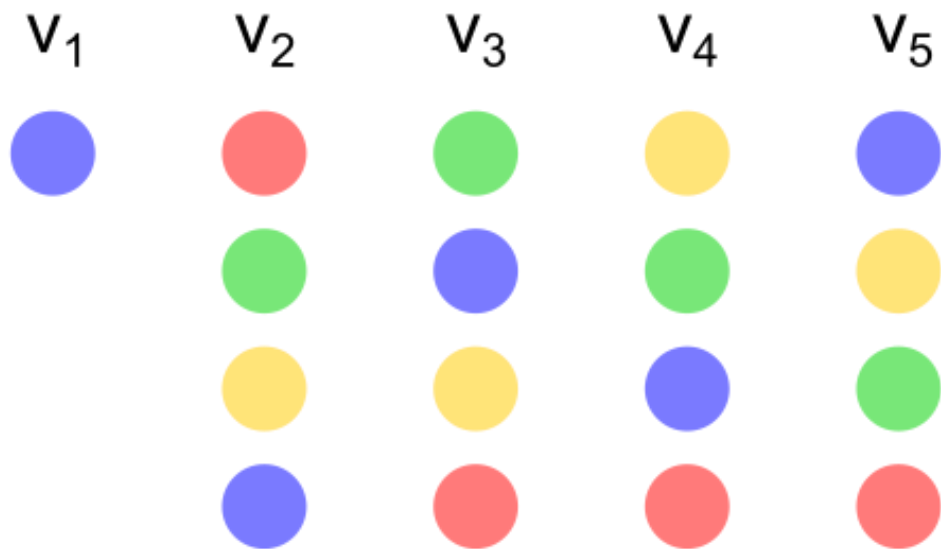
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Can I make ● win?



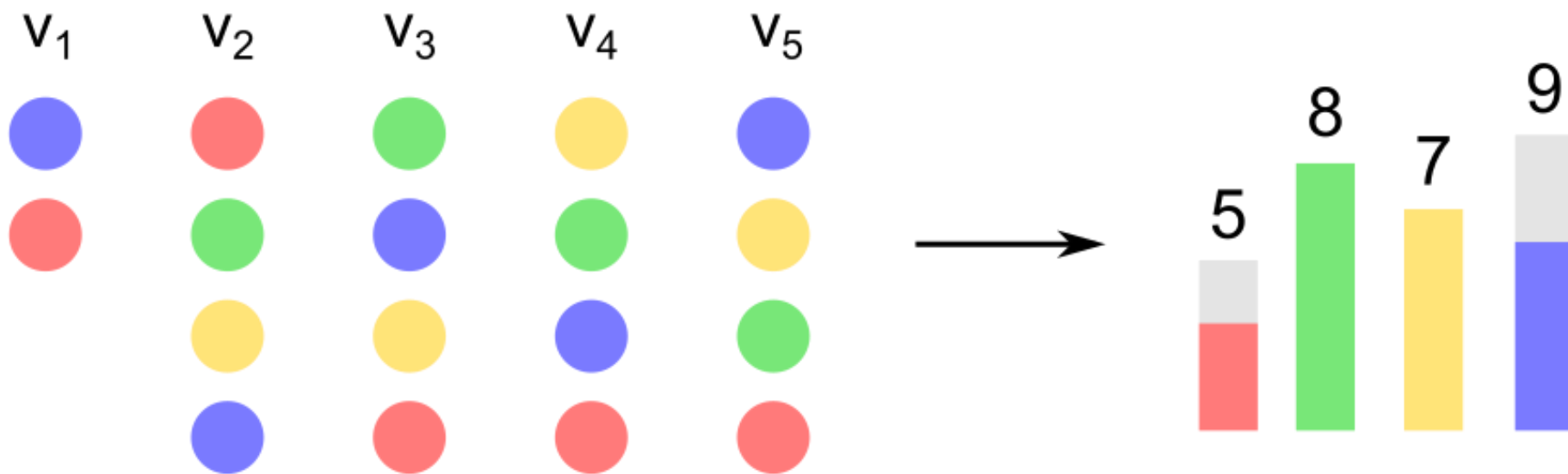
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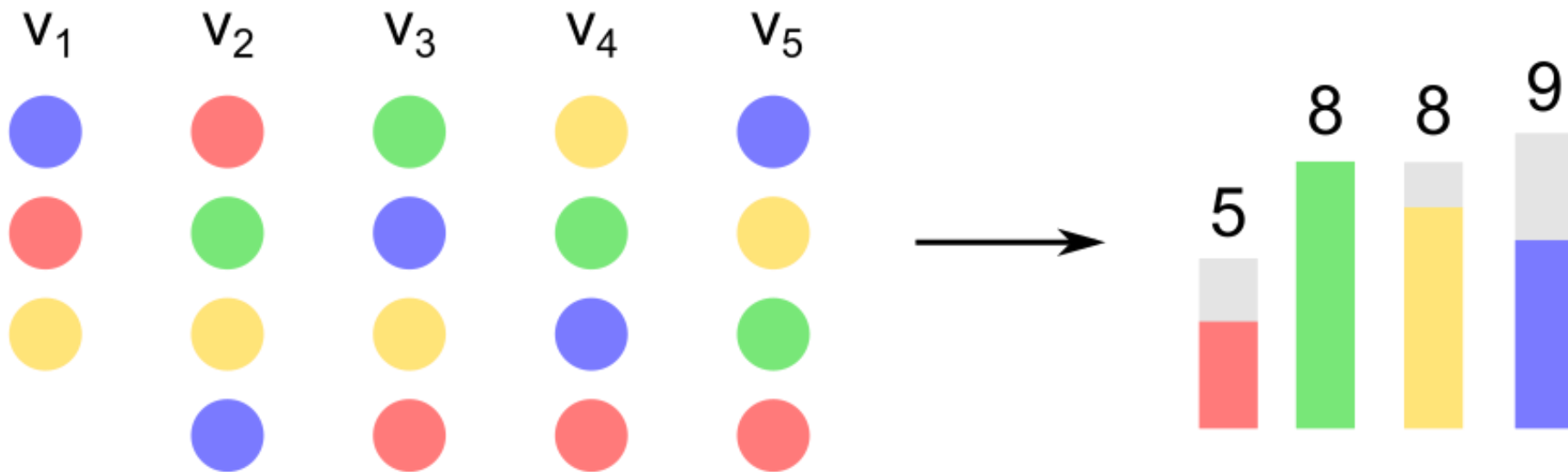
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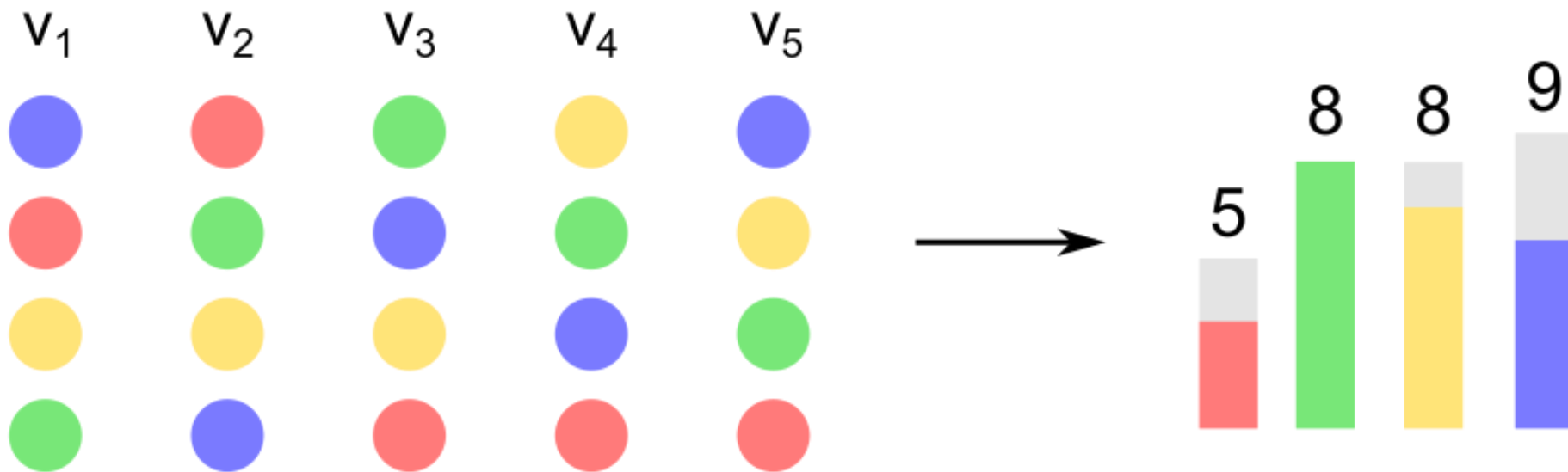
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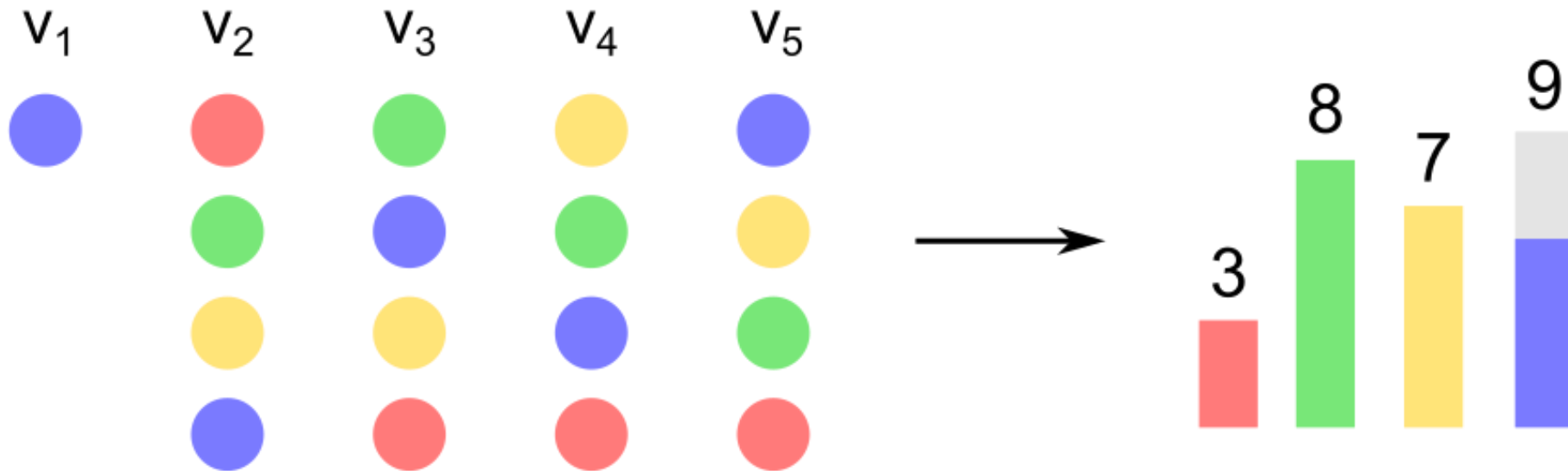
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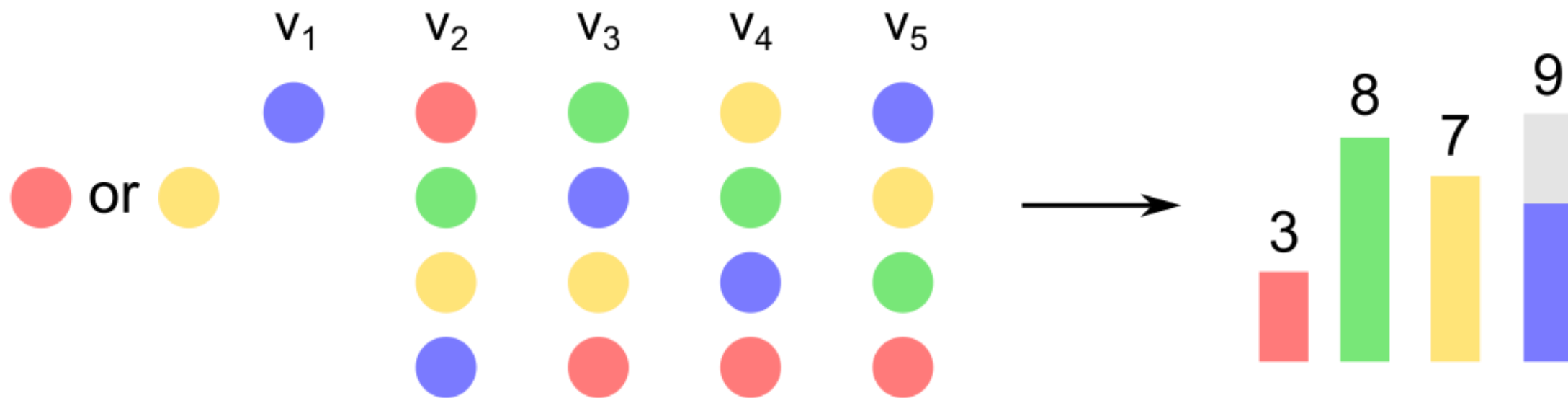
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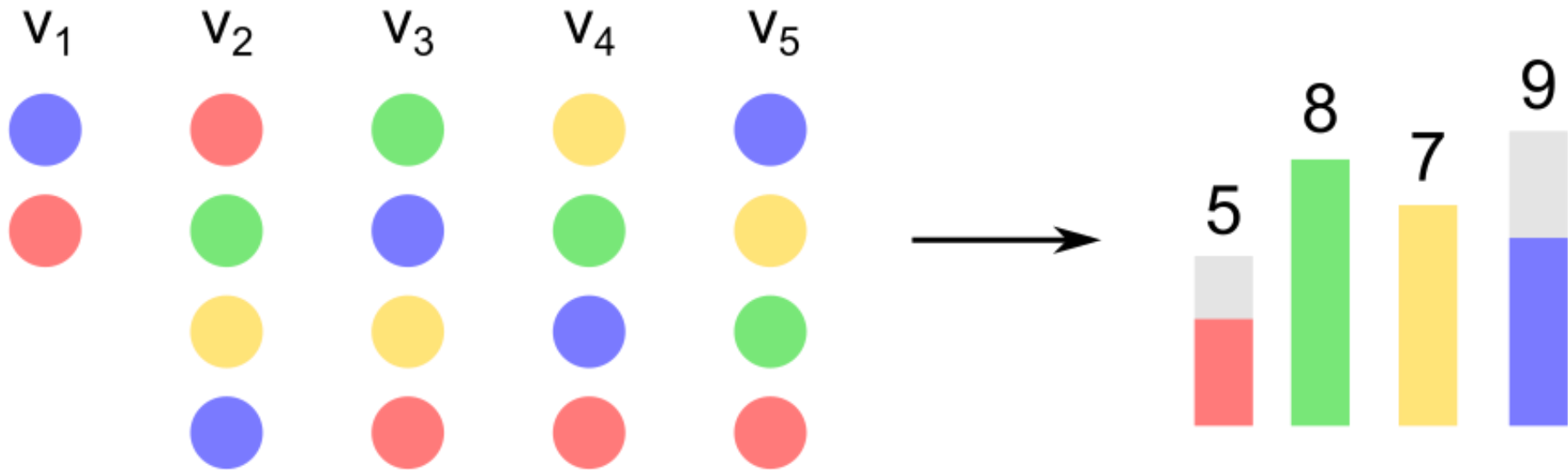
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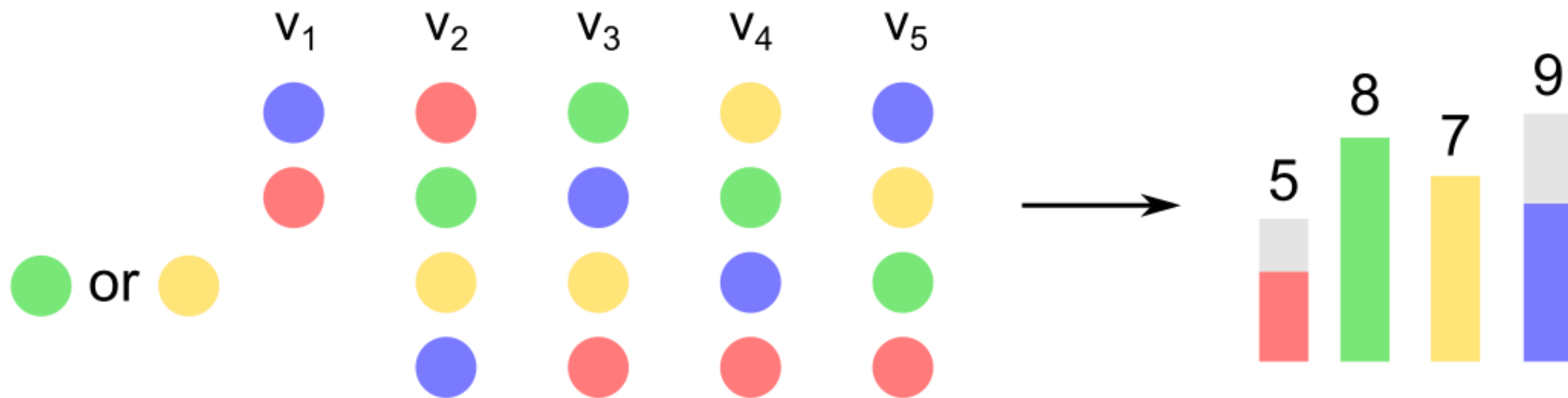
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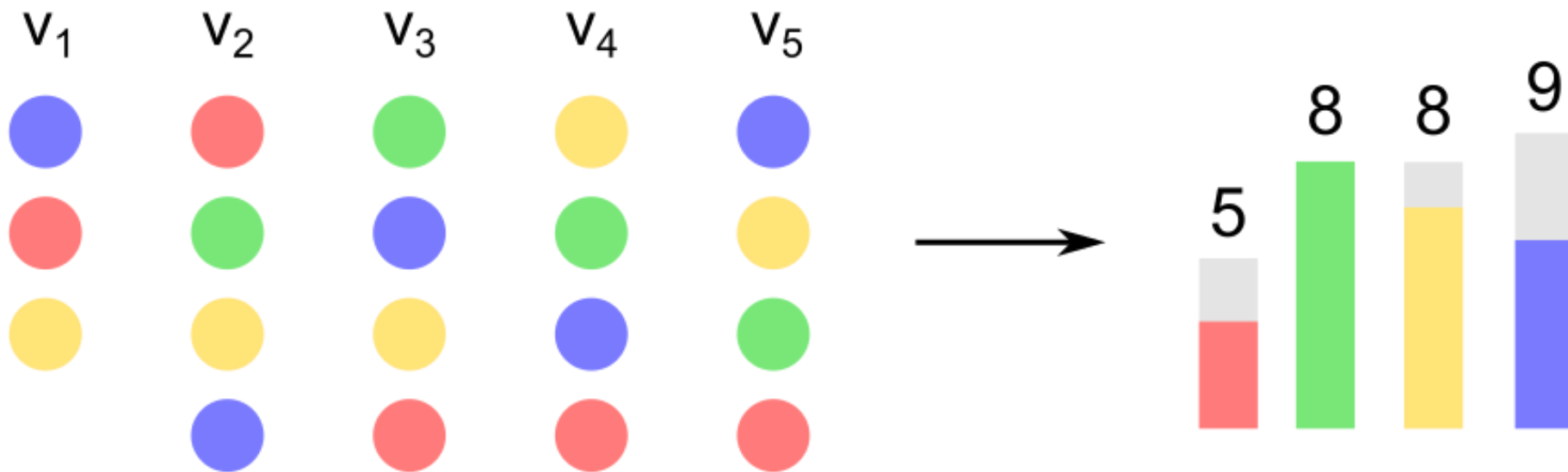
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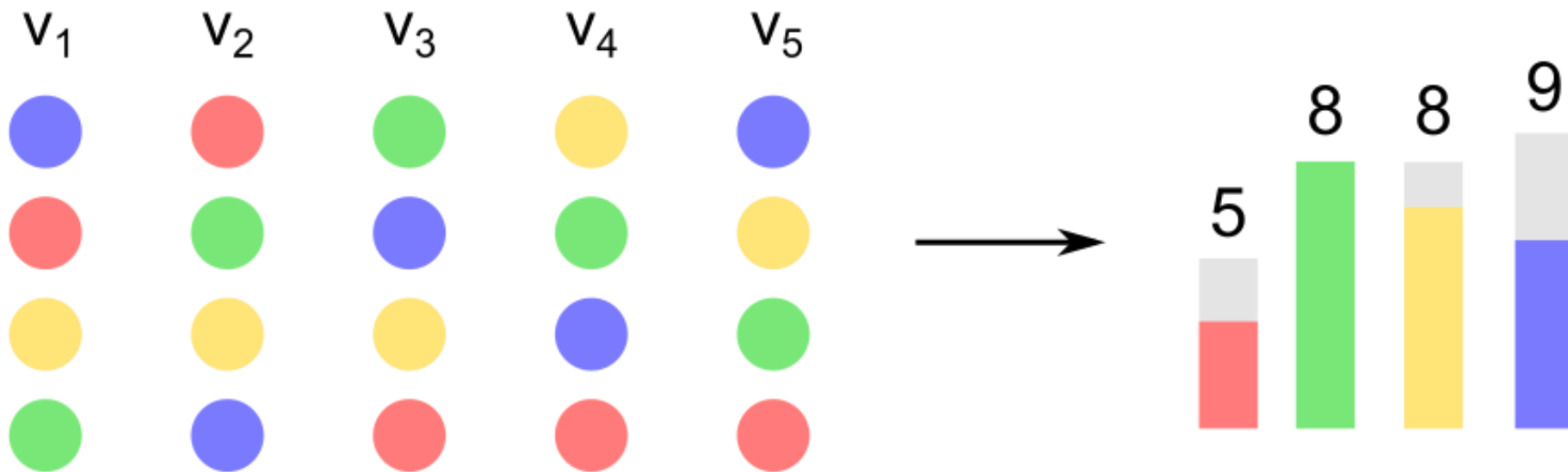
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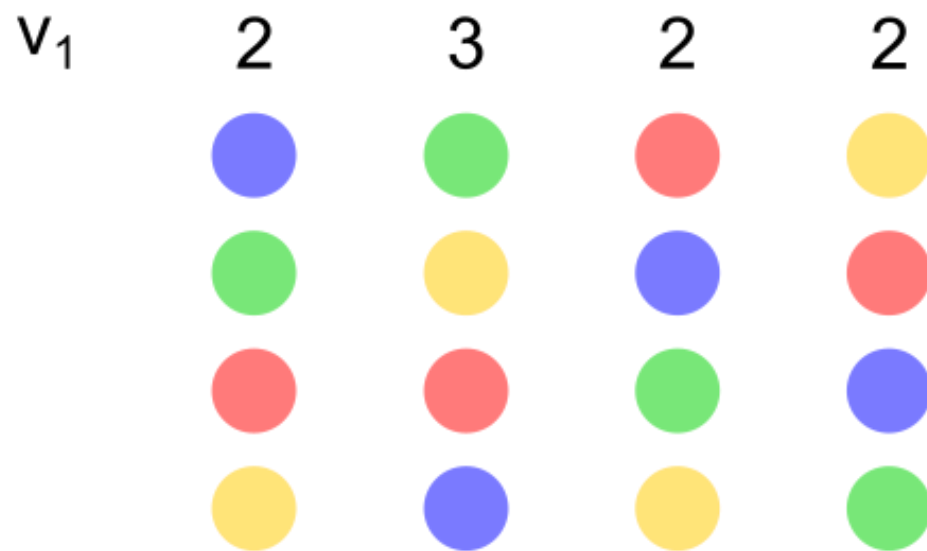






