

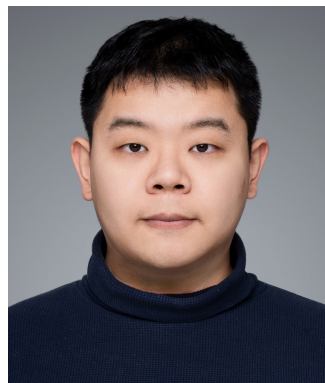
Incentives for Early Arrival in Cooperative Games

(AAMAS24 Best Paper)

Yaoxin Ge¹, Yao Zhang¹, **Dengji Zhao**¹, Zhihao Gavin Tang², Hu Fu², Pinyan Lu²

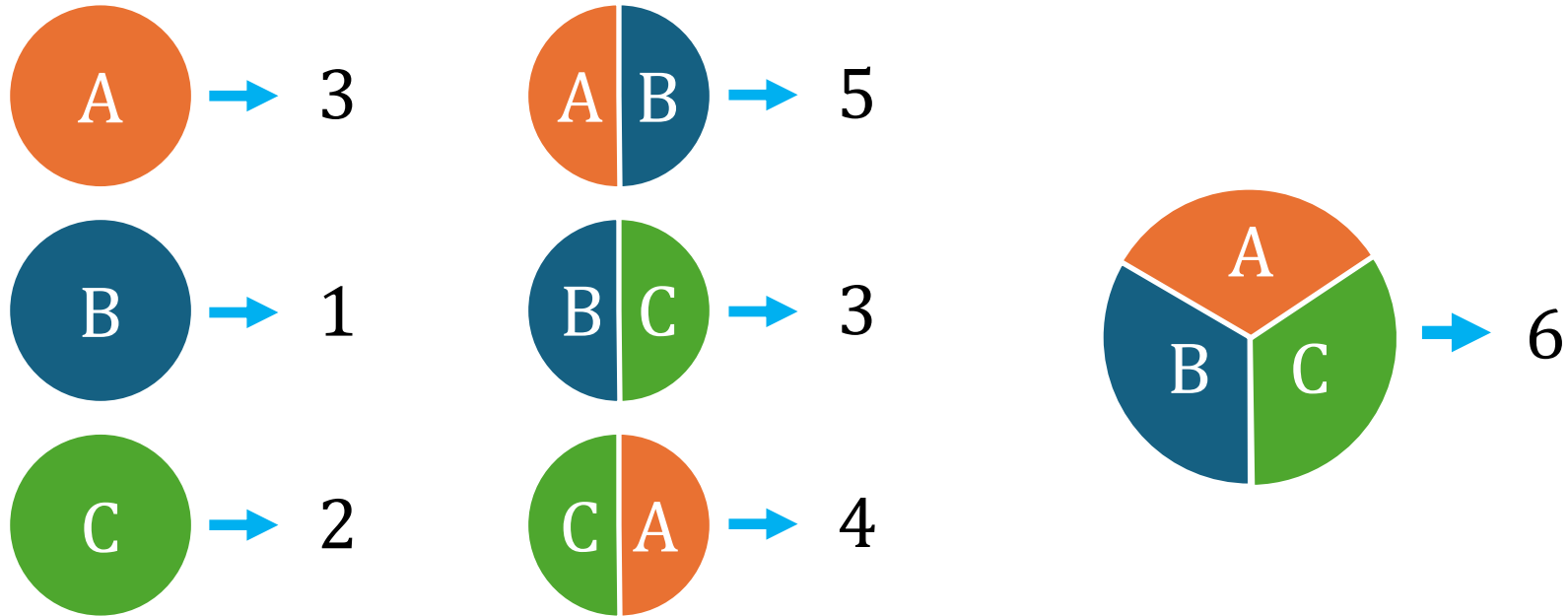
¹ShanghaiTech University

²Shanghai University of Finance and Economics



Cooperative Game

- Players cooperate to create different values



- Determine how to share the value:

Shapley value, core, ...

Cooperative Game and Shapley Value

- Players: $N = \{A, B, C\}$
- Valuation Function: $v: 2^N \rightarrow \mathbf{R}$
- Marginal Contribution: $MC(i, v, S) = v(S) - v(S \setminus i), \forall i \in S$

- Shapley Value:

$$SV_i(v) := \frac{1}{|N|!} \sum_{S \subseteq N \setminus \{i\}} |S|! (|N| - |S| - 1) MC(i, v, S \cup \{i\})$$

The averaged marginal contribution on all possible joining orders.

Shapley Value

- SV: Averaged MC on all orders

• E.g.

Coalition	A	B	C	AB	AC	BC	ABC
Value	3	1	2	5	4	3	6



2 **2** 2



1 2 **3**



3 2 1



3 1 2



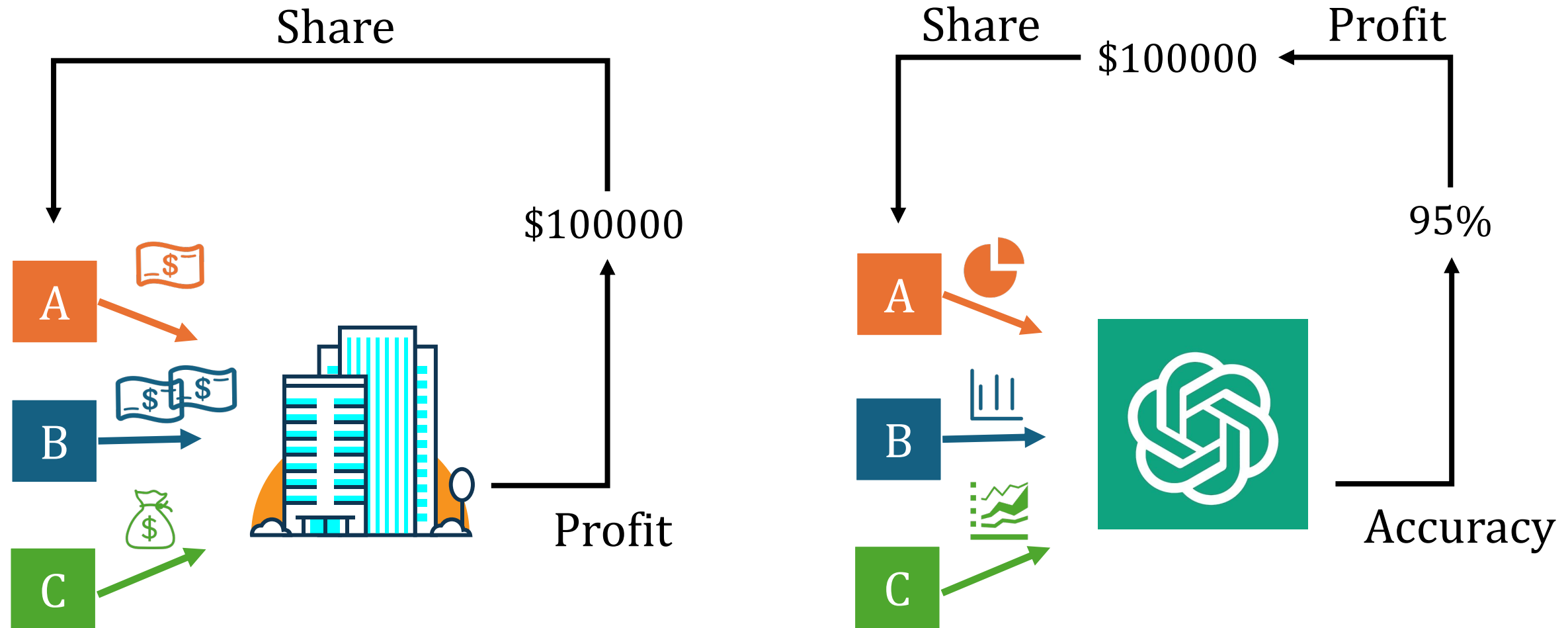
2 1 **3**



1 **4** 1

$$SV_A = \frac{2 + 3 + 3 + 3 + 3 + 4}{6} = 3$$

Venture Capital / Data Acquisition: **Join Order Matters**



Online Cooperative Games

Joining Order	A	B	C	Unknown
Value after joining	3	5	6	...
Marginal Contribution (MC)	3	2	1	...
The Value Share				?