The greedy strategy does not always work.

# Manipulation under STV



# Manipulation under STV

Can I make ● win?

$v_1$

2

3

2

2



# Manipulation under STV

Can I make  win?

Tie-breaking rule

 >  >  > 

$v_1$

2

3

2

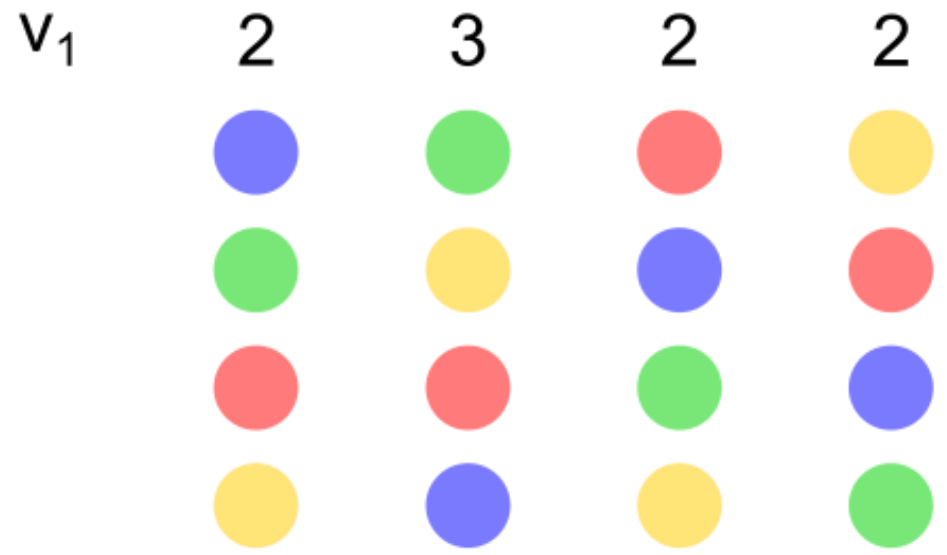
2



# Manipulation under STV

Can I make  win?

Tie-breaking rule  
 >  >  > 

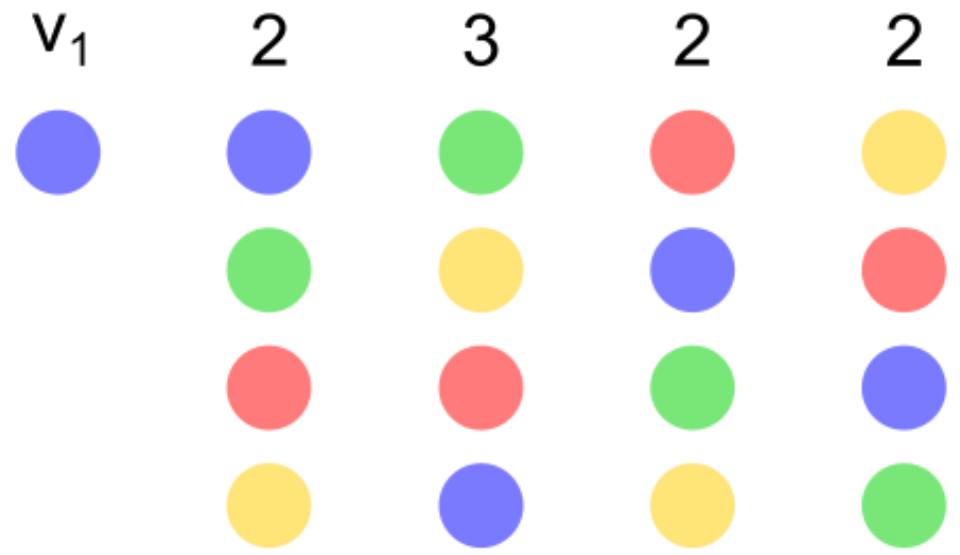


Let's follow the greedy strategy and put  at the top.

# Manipulation under STV

Can I make  win?

Tie-breaking rule  
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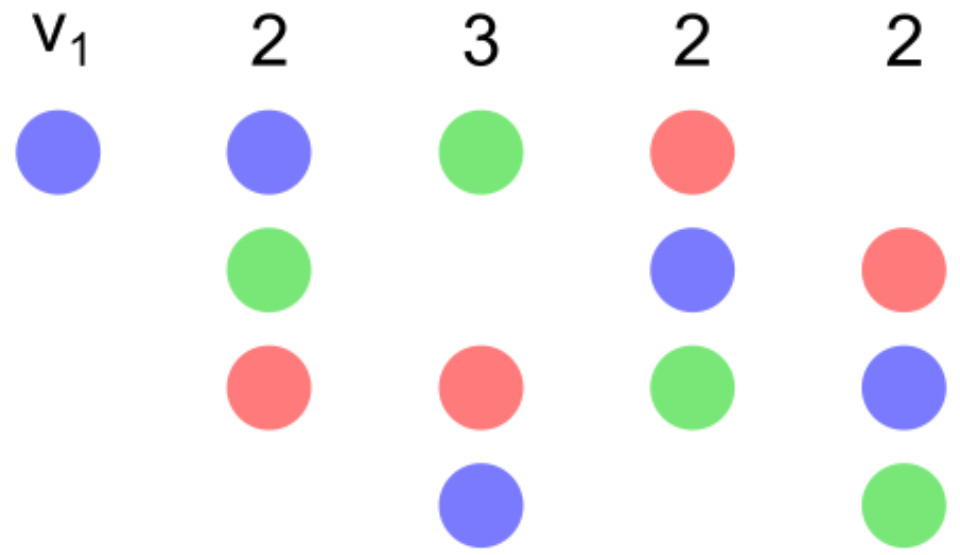


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Can I make  win?

Tie-breaking rule  
 >  >  > 



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Can I make  win?

Tie-breaking rule

 >  >  > 

$v_1$

2

3

2

2



Let's follow the greedy strategy and put  at the top.

 is eliminated in the next round (due to tie-breaking rule).



# Manipulation under STV

Can I make  win?

Tie-breaking rule

 >  >  > 

$v_1$

2

3

2

2



# Manipulation under STV

Can I make  win?

Tie-breaking rule

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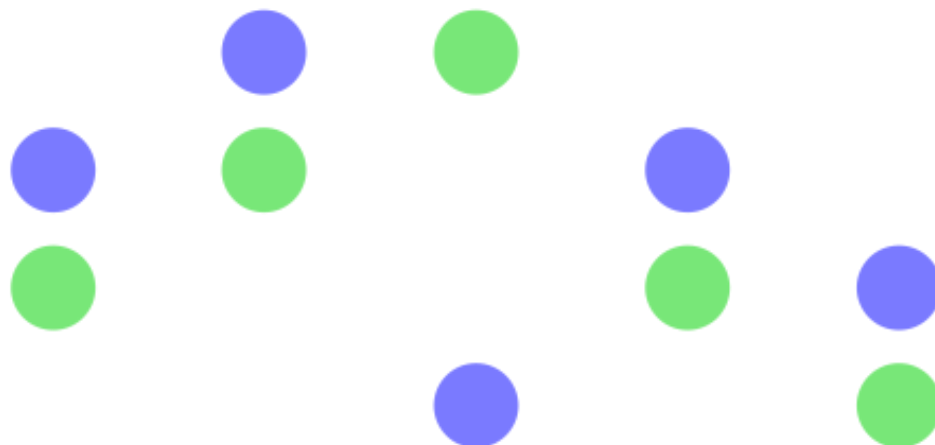
$v_1$

2

3

2

2



STV winner: 



So, *when* does the greedy strategy work?

[Bartholdi, Tovey and Trick, SCW 1989]

The greedy strategy can correctly solve  $f$ -Manipulation in polynomial time for any voting rule  $f$  satisfying:

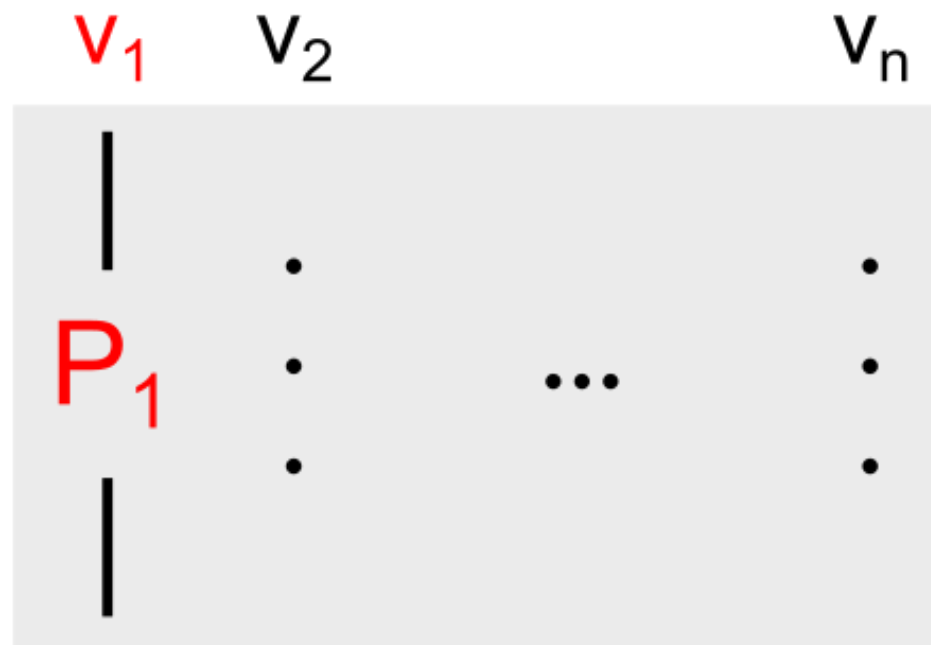


[Bartholdi, Tovey and Trick, SCW 1989]

The greedy strategy can correctly solve  $f$ -Manipulation in polynomial time for any voting rule  $f$  satisfying:

- **Score-based**: There exists a *scoring function*  $s: (P_1, x) \rightarrow \mathbb{R}$  such that for any vote  $P_1$  of  $v_1$ , the  $f$ -winner is the candidate maximizing  $s(P_1, x)$ .

# scoring function $s$



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$v_1$	$v_2$		$v_n$	
	.		.	$c_1: 0.5$
$P_1$	.	...	.	$c_2: 2.1$
	.		.	$c_3: 0$
				.
				.
				.

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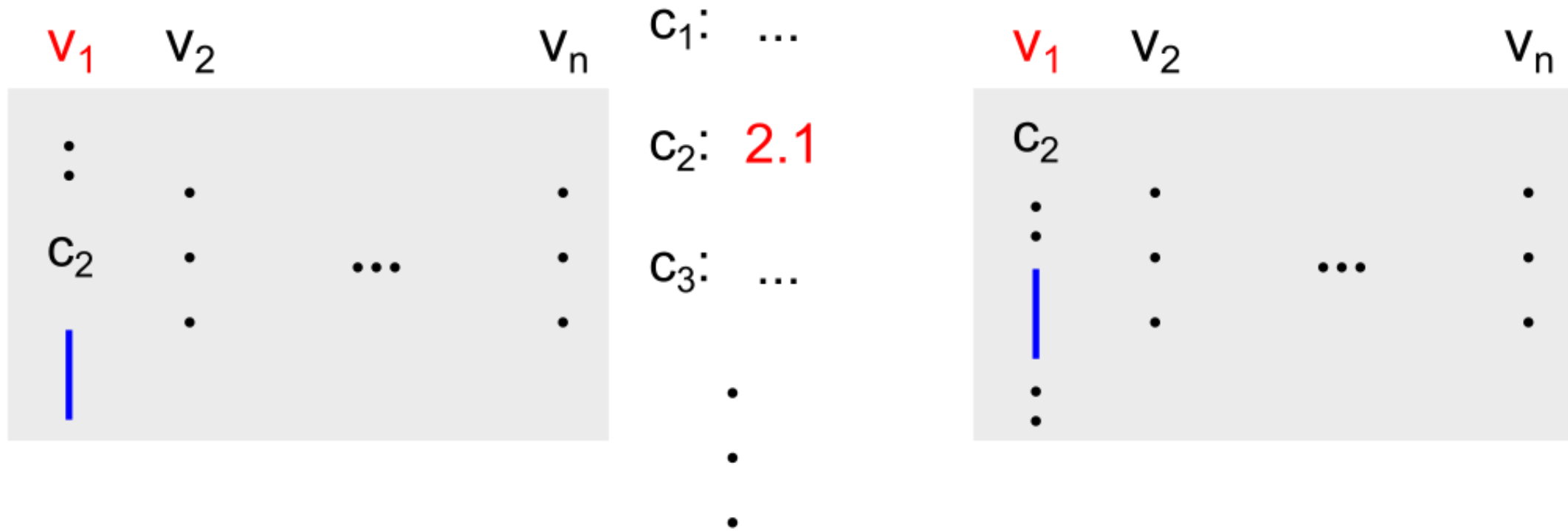
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monotone scoring function  $s$

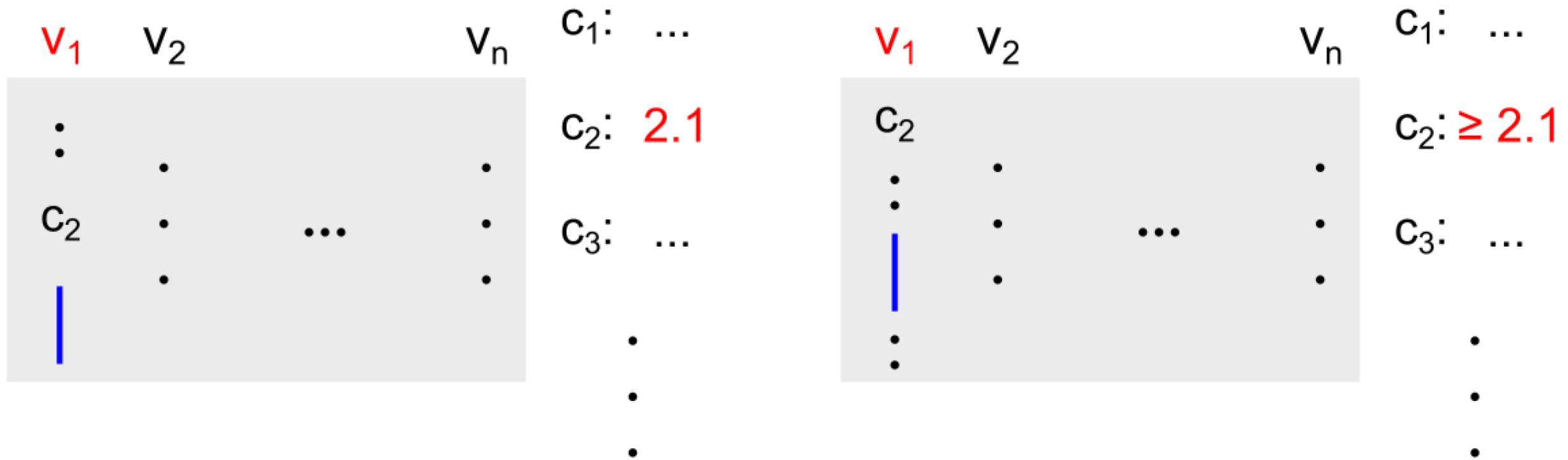
# monotone scoring function $s$

$V_1$	$V_2$		$V_n$	$C_1$ : ...
$\vdots$	$\cdot$		$\cdot$	$C_2$ : 2.1
$C_2$	$\cdot$	...	$\cdot$	$C_3$ : ...
	$\cdot$		$\cdot$	$\cdot$
				$\cdot$
				$\cdot$

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- **Efficiency**: The voting rule  $f$  can be evaluated in polynomial time.

In particular, for  $f \in \{\text{Plurality, Borda, Copeland}\}$ .

Voting rule

Scoring function

## Voting rule

## Scoring function

Plurality

$p_x$  = Plurality score of  $x$  from  $P_2, \dots, P_n$

$$s(P_1, x) = \begin{cases} 1 + p_x & \text{if } x \text{ is top-ranked in } P_1 \\ p_x & \text{otherwise} \end{cases}$$

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Borda

$$b_x = \text{Borda score of } x \text{ from } P_2, \dots, P_n$$
$$s(P_1, x) = b_x + \# \text{candidates below } x \text{ in } P_1$$

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Copeland

$$s(P_1, x) = \# \text{candidates } x \text{ beats in a head-to-head} + 0.5 \cdot \# \text{candidates that } x \text{ ties with in a head-to-head}$$

(based on all votes  $P_1, P_2, \dots, P_n$ )

# Correctness of Greedy Strategy

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If the greedy strategy returns a ranking, it must be correct.

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**Need to show:**

If there is a winning vote for  $c$ , then the greedy strategy must also find one.

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Suppose, for contradiction, that there exists a winning vote  $W$  but the greedy strategy returns 'No'.

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$W$

x

k

**c**

d

•

•

s

b

q

# Correctness of Greedy Strategy

Suppose, for contradiction, that there exists a winning vote  $W$  but the greedy strategy returns 'No'.

Let  $P$  be the partial list constructed by greedy before termination.

$W$

x

k

**c**

d

•

•

s

b

q

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•

•

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**P**

**c**

x

q

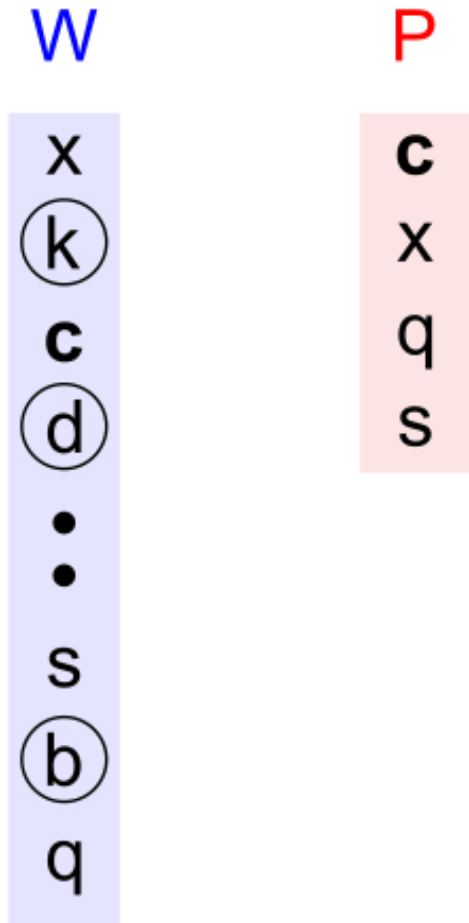
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Let  $P$  be the partial list constructed by greedy before termination.

Consider the set of candidates that were not ranked by  $P$ . Among them, let  $k$  be ranked highest in  $W$ .

Extend  $P$  by placing  $k$  in the next available position and arbitrarily ranking the remaining candidates.