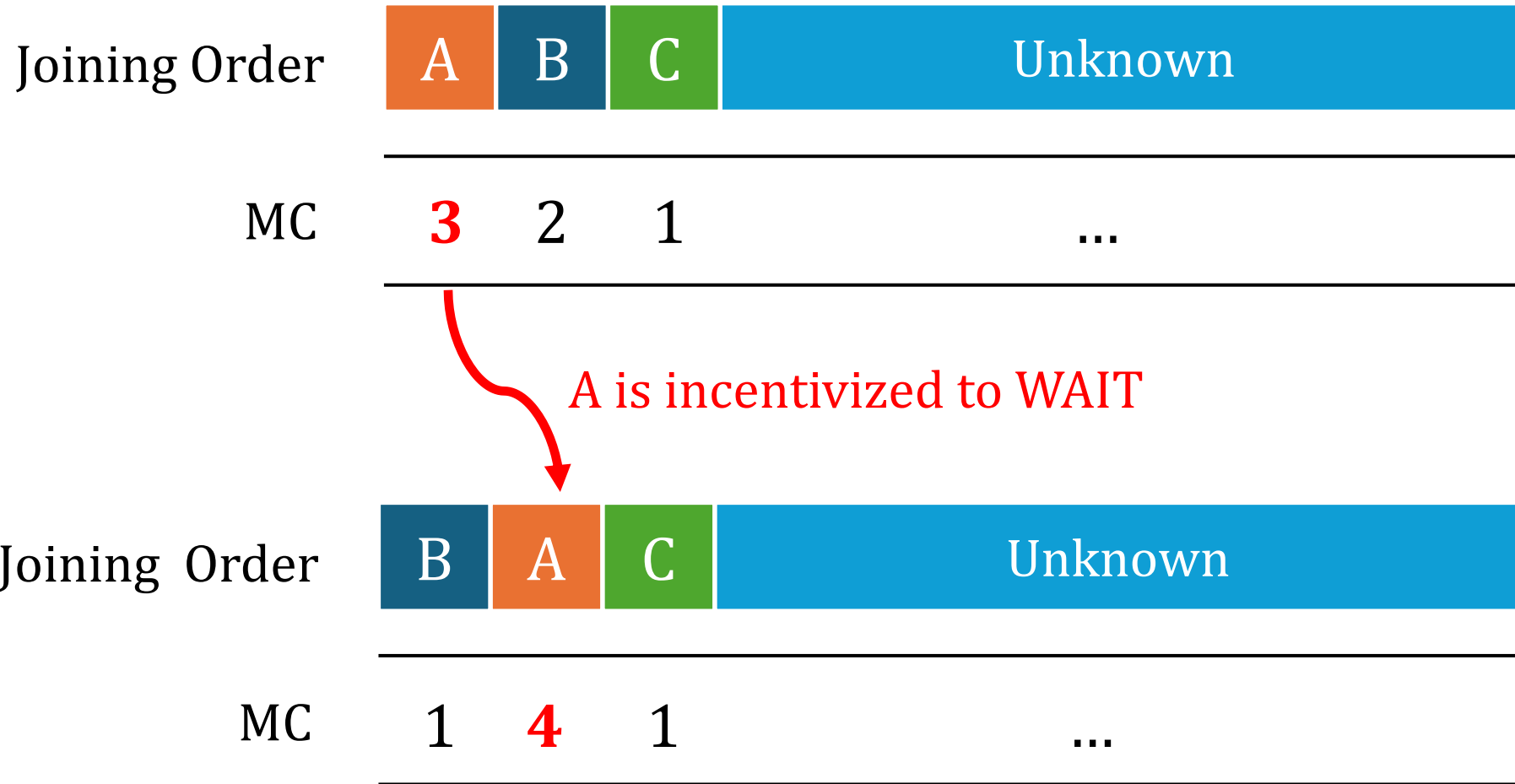
Online Cooperative Game Model

- Players: $N = \{A, B, C\}$
- Valuation Function: $v: 2^N \rightarrow \mathbf{R}$
- **Joining Order:** $\pi \in \Pi(N)$ (a permutation of players)
- Marginal Contribution: $MC(i, v, S) = v(S) - v(S \setminus i), \forall i \in S$

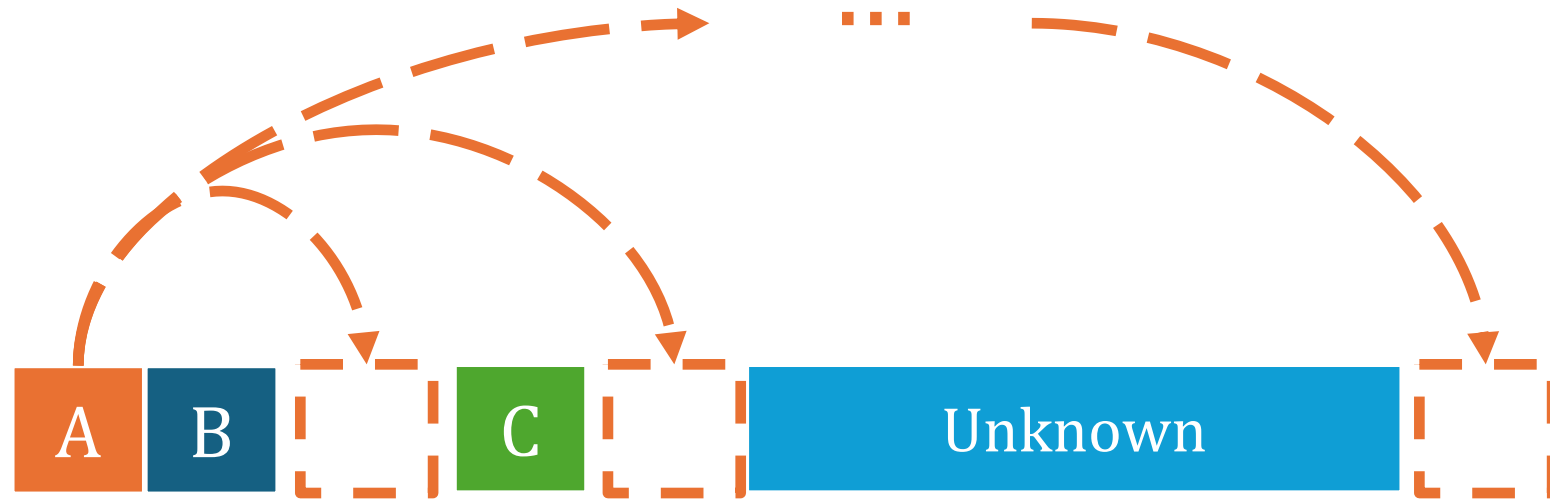
- Shapley Value:

$$SV_i(v) := \frac{1}{|N|!} \sum_{S \subseteq N \setminus \{i\}} |S|! (|N| - |S| - 1) MC(i, v, S \cup \{i\})$$