$W$

x

(k)

c

(d)

•

•

s

(b)

q

$P$

c

x

q

s



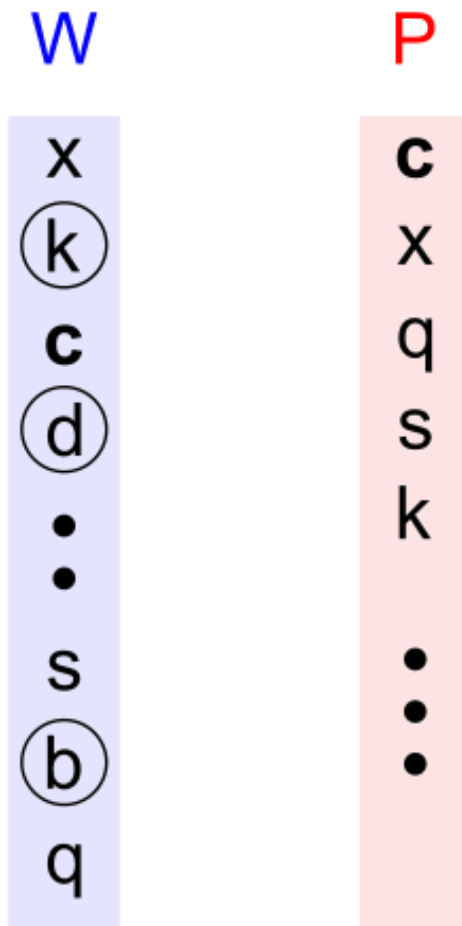
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$s(\mathbf{P}, \mathbf{c}) \geq s(\mathbf{W}, \mathbf{c})$  by monotonicity of  $s$

$\mathbf{W}$

x  
k  
c  
d  
•  
•  
s  
b  
q

$\mathbf{P}$

c  
x  
q  
s  
k  
•  
•  
•

# Correctness of Greedy Strategy

$s(P, c) \geq s(W, c)$       by monotonicity of  $s$

$s(W, c) \geq s(W, k)$       since  $c$  wins under  $W$

$W$

x  
k  
c  
d  
•  
•  
s  
b  
q

$P$

c  
x  
q  
s  
k  
•  
•  
•

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$s(W, k) \geq s(P, k)$  by monotonicity of  $s$

$W$

x

(k)

c

(d)

•

•

s

(b)

q

$P$

c

x

q

s

k

•

•

•

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$s(\mathbf{W}, \mathbf{k}) \geq s(\mathbf{P}, \mathbf{k})$       by monotonicity of  $s$

Overall,  $s(\mathbf{P}, \mathbf{c}) \geq s(\mathbf{P}, \mathbf{k})$ .

$\mathbf{W}$

x

(k)

c

(d)

•

•

s

(b)

q

$\mathbf{P}$

c

x

q

s

k

•

•

•

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$s(\mathbf{W}, \mathbf{k}) \geq s(\mathbf{P}, \mathbf{k})$       by monotonicity of  $s$

Overall,  $s(\mathbf{P}, \mathbf{c}) \geq s(\mathbf{P}, \mathbf{k})$ .

Thus,  $\mathbf{k}$  could not have prevented  $\mathbf{c}$  from winning,  
and therefore greedy should have continued.

$\mathbf{W}$

x

**k**

**c**

**d**

•

•

s

**b**

q

$\mathbf{P}$

**c**

x

q

s

k

•

•

•

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x

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x

q

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Is manipulation *always* easy?



## **The Computational Difficulty of Manipulating an Election\***

J. J. Bartholdi III, C. A. Tovey, and M. A. Trick\*\*

School of Industrial and Systems Engineering, Georgia Institute of Technology,  
Atlanta, GA 30332, USA

Received June 9, 1987 / Accepted July 29, 1988

**Abstract.** We show how computational complexity might protect the integrity of social choice. We exhibit a voting rule that efficiently computes winners but is computationally resistant to strategic manipulation. It is *NP*-complete for a manipulative voter to determine how to exploit knowledge of the preferences of others. In contrast, many standard voting schemes can be manipulated with only polynomial computational effort.

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**Single Transferable Vote (STV)**

[Xia, Zuckerman, Procaccia, Conitzer, Rosenschein, IJCAI 2009]

**Ranked Pairs**

*Consider candidate pairs according to the margin of head-to-head victories, and create a ranking based on it while avoiding cycles.*

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**NP-hardness** is **good news!**

No general-purpose efficient algorithm that correctly works on all preference profiles (unless  $P=NP$ ).

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Using **worst-case** computational hardness as a barrier to manipulation.

**Note:** NP-hard *even with* full information.



# Remember this?

Method	Criterion	Sort:																				
		Majority	Maj. loser	Mutual maj.	Condorcet	Cond. loser	Smith/ISDA	LIIA	IIA	Cloneproof	Monotone	Consistency	Participation	Reversal symmetry	Polytime/resolvable	Summable	Later-no-		No favorite betrayal	Ballot type	Ranks	
		Harm	Help	=	>2																	
Approval	Rated <sup>[a]</sup>	No	No	No <sup>[b][c]</sup>	No	No <sup>[b]</sup>	Yes	Yes <sup>[d]</sup>	Yes <sup>[c]</sup>	Yes	Yes	Yes	Yes	O(N)	Yes	O(N)	No	Yes <sup>[f]</sup>	Yes	Approvals	Yes	No
Borda count	No	Yes	No	No <sup>[b]</sup>	Yes	No	No	No	Teams	Yes	Yes	Yes	Yes	O(N)	Yes	O(N)	No	Yes	No	Ranking	Yes	Yes
Bucklin	Yes	Yes	Yes	No	No	No	No	No	No	Yes	No	No	No	O(N)	Yes	O(N)	No	Yes	If equal preferences	Ranking	Yes	Yes
Copeland	Yes	Yes	Yes	Yes	Yes	Yes	No	No <sup>[b]</sup>	Teams, crowds	Yes	No <sup>[b]</sup>	No <sup>[b]</sup>	Yes	O(N <sup>2</sup> )	No	O(N <sup>2</sup> )	No <sup>[b]</sup>	No	No <sup>[b]</sup>	Ranking	Yes	Yes
IRV (AV)	Yes	Yes	Yes	No <sup>[b]</sup>	Yes	No <sup>[b]</sup>	No	No	Yes	No	No	No	No	O(N <sup>2</sup> )	Yes <sup>[g]</sup>	O(N) <sup>[h]</sup>	Yes	Yes	No	Ranking	No	Yes
Kemeny–Young	Yes	Yes	Yes	Yes	Yes	Yes	Yes	No <sup>[b]</sup>	Spoilers	Yes	No <sup>[b]</sup> <sub>[i]</sub>	No <sup>[b]</sup>	Yes	O(N!)	Yes	O(N <sup>2</sup> ) <sup>[j]</sup>	No <sup>[b]</sup>	No	No <sup>[b]</sup>	Ranking	Yes	Yes
Highest median/Majority judgment <sup>[k]</sup>	Rated <sup>[l]</sup>	Yes <sup>[m]</sup>	No <sup>[n]</sup>	No <sup>[b][c]</sup>	No	No <sup>[b]</sup>	Yes	Yes <sup>[d]</sup>	Yes	Yes	No <sup>[o]</sup>	No <sup>[p]</sup>	Depends <sup>[q]</sup>	O(N)	Yes	O(N) <sup>[r]</sup>	No <sup>[s]</sup>	Yes	Yes	Scores <sup>[t]</sup>	Yes	Yes
Minimax	Yes	No	No	Yes <sup>[u]</sup>	No	No	No	No <sup>[b]</sup>	Spoilers	Yes	No <sup>[b]</sup>	No <sup>[b]</sup>	No	O(N <sup>2</sup> )	Yes	O(N <sup>2</sup> )	No <sup>[b][v]</sup>	No	No <sup>[b]</sup>	Ranking	Yes	Yes
Plurality/FPTP	Yes	No	No	No <sup>[b]</sup>	No	No <sup>[b]</sup>	No	No	Spoilers	Yes	Yes	Yes	No	O(N)	Yes	O(N)	N/A <sup>[v]</sup>	N/A <sup>[v]</sup>	No	Single mark	N/A	No
Score voting	No	No	No	No <sup>[b][c]</sup>	No	No <sup>[b]</sup>	Yes	Yes <sup>[d]</sup>	Yes	Yes	Yes	Yes	Yes	O(N)	Yes	O(N)	No	Yes	Yes	Scores	Yes	Yes
Ranked pairs	Yes	Yes	Yes	Yes	Yes	Yes	Yes	No <sup>[b]</sup>	Yes	Yes	No <sup>[b]</sup>	No <sup>[p][b]</sup>	Yes	O(N <sup>3</sup> )	Yes	O(N <sup>2</sup> )	No <sup>[b]</sup>	No	No <sup>[p][b]</sup>	Ranking	Yes	Yes
Runoff voting	Yes	Yes	No	No <sup>[b]</sup>	Yes	No <sup>[b]</sup>	No	No	Spoilers	No	No	No	No	O(N) <sup>[w]</sup>	Yes	O(N) <sup>[w]</sup>	Yes	Yes <sup>[x]</sup>	No	Single mark	N/A	No <sup>[y]</sup>
Schulze	Yes	Yes	Yes	Yes	Yes	Yes	No	No <sup>[b]</sup>	Yes	Yes	No <sup>[b]</sup>	No <sup>[p][b]</sup>	Yes	O(N <sup>3</sup> )	Yes	O(N <sup>2</sup> )	No <sup>[b]</sup>	No	No <sup>[p][b]</sup>	Ranking	Yes	Yes
STAR voting	No <sup>[z]</sup>	Yes	No <sup>[aa]</sup>	No <sup>[b][c]</sup>	Yes	No <sup>[b]</sup>	No	No	No	Yes	No	No	Depends <sup>[ab]</sup>	O(N)	Yes	O(N <sup>2</sup> )	No	No	No <sup>[ac]</sup>	Scores	Yes	Yes
Sortition, arbitrary winner <sup>[ad]</sup>	No	No	No	No <sup>[b]</sup>	No	No <sup>[b]</sup>	Yes	Yes	No	Yes	Yes	Yes	Yes	O(1)	No	O(1)	Yes	Yes	Yes	None	N/A	N/A
Random ballot <sup>[ae]</sup>	No	No	No	No <sup>[b]</sup>	No	No <sup>[b]</sup>	Yes	Yes	Yes	Yes	Yes	Yes	Yes	O(N)	No	O(N)	Yes	Yes	Yes	Single mark	N/A	No

# Single manipulator

Plurality

P

[Bartholdi, Tovey and Trick, SCW 1989]

Borda

P

[Bartholdi, Tovey and Trick, SCW 1989]

Copeland<sup>α</sup>

(friendly tie-breaking)

P

[Bartholdi, Tovey and Trick, SCW 1989]

Ranked pairs

NP-hard

[Xia, Zuckerman, Procaccia, Conitzer,  
and Rosenschein, IJCAI 2009]

Schulze

P

[Parkes and Xia, AAI 2012]

## Single manipulator

## Two manipulators

Plurality

P

[Bartholdi, Tovey and Trick, SCW 1989]

P

Borda

P

[Bartholdi, Tovey and Trick, SCW 1989]

NP-hard

[Betzler, Niedermeier and Woeginger, IJCAI 2011;  
Davies, Katsirelos, Narodytska and Walsh, AAI 2011]

Copeland<sup>α</sup>

(friendly tie-breaking)

P

[Bartholdi, Tovey and Trick, SCW 1989]

NP-hard

[Faliszewski, Hemaspaandra and Schnoor,  
AAMAS 2008]

Ranked pairs

NP-hard

[Xia, Zuckerman, Procaccia, Conitzer,  
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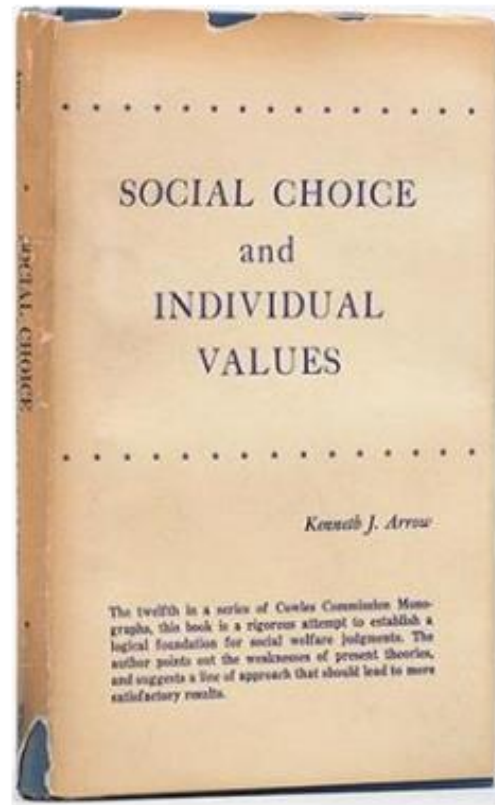
Schulze

P

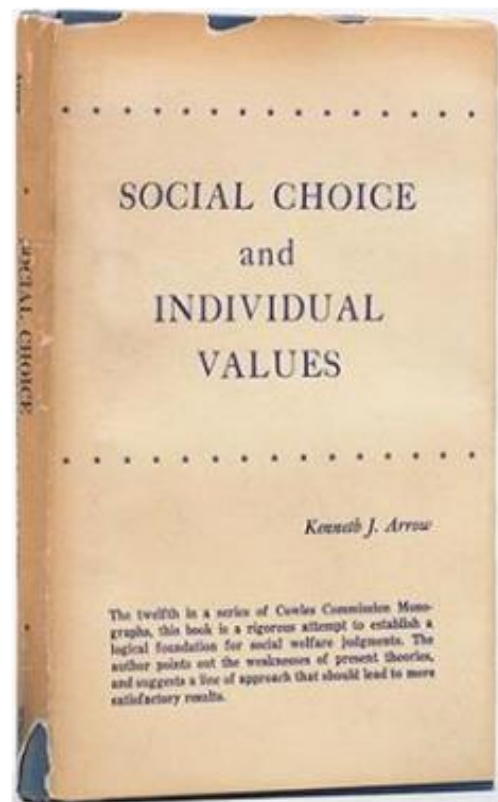
[Parkes and Xia, AAI 2012]

P

[Gaspers, Kalinowski, Narodytska and Walsh,  
AAMAS 2013]



Social Choice Theory



Social Choice Theory

Soc Choice Welfare (1989) 6:227-241

**Social Choice  
and Welfare**  
© Springer-Verlag 1989

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Computational Social Choice

Enough about voting. Let's talk sports!