How to share the value: *Marginal Contribution*

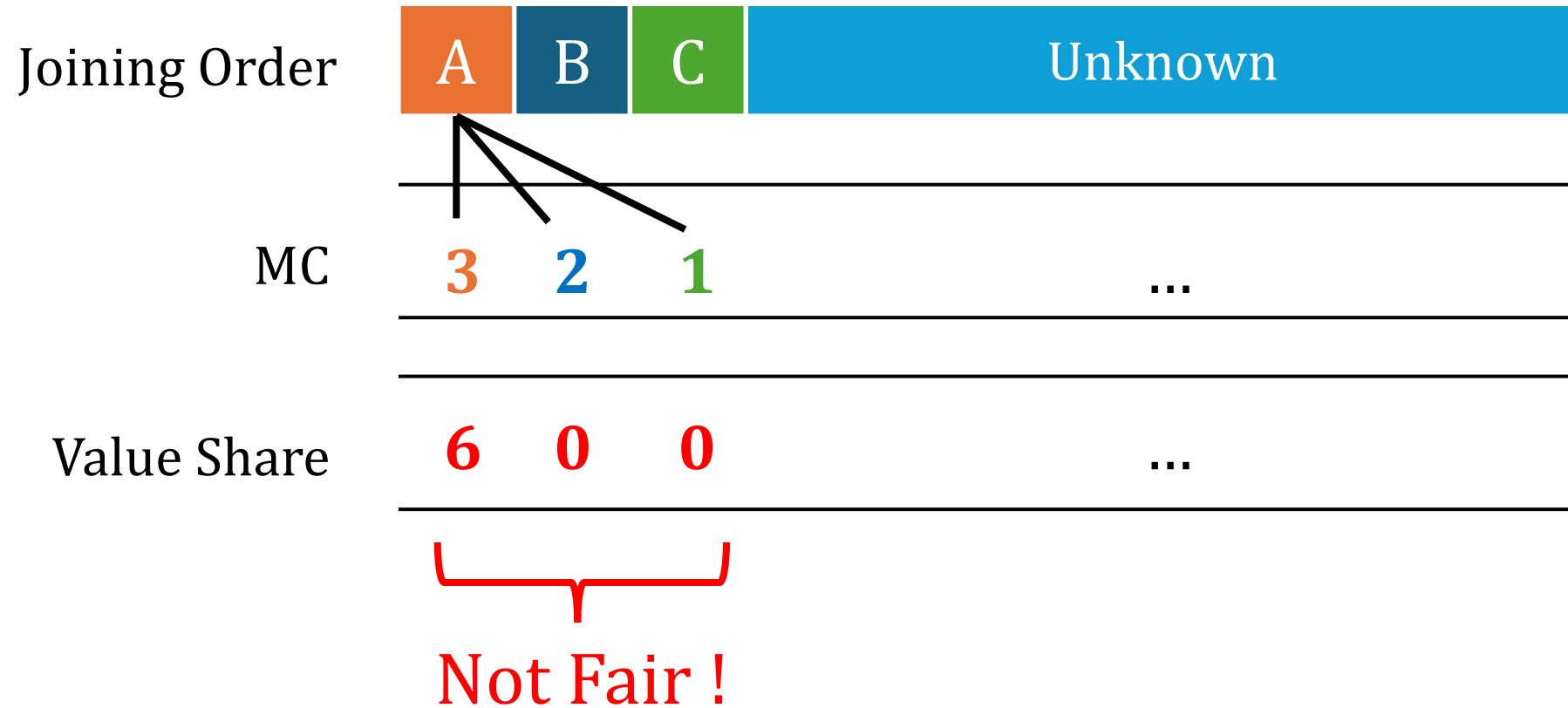


Incentivizing for Early Arrival (I4EA)

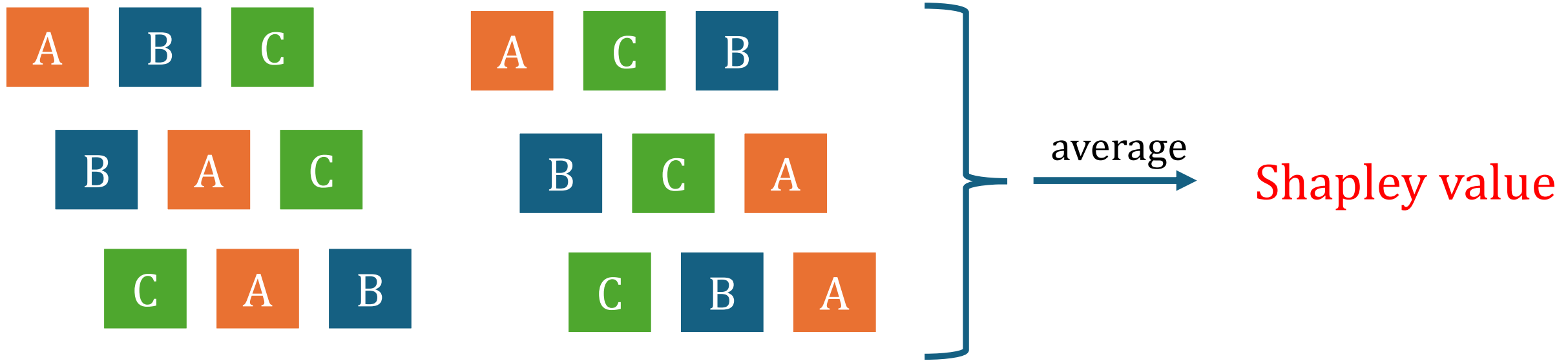


I4EA: When the order of others are fixed, the players are *incentivized to join as soon as possible*.

One Solution: *The First Gets All*

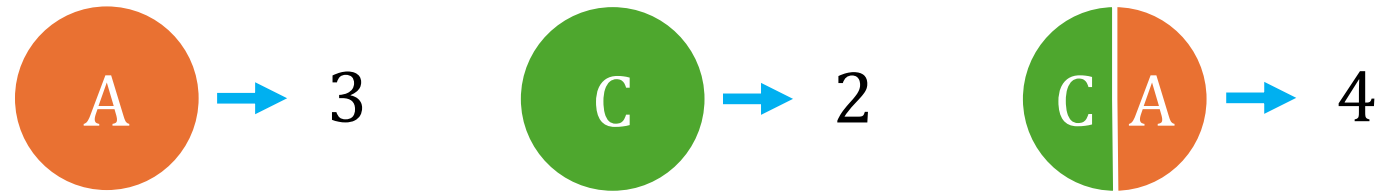


One Fairness: Shapley Fair (SF)



SF: The expected share to a player equals her *Shapley value*.

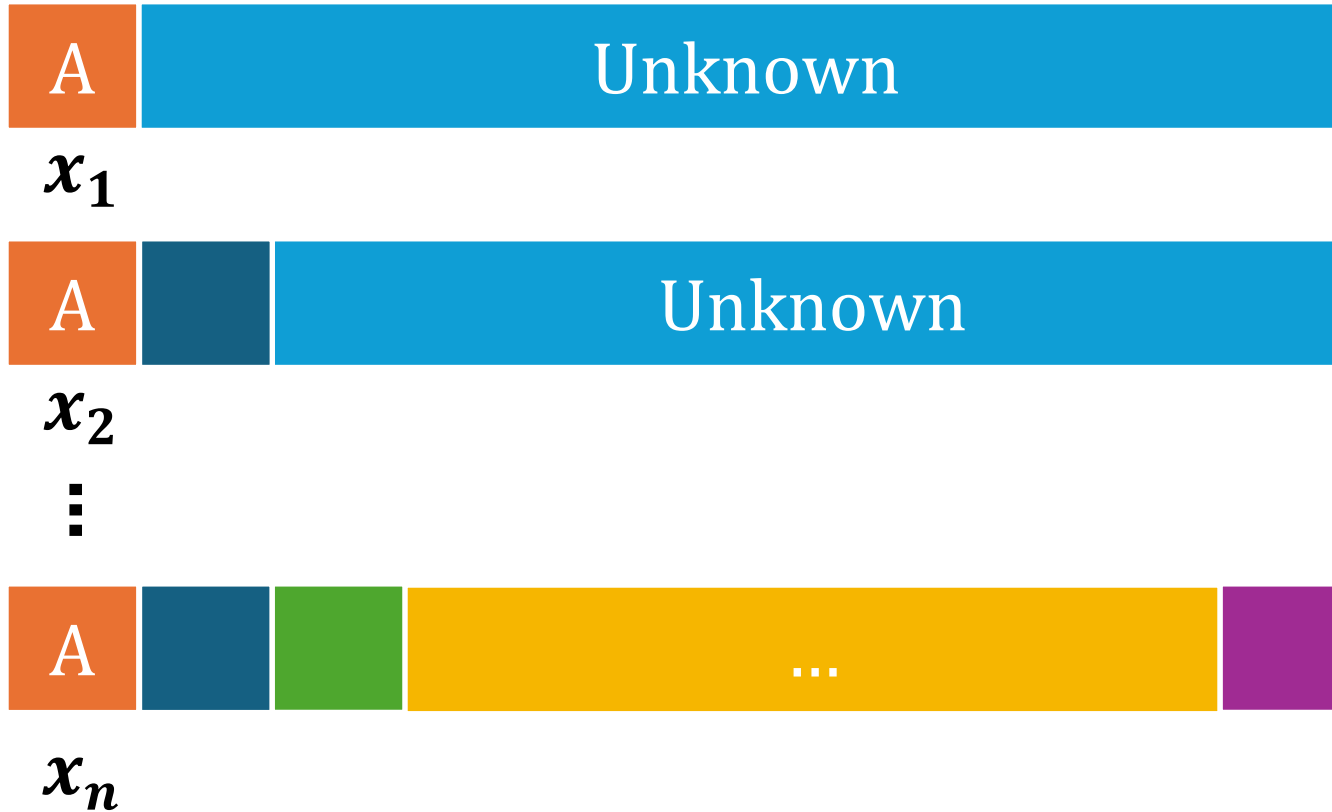
Shapley value?



Order	
Shapley value	3 ...
Order	
Shapley value	2.5 1.5 ...

A's share Decreases!

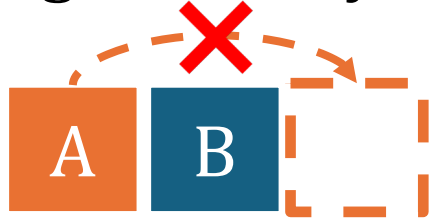
Online Individual Rational (OIR)



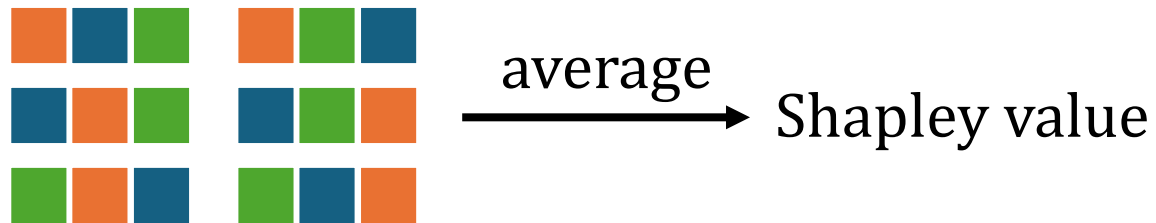
OIR: $x_n \geq \dots \geq x_2 \geq x_1 \geq \mathbf{0}$ (*non-decreasing, non-negative*)

All the Desire Properties

- Incentivizing For Early Arrival (I4EA)



- Shapley-fair (SF)



- Online Individual Rational (OIR)

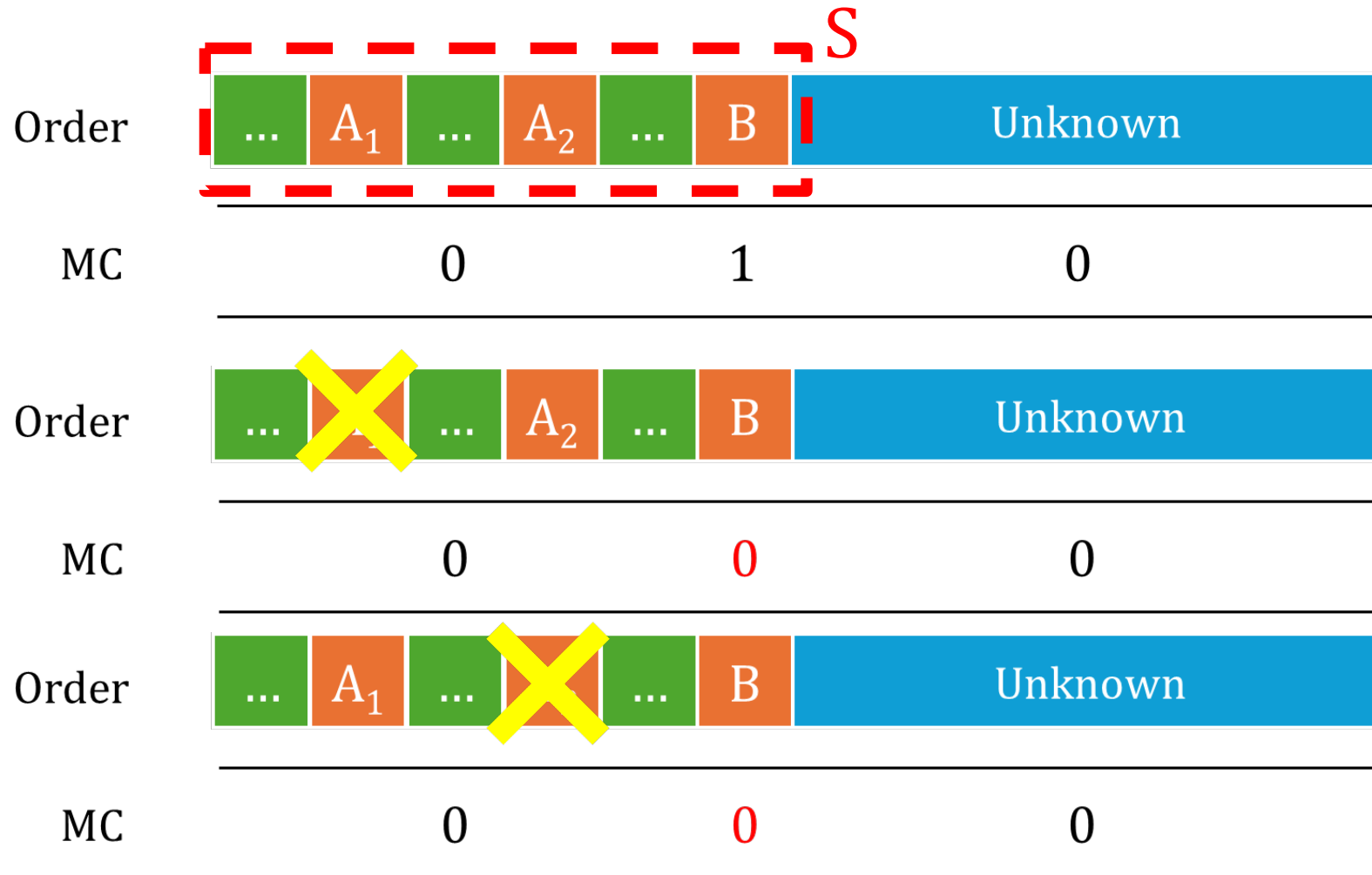


Start with 0-1 Valued Monotone Games: $A_1 \wedge A_2 \wedge B$

Order	...			B	Unknown				
Value	0	...	0	1	1	1	...	1	
MC	0	...	0	1	0	0	...	0	

Marginal Player: B is the only player who creates a MC of 1.