# ELIMINATION IN SPORTS

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Imagine we are at the halfway point of a sports tournament.



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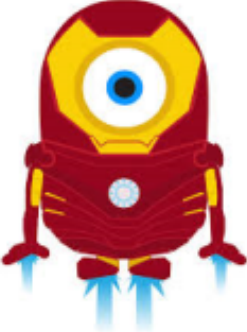
Some games have been played, others are still to go.

# ELIMINATION IN SPORTS

Imagine we are at the halfway point of a sports tournament.

Some games have been played, others are still to go.

Q: Does my favorite team still have a chance of winning?



6



8



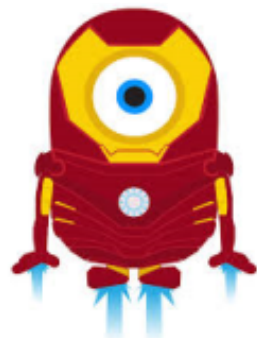
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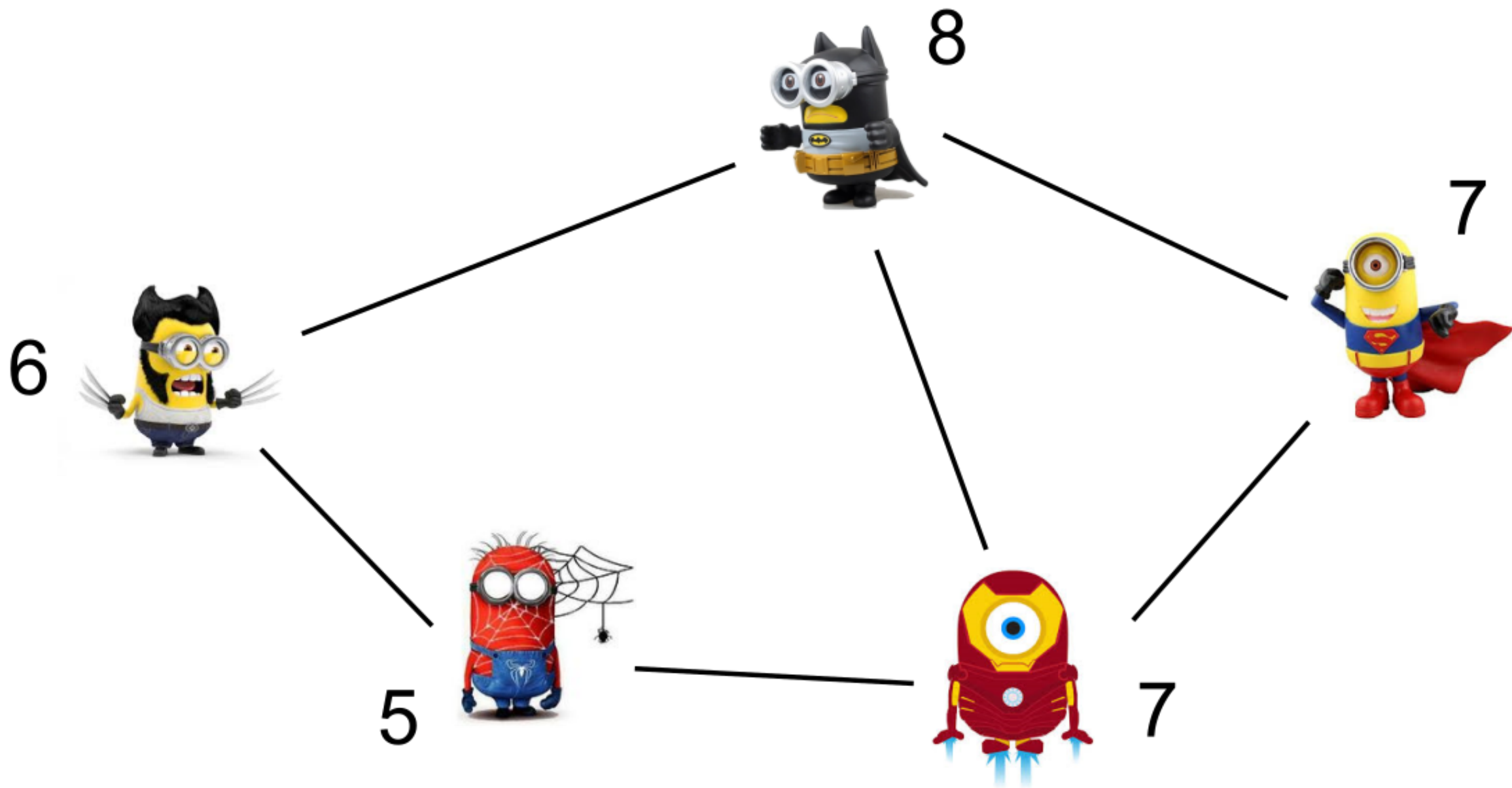


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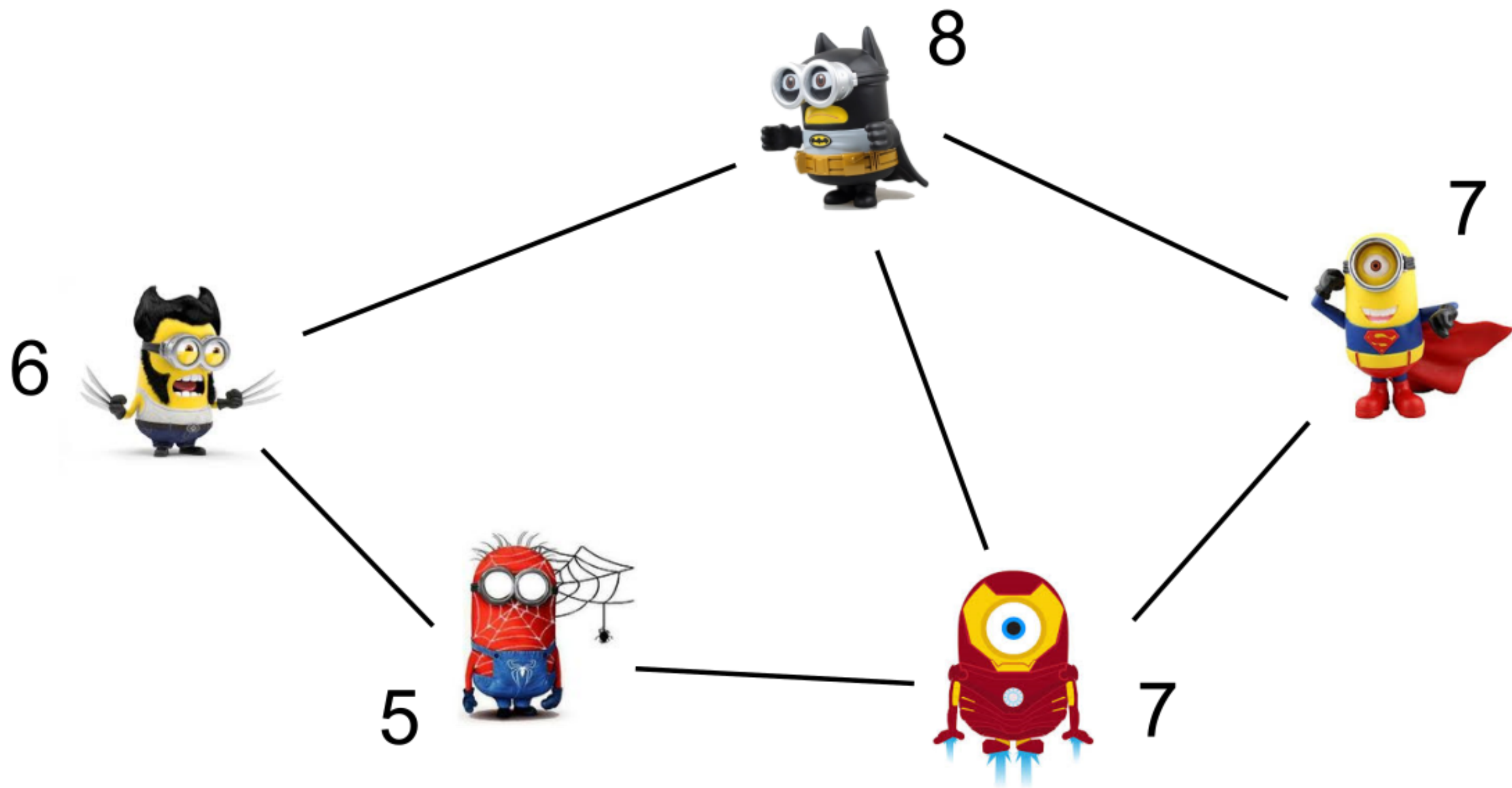


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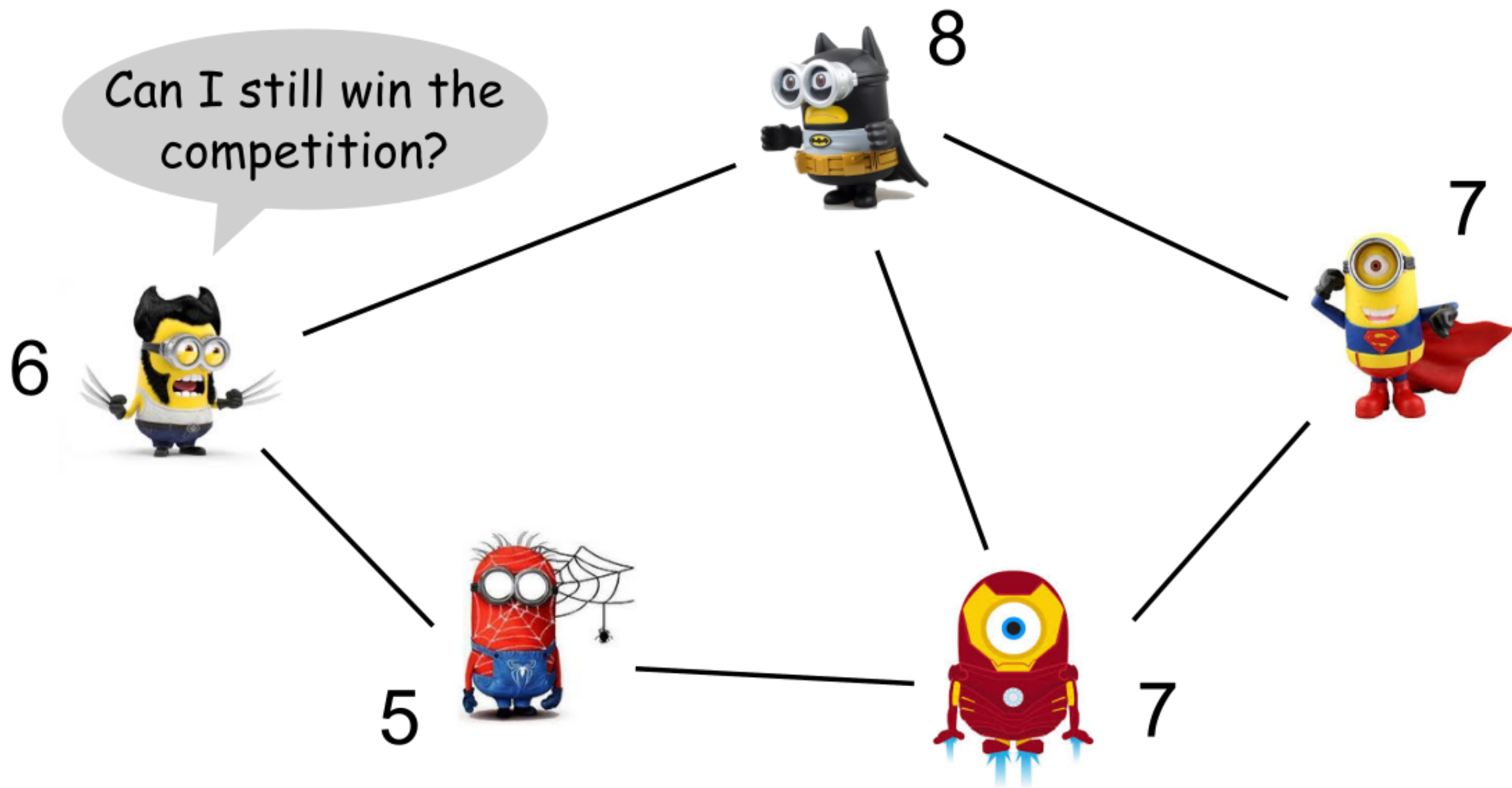




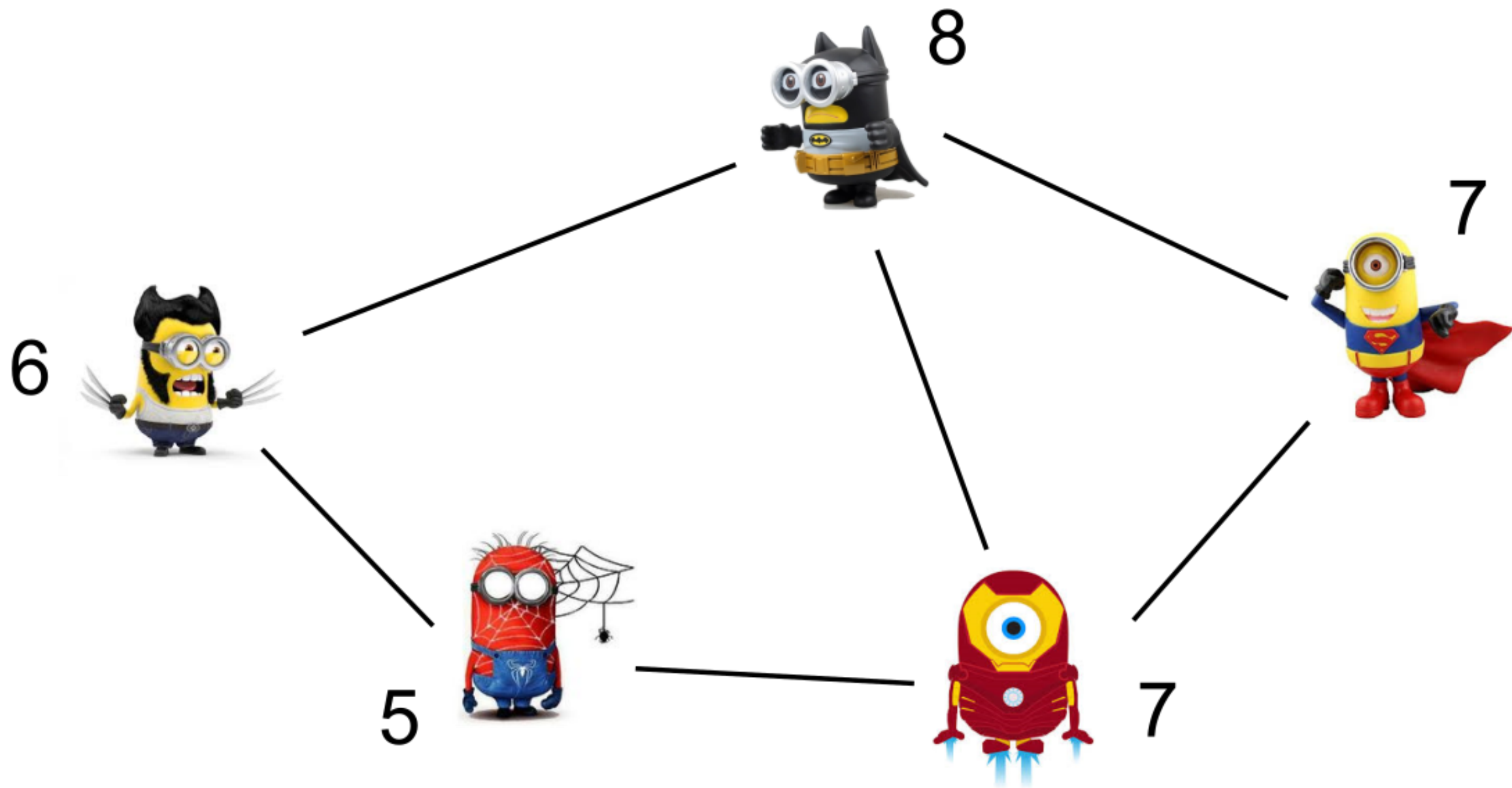
After each game, winner gets 1 point, loser get 0. No ties.



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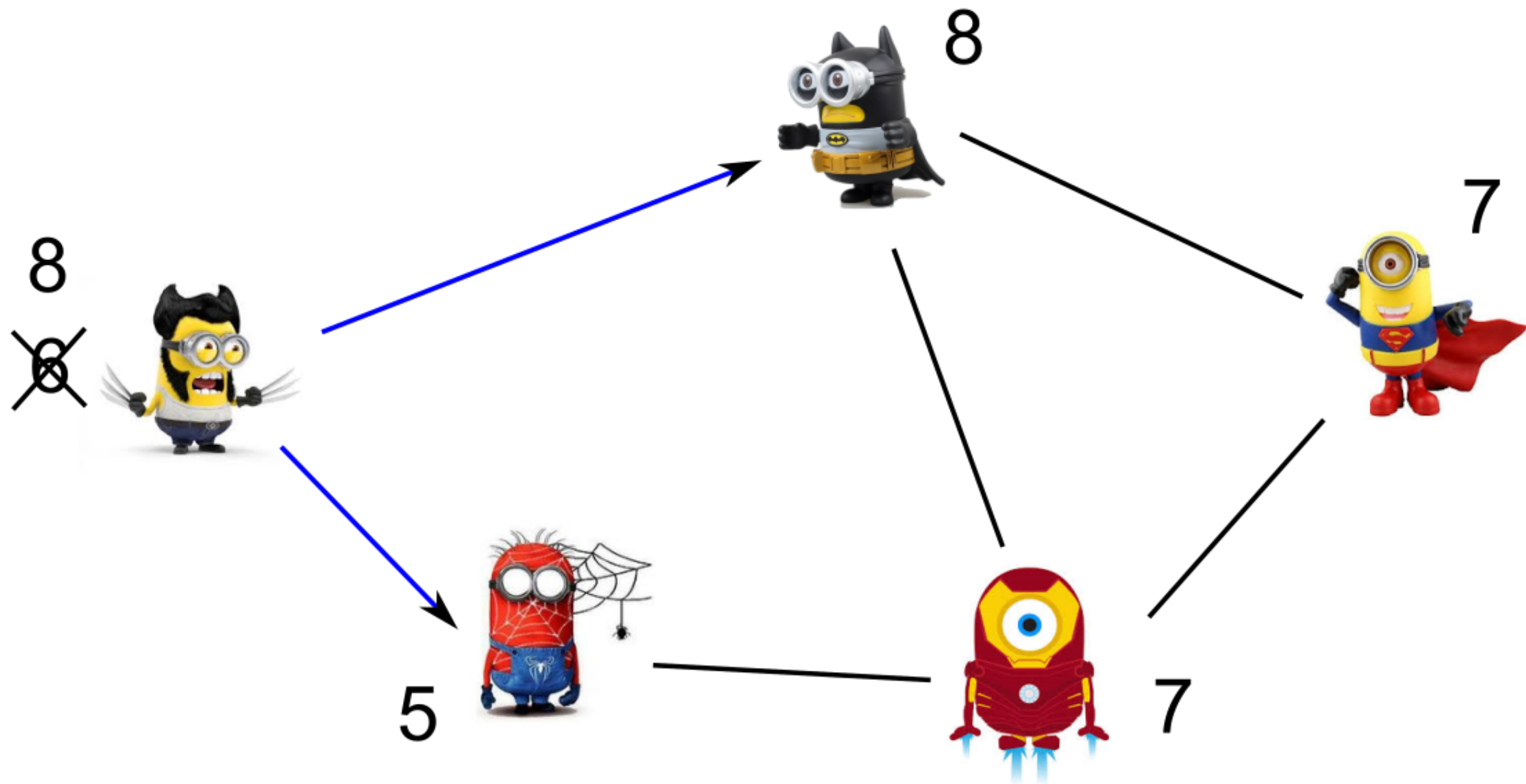


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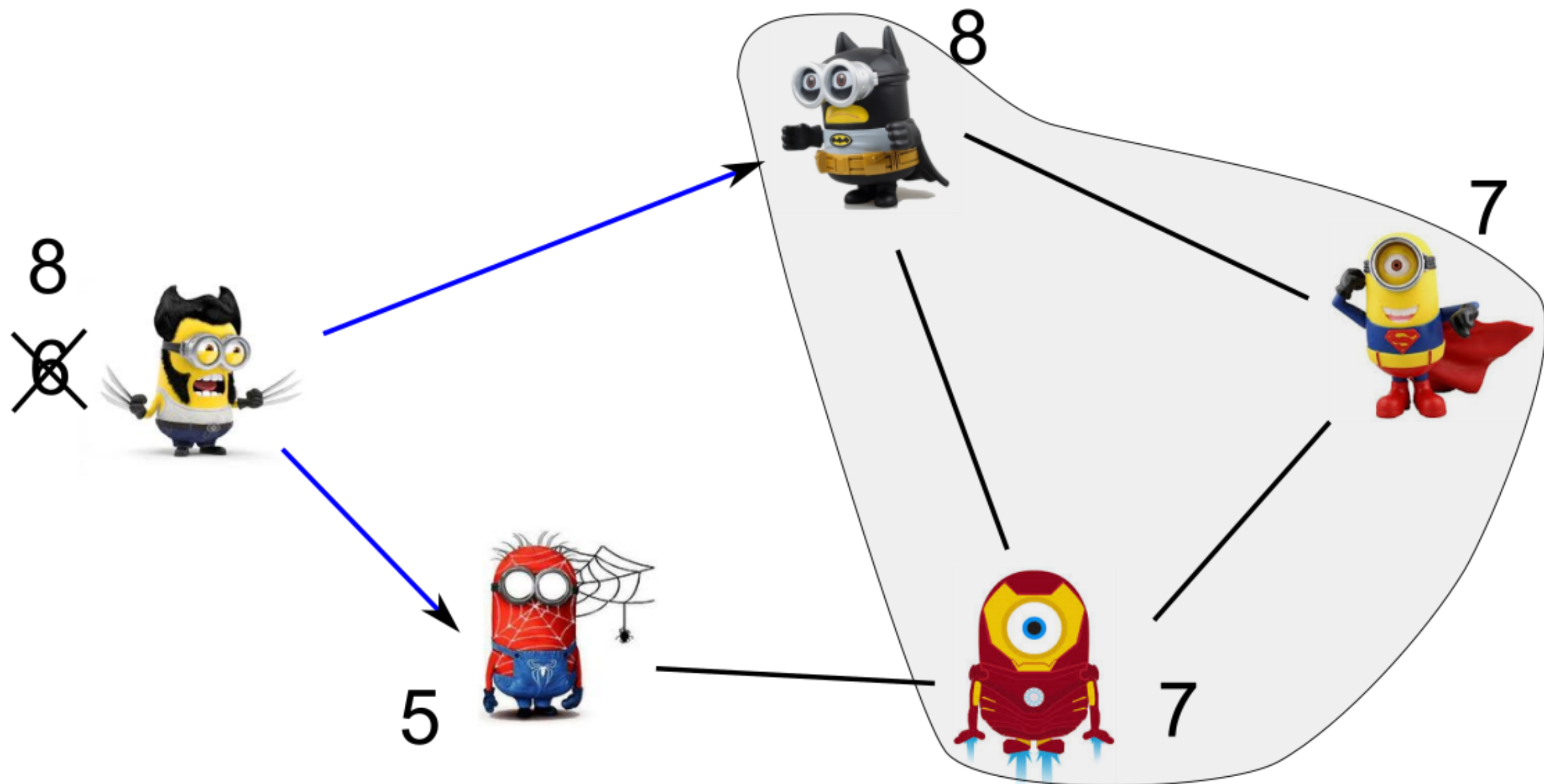




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One of these three will end up with at least 9 points

~~8~~



5



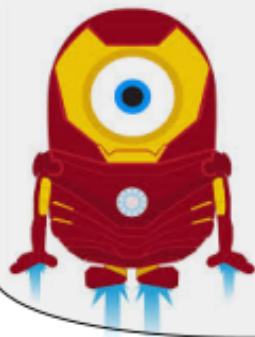
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7



7




We will solve this problem using **max flow**.

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Step 1: Imagine  wins all its remaining games.


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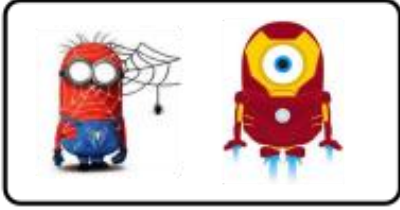
Doing so freezes the score of 

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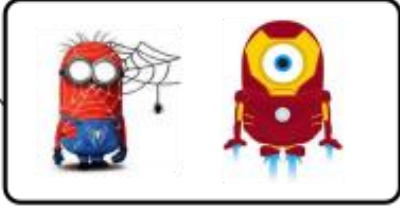
Doing so freezes the score of 

**Step 2:** Set up a flow network to check for a winning schedule.



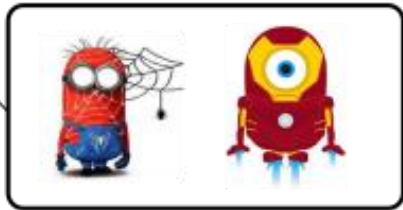
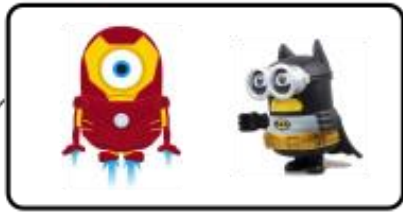


S



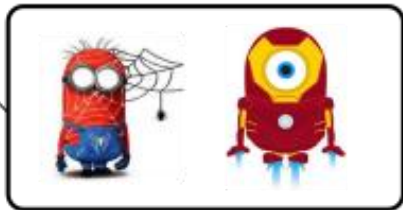
Cap = # points at stake  
in each game

S



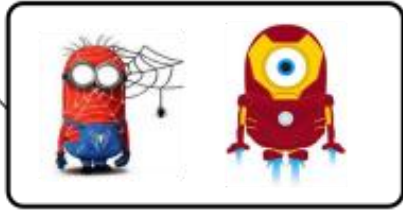
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S



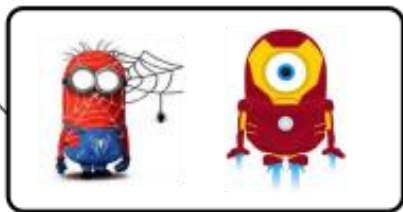
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S