0-1 Valued Monotone Games: $A_1 \wedge A_2 \wedge B$

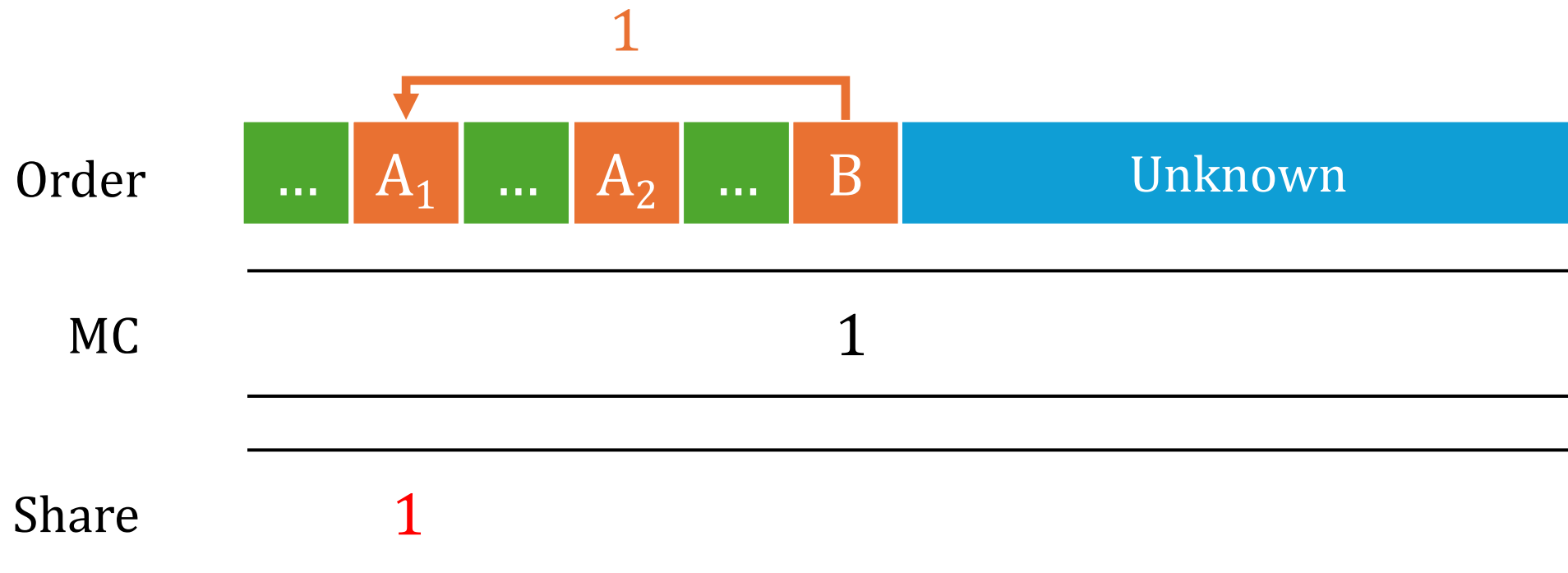


Critical Players: $\{i \mid v(S \setminus \{i\}) = 0\}$

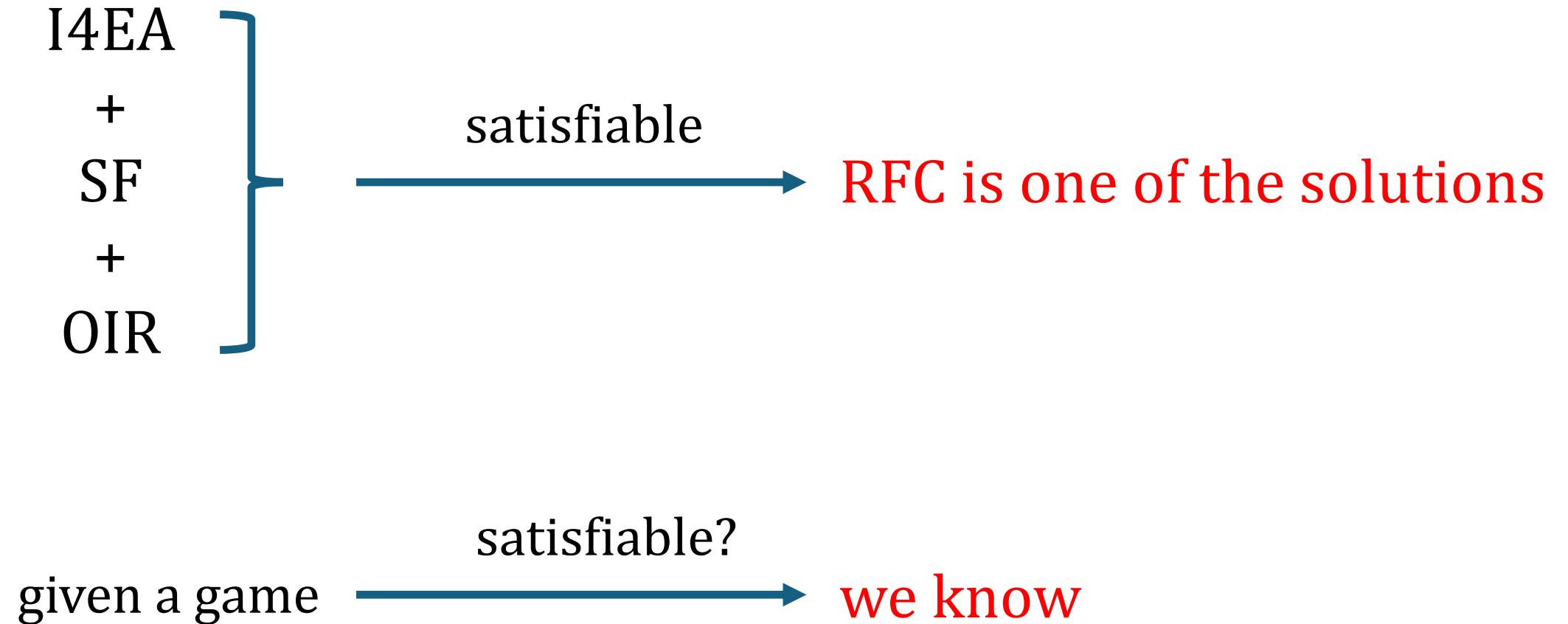
Reward First Critical Player (RFC)

Definition: RFC

Give the MC of the marginal player to the first critical player in S .



Properties Overview



Properties of RFC

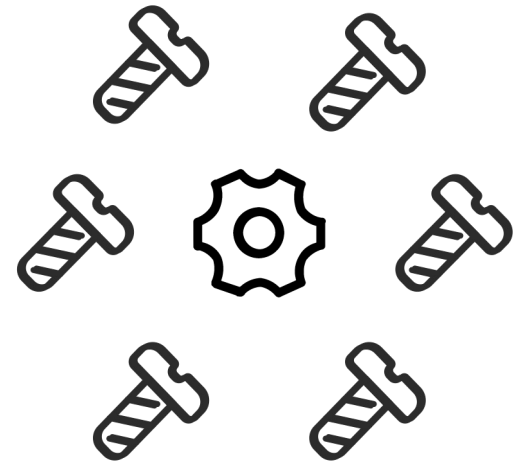
Theorem

RFC is SF and OIR on every 0-1 valued monotone game.

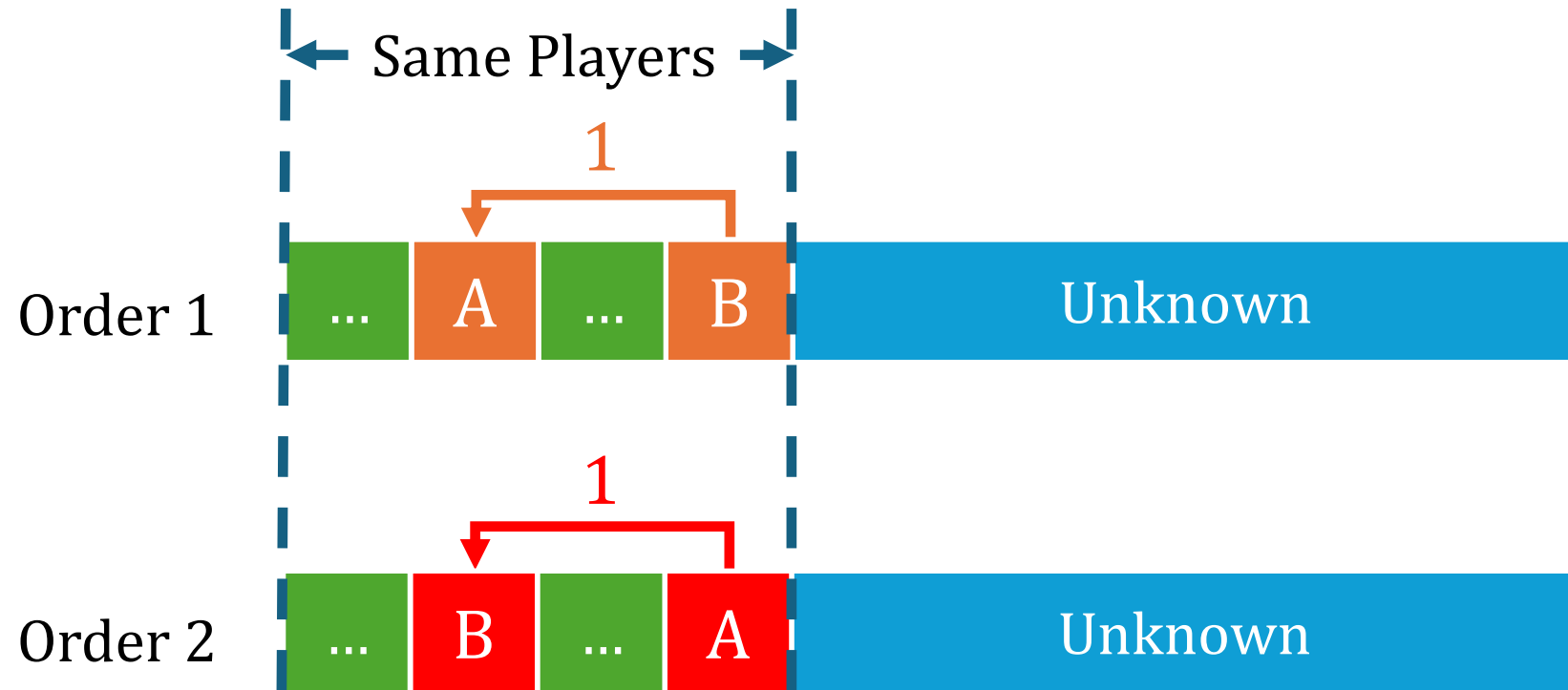
RFC is **not I4EA** only on games satisfying: $\exists i, v(i) = 0$ and $\exists S \subseteq N, S^* = \{i\}$. Here $S^* := \{i \in S \mid v(S) = 1, v(S \setminus \{i\}) = 0\}$.