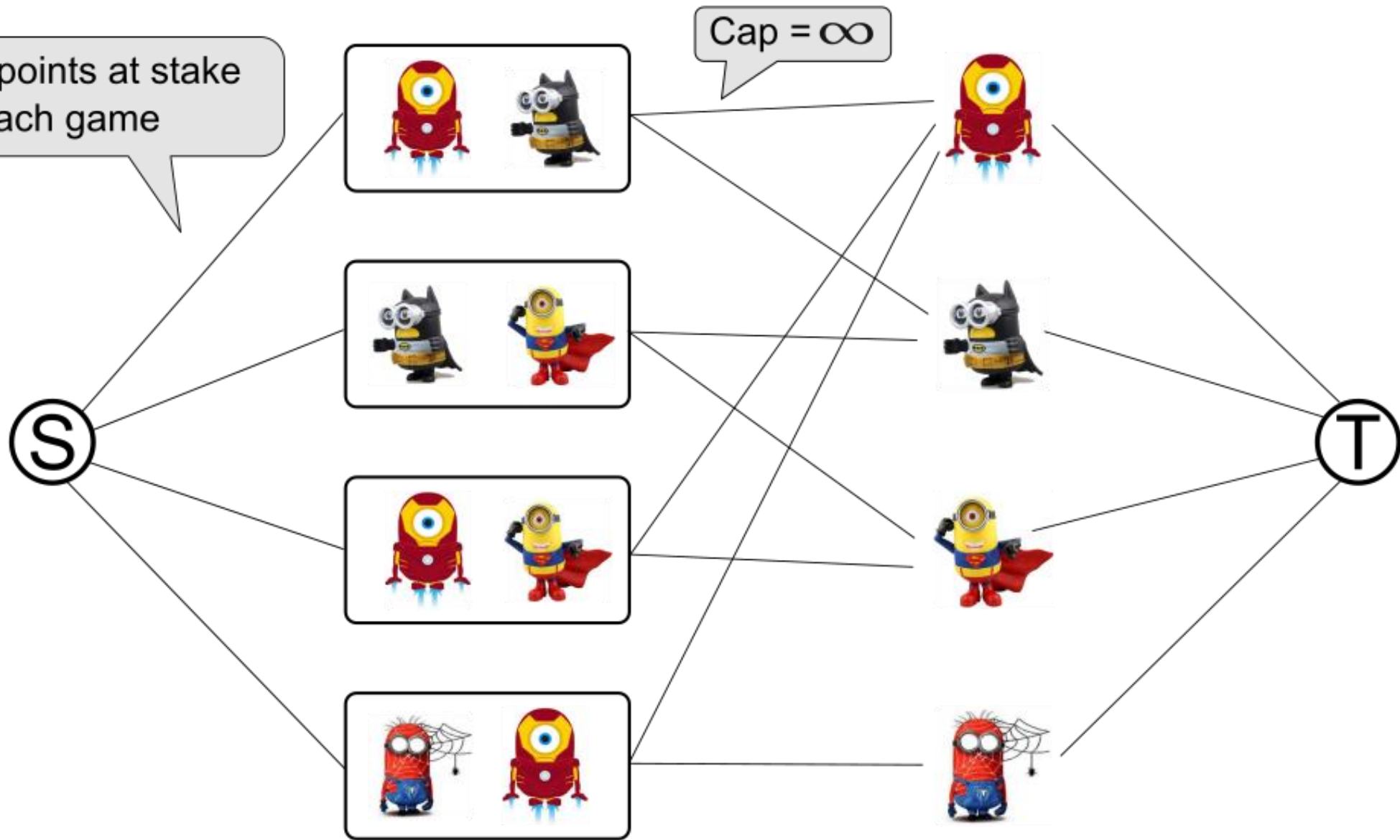


Cap =  $\infty$

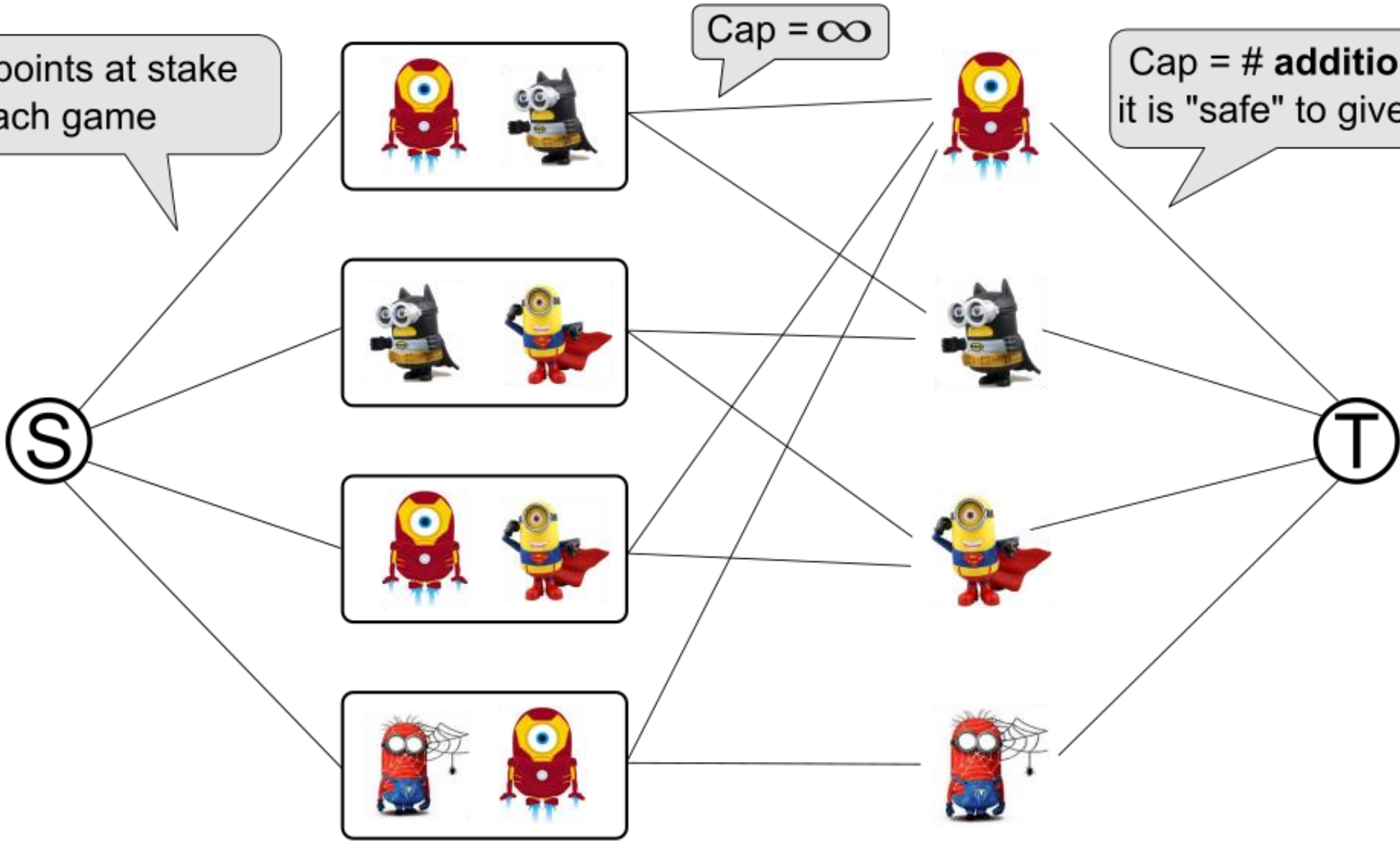


Cap = # points at stake  
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Cap =  $\infty$

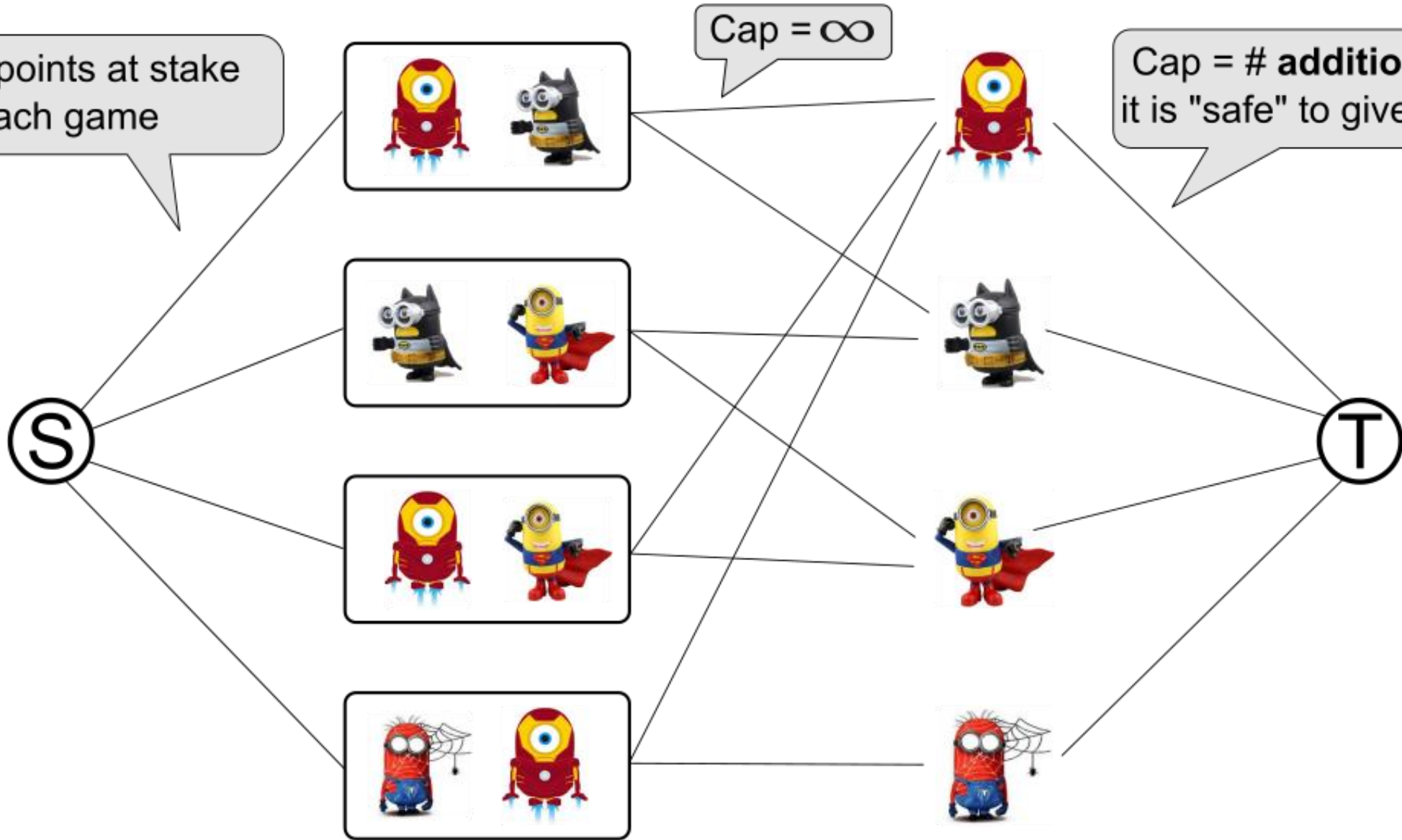


Cap = # points at stake in each game



Cap = # **additional** points it is "safe" to give to a team

Cap = # points at stake in each game



Cap = ∞

Cap = # **additional** points it is "safe" to give to a team

There is a max flow that saturates the edges of S ⇔ There is a winning schedule.



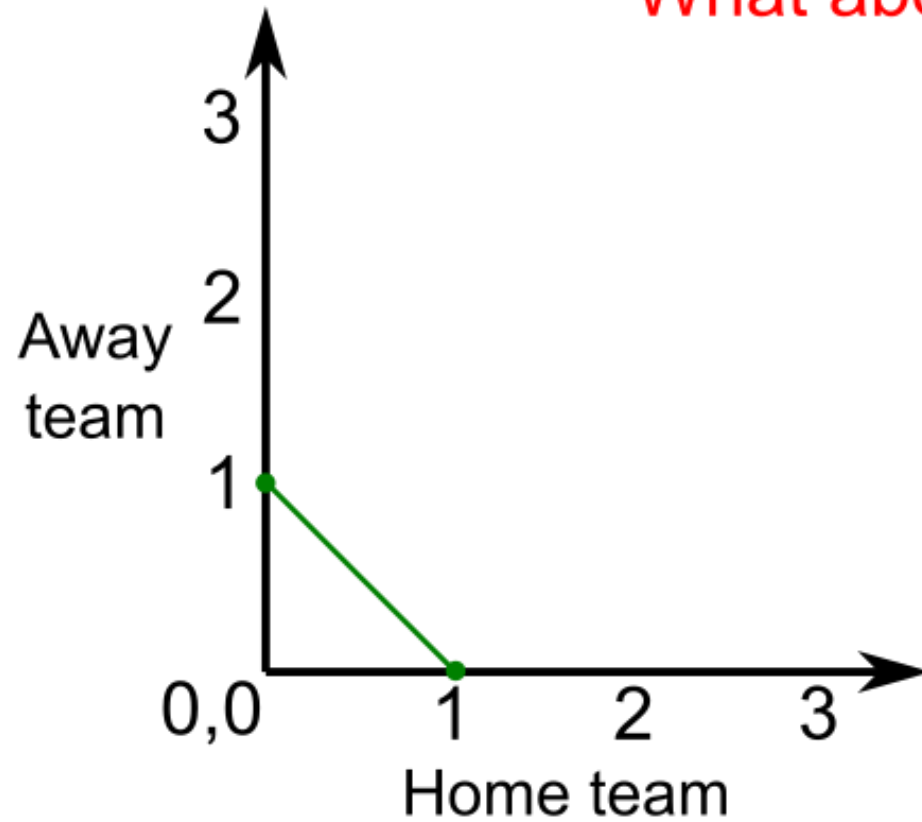
The minion championship used a  $\{(0,1),(1,0)\}$  point system.

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What about other point systems?