- SF ✓
- OIR ✓ (obviously)
- **I4EA is not satisfied when someone can delay to be the only critical player.**

e.g. $(A \vee B) \wedge C$, $((A \wedge B) \vee (E \wedge D)) \wedge C$, ...



Proof of Shapley-Fair (sketch)



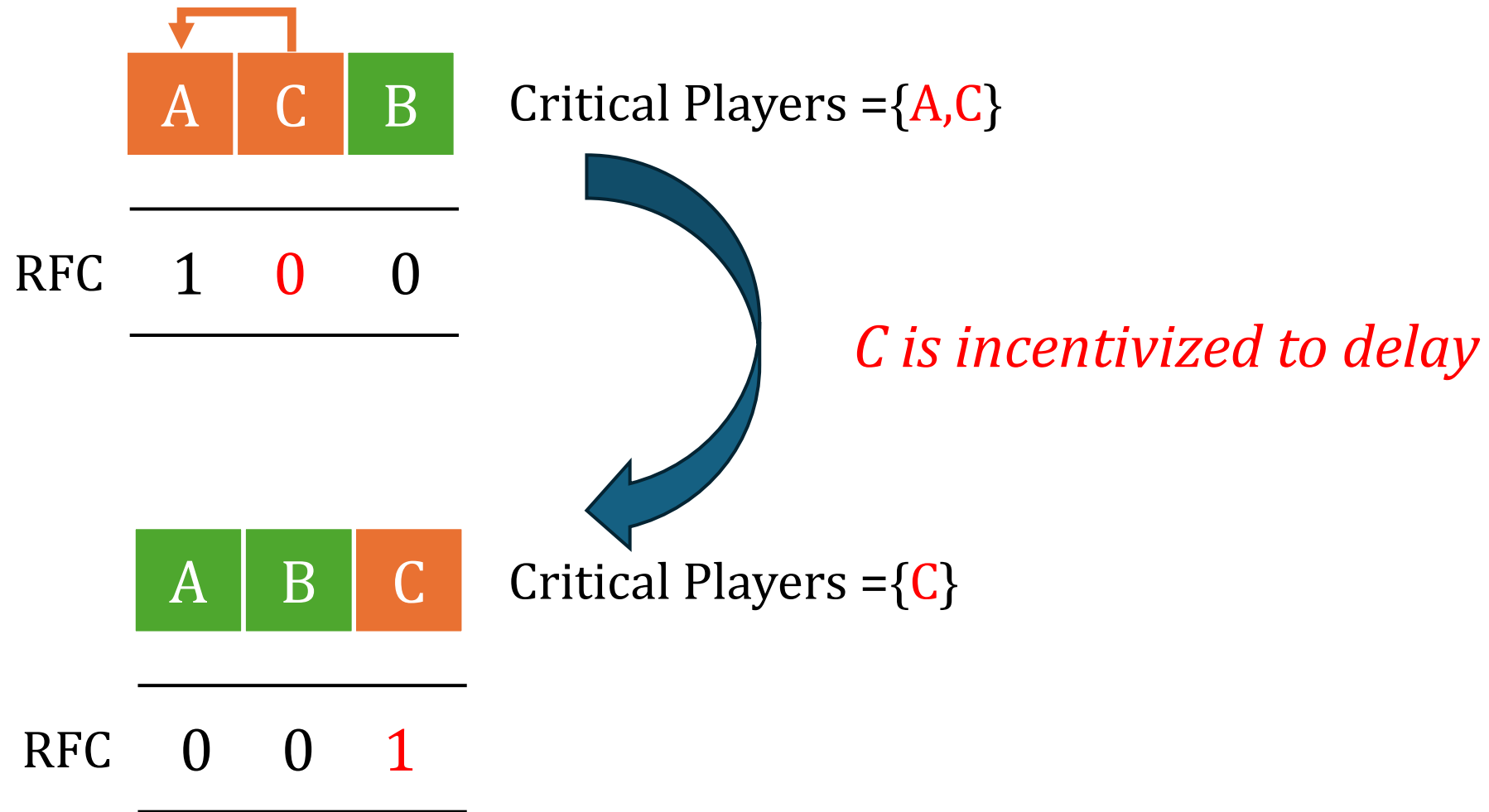
B must be the first critical player

A must be the marginal player

RFC on 3-player 0-1 valued monotone games

v	Value Receiver	I4EA
A	to A	Yes
$A \vee B$	1 st of $\{A, B\}$	Yes
$A \vee B \vee C$	1 st	Yes
$A \wedge B$	1 st of $\{A, B\}$	Yes
$A \wedge B \wedge C$	1 st	Yes
$(A \wedge B) \vee C$	C is 1 st or 2 nd $\rightarrow C$ Otherwise \rightarrow 1 st of $\{A, B\}$	Yes
$(A \vee B) \wedge C$	C is 1st or 3rd $\rightarrow C$ Otherwise \rightarrow 1st of $\{A, B\}$	No
$(A \wedge B) \vee (A \wedge C) \vee (B \wedge C)$	1 st	Yes

RFC is not I4EA on $(A \vee B) \wedge C$



$(A \vee B) \wedge C$ is unsolvable

SF + OIR



x $1 - x$

$x \in [0, 1]$

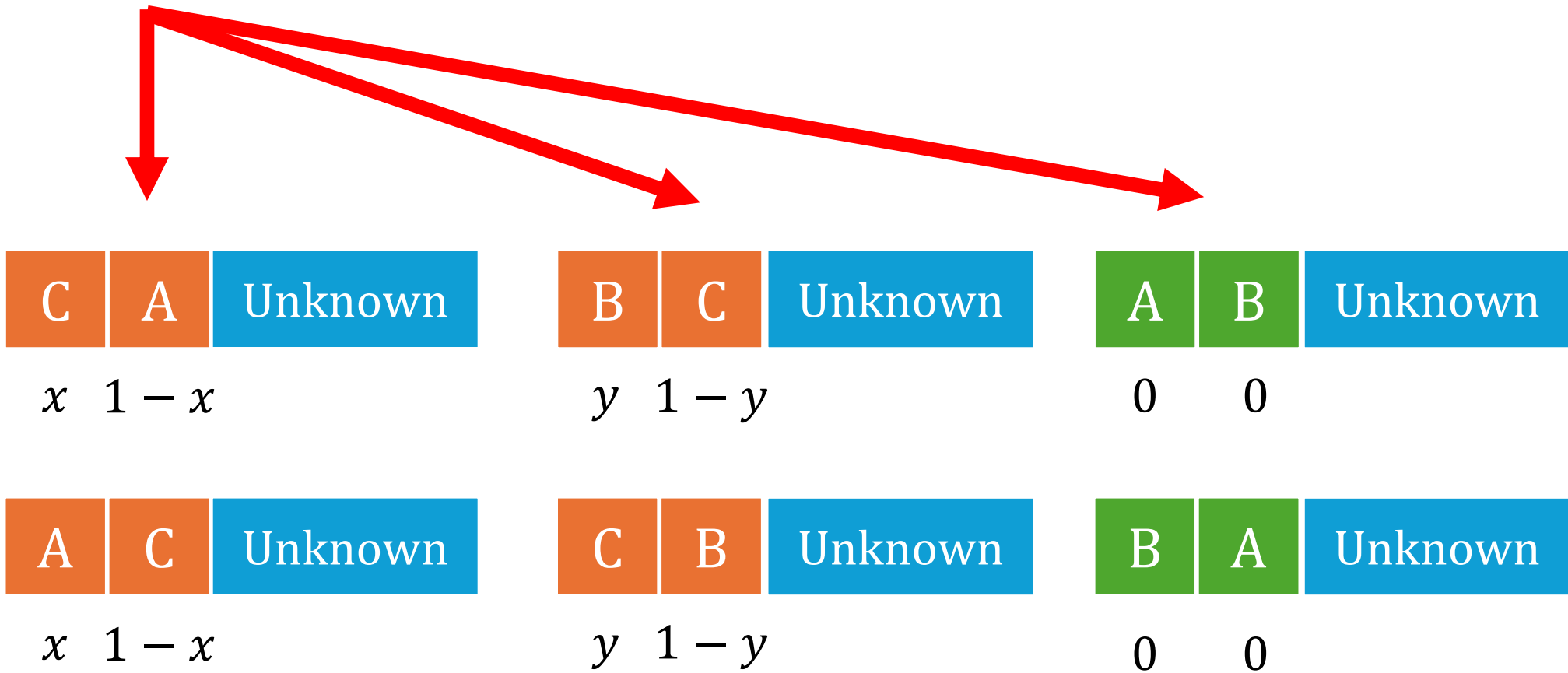


x $1 - x$



$(A \vee B) \wedge C$ is unsolvable

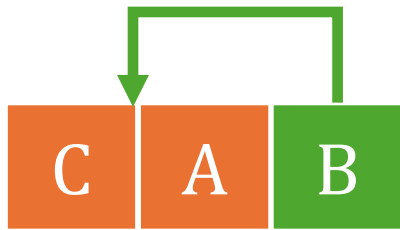
SF + OIR



$(A \vee B) \wedge C$ is unsolvable

The 3rd player joins...

No value to transfer (OIR)



$x \quad 1 - x \quad \mathbf{0}$



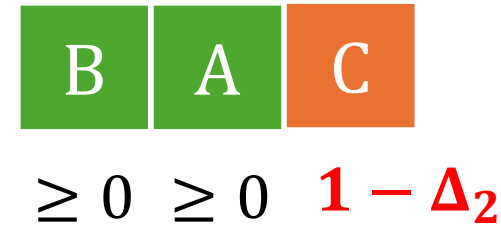
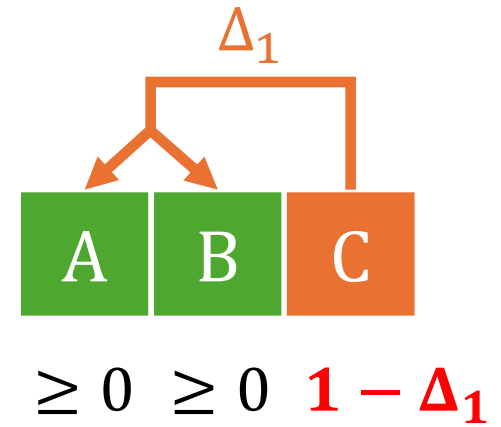
$x \quad 1 - x \quad \mathbf{0}$



$y \quad 1 - y \quad \mathbf{0}$



$y \quad 1 - y \quad \mathbf{0}$



$(A \vee B) \wedge C$ is unsolvable

$$\text{SF} \Rightarrow SV_C = 2/3 = (x + 1 - x + y + 1 - y + 1 - \Delta_1 + 1 - \Delta_2)/6$$

$$\Rightarrow \Delta_1 = \Delta_2 = 0$$

C	A	B
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$$x \quad 1 - x \quad 0$$

A	C	B
---	---	---

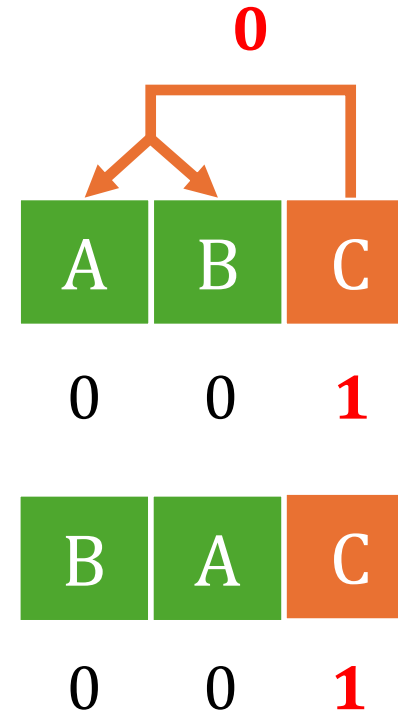
$$x \quad 1 - x \quad 0$$

B	C	A
---	---	---

$$y \quad 1 - y \quad 0$$

C	B	A
---	---	---

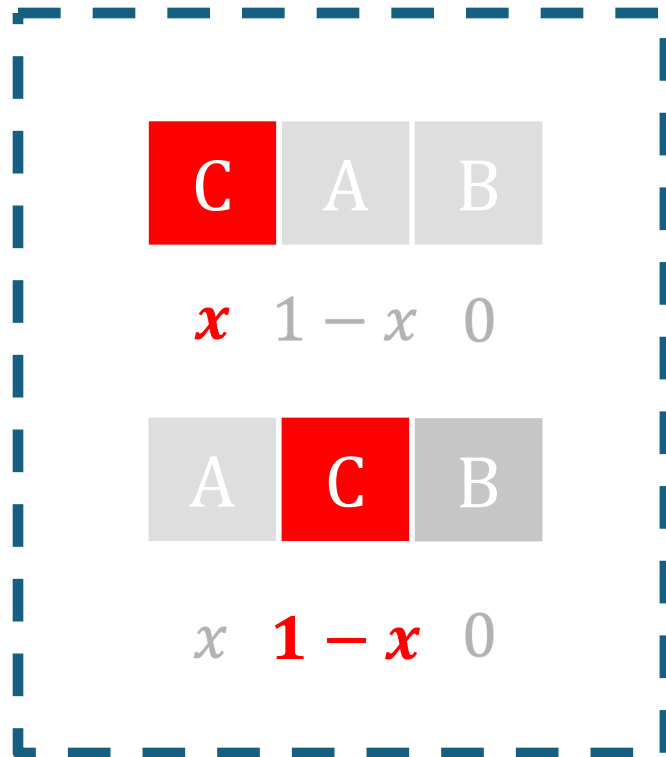
$$y \quad 1 - y \quad 0$$



$(A \vee B) \wedge C$ is unsolvable

SF + OIR \longrightarrow not I4EA

C delays



y $1-y$ 0



y $1-y$ 0



0 0 $1 > \min(x, 1-x)$



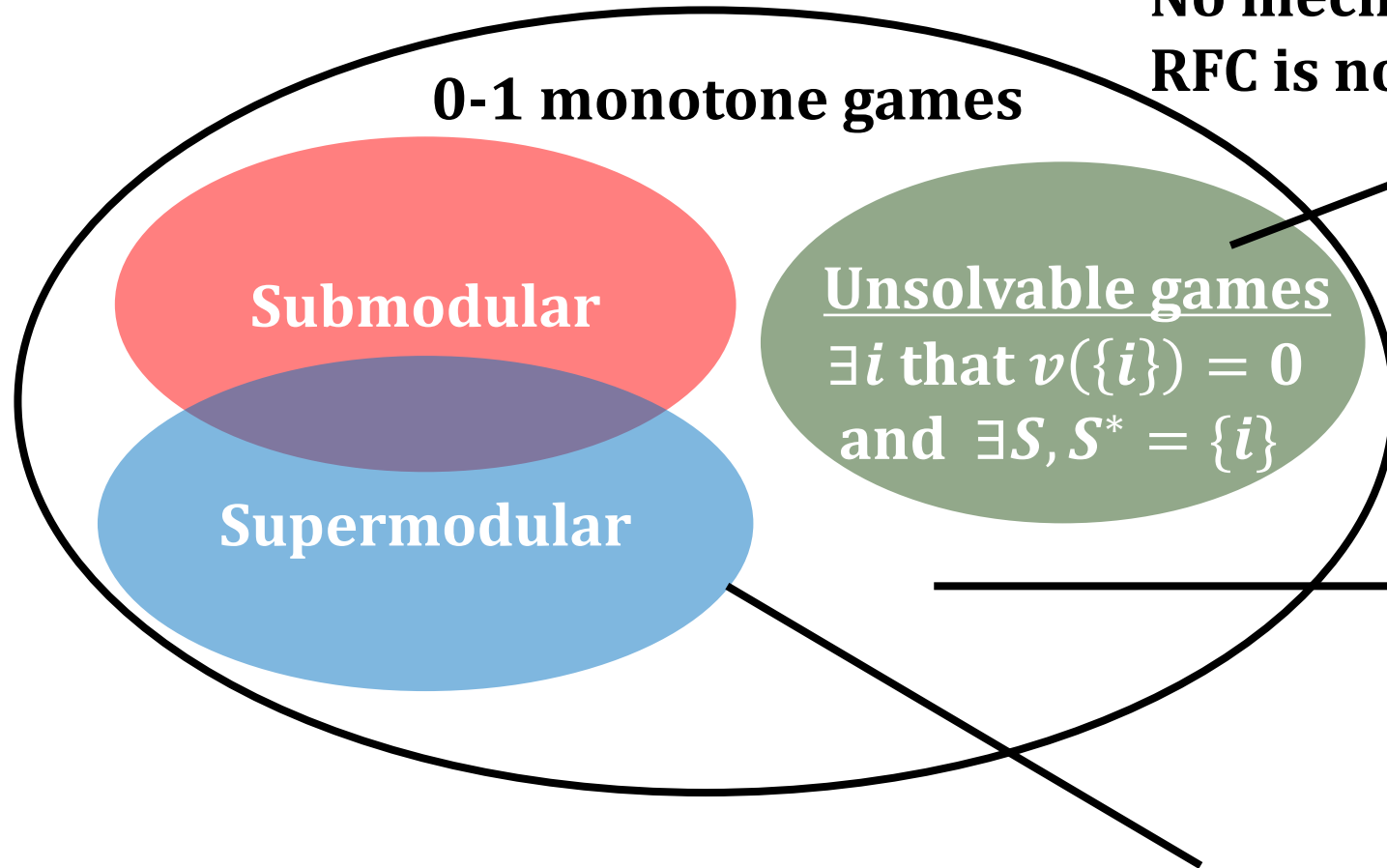
0 0 1

Summary of Properties

Characterization of Unsolvable Games:

No mechanism satisfying OIR SF and I4EA.

RFC is not I4EA.



Completeness of RFC:

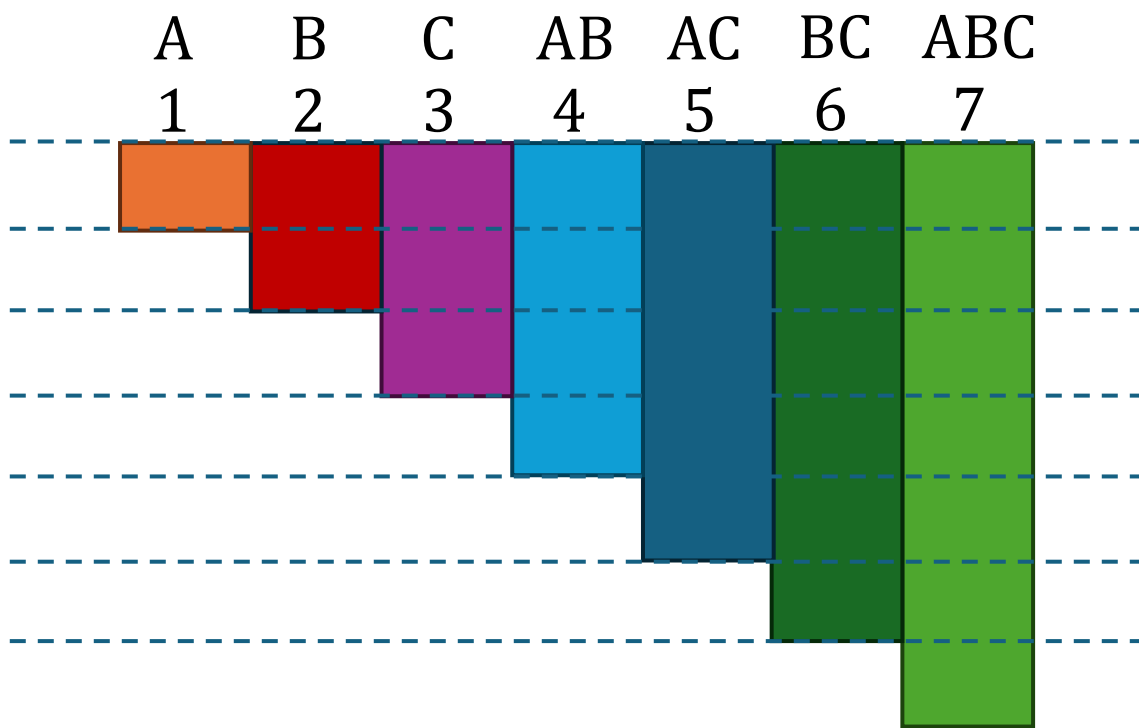
RFC is I4EA, SF and OIR.

submodular and supermodular games are solvable

Extend RFC to General Valued Monotone Games

Definition: eRFC

(1) decompose game online (2) accumulate the share



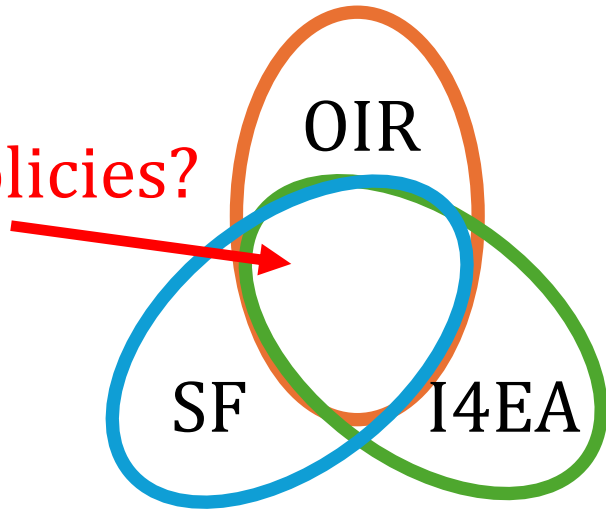
A	B	C	AB	AC	BC	ABC
1	2	3	4	5	6	7
1	1	1	1	1	1	1
	1	1	1	1	1	1
		1	1	1	1	1
			1	1	1	1
				1	1	1
					1	1
						1

0-1 valued components

Future Work

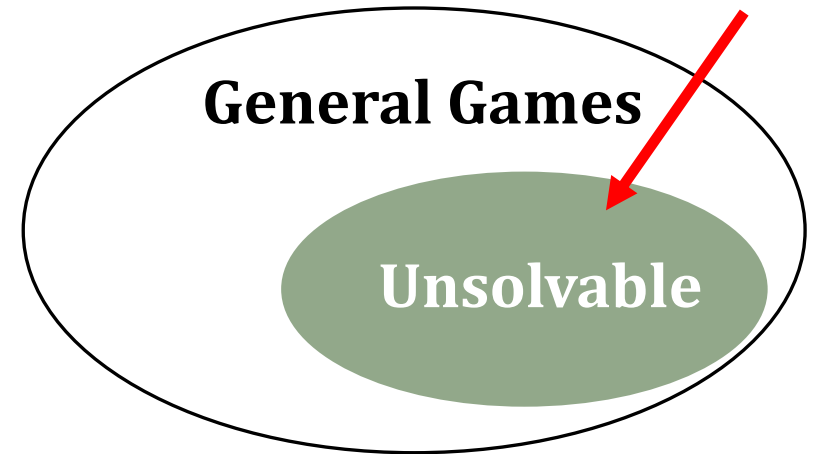
RFC ✓

Other policies?

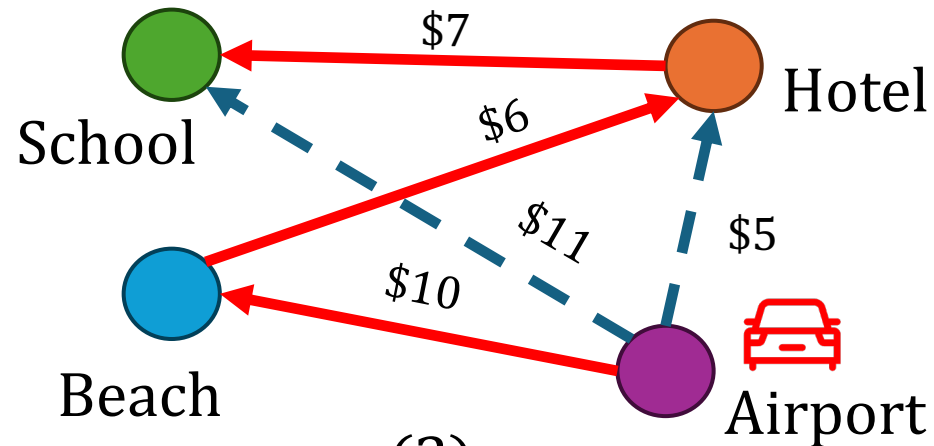


(1)

Characterization?



(2)



(3)