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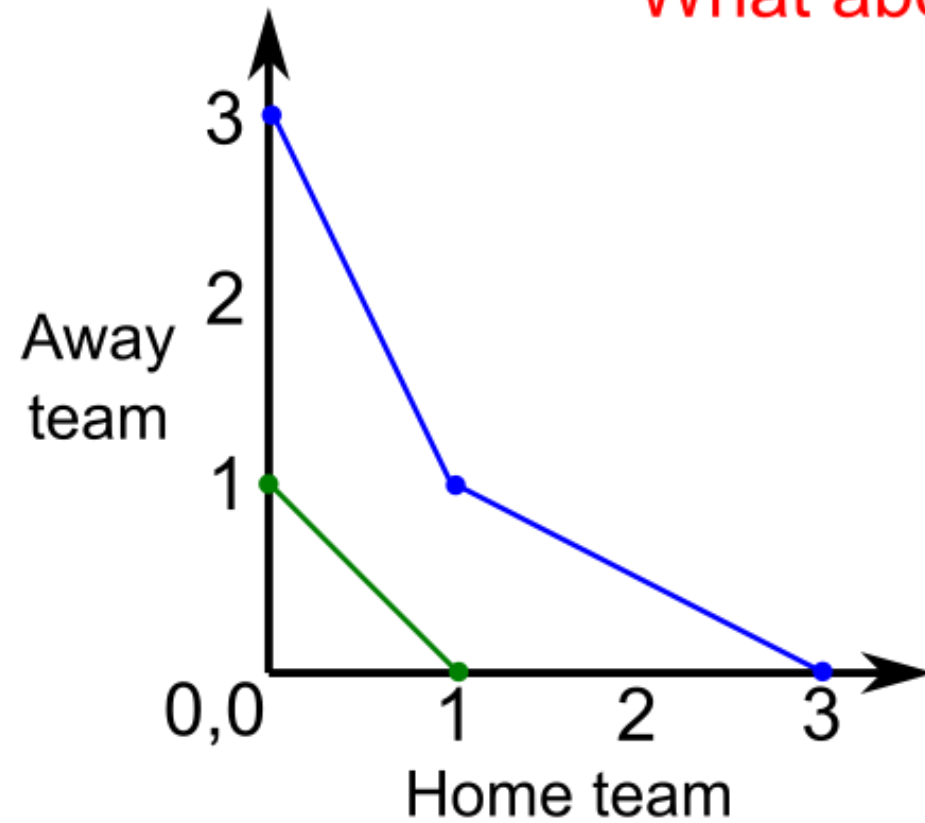
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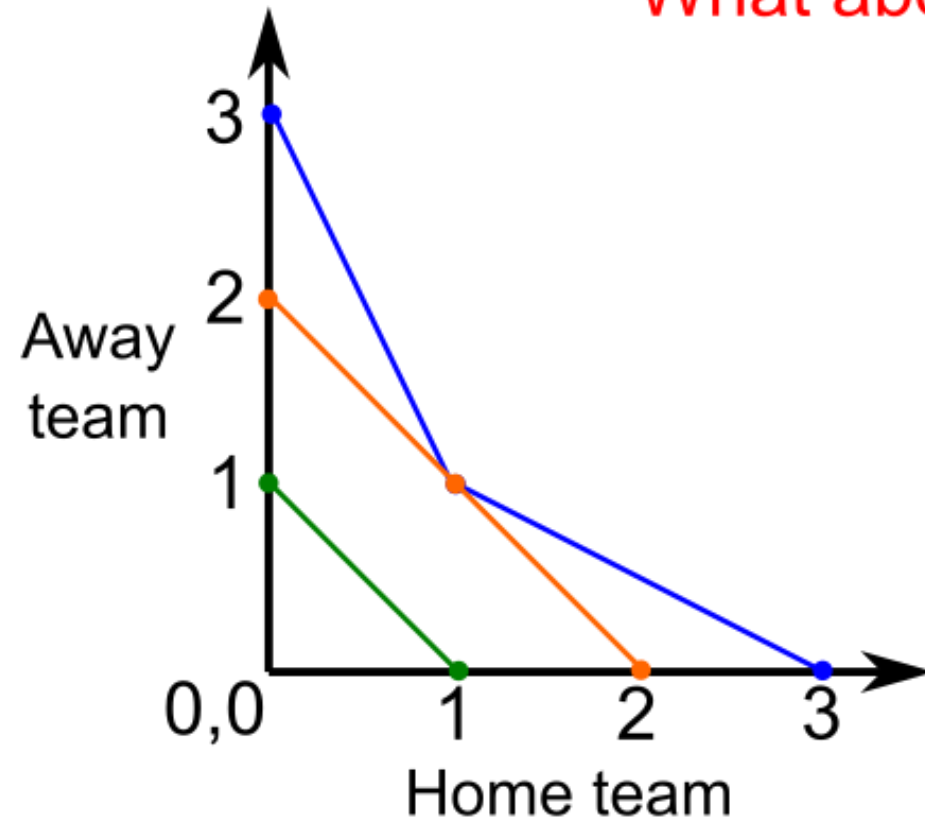
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$\{(0,3),(1,1),(3,0)\}$

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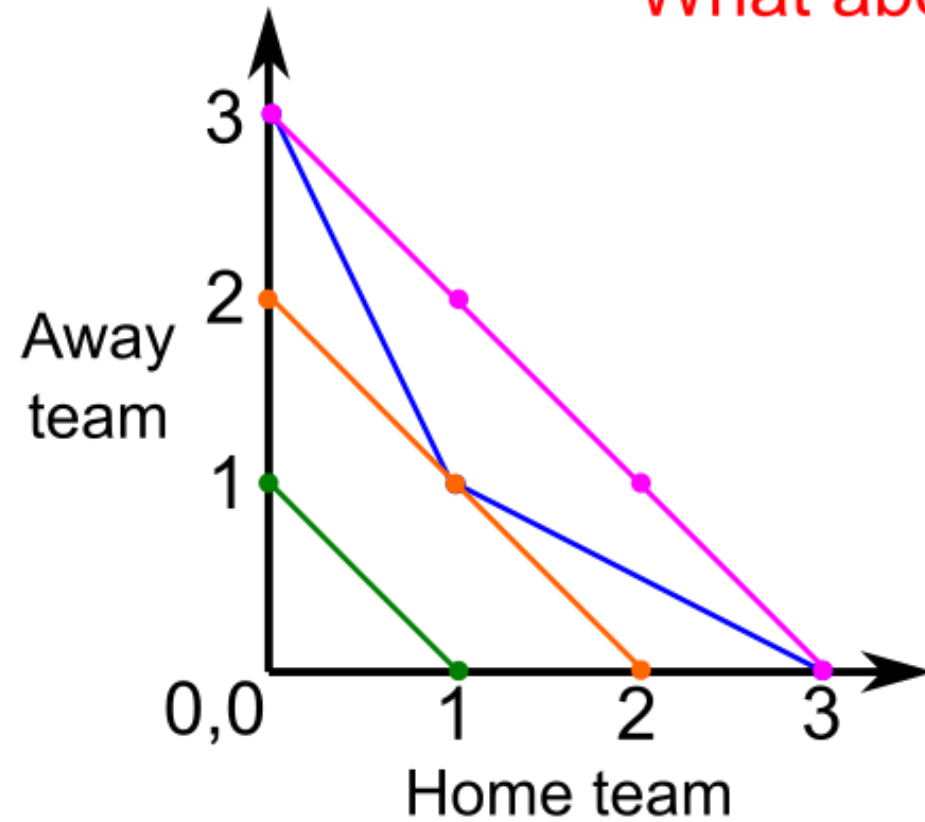
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$\{(0,2),(1,1),(2,0)\}$

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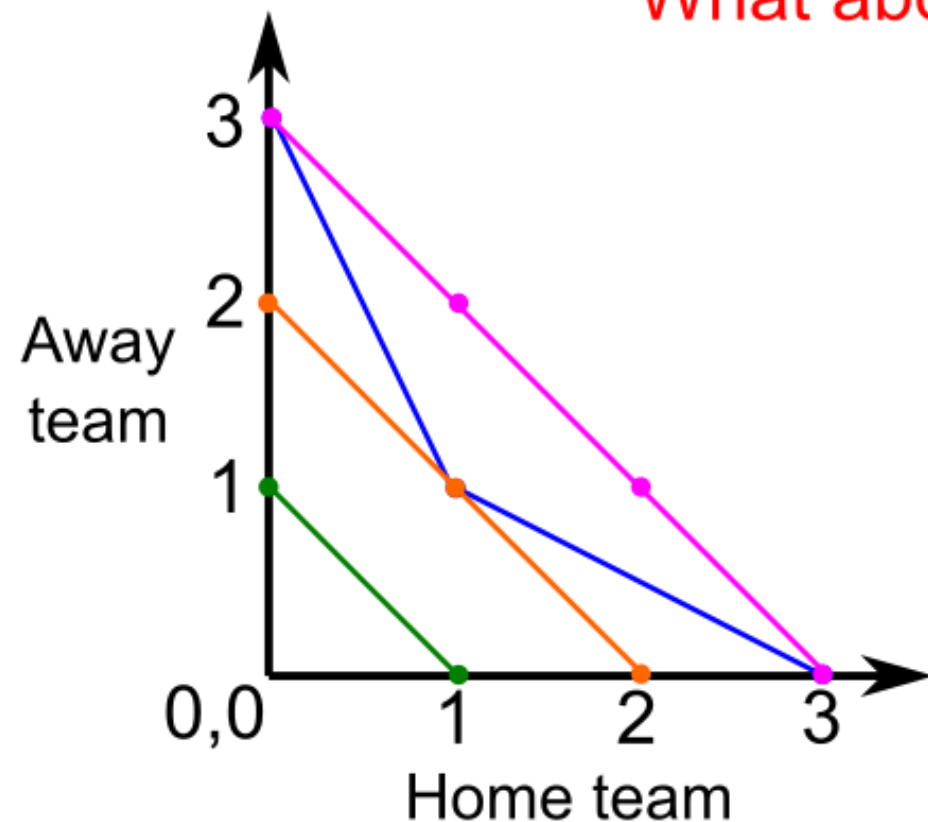
$\{(0,2),(1,1),(2,0)\}$



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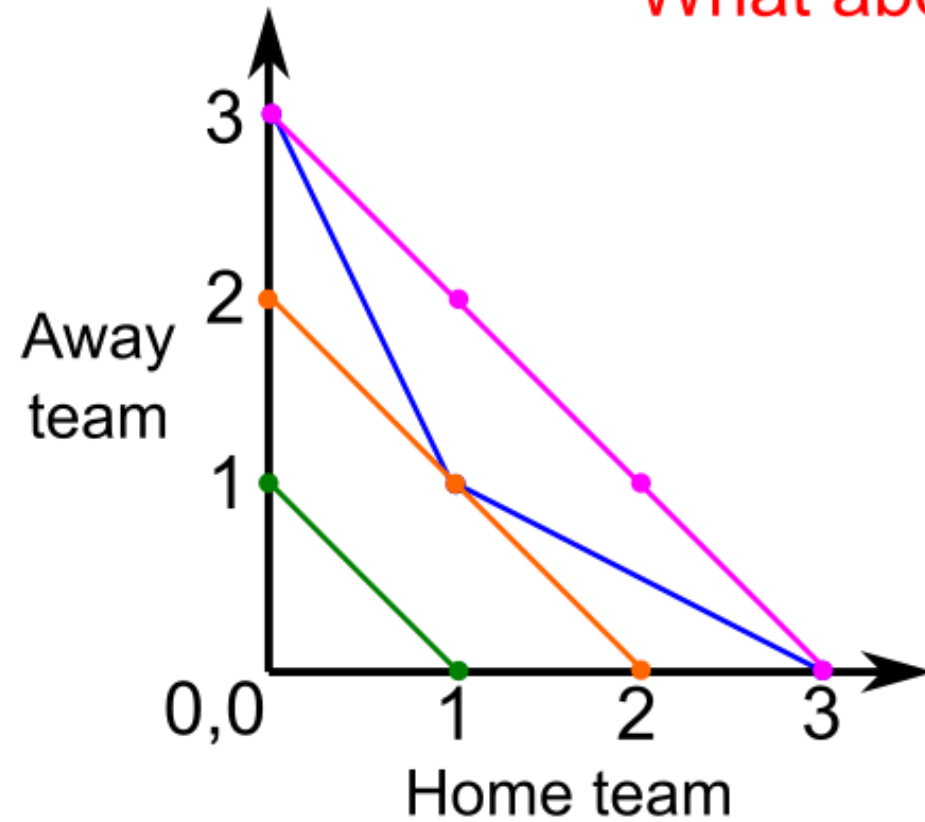
$\{(0,3),(1,2),(2,1),(3,0)\}$

[Kern and Paulusma, Disc. Opt. 2004]

Elimination problem is **NP-complete** for all point systems except for those that "line up nicely".

The minion championship used a  $\{(0,1),(1,0)\}$  point system.

What about other point systems?



$\{(0,1),(1,0)\}$



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$\{(0,2),(1,1),(2,0)\}$



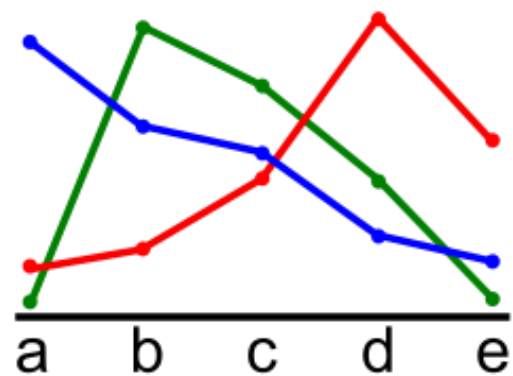
$\{(0,3),(1,2),(2,1),(3,0)\}$

Football is computationally harder than chess and ice hockey.



# Next Time

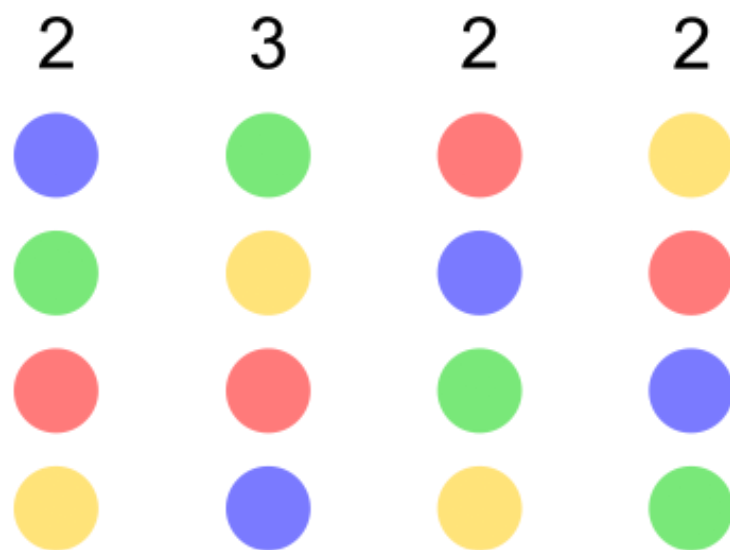
Circumventing negative results  
with structured preferences



# Quiz

# Quiz

Is there a voter who can manipulate under STV by swapping exactly one pair of candidates?



Tie-breaking rule



# References

- “Sports elimination via max flow” with IPL teams:  
<https://www.youtube.com/watch?v=XK6qZjHWo9A>
- When it’s easy to recognize the *existence* of a beneficial manipulation but hard to *find* a manipulative vote.

“Search versus Decision for Election Manipulation Problems”  
Hemaspaandra, Hemaspaandra, and Menton  
<https://dl.acm.org/doi/10.1145/3369937>

