

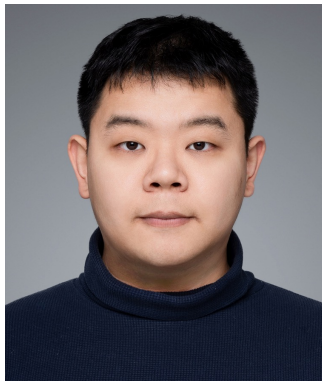
Incentives for Early Arrival in Cooperative Games

(AAMAS24 Best Paper)

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About Me



Technische Universität Dresden, DE
Universidad Politécnica de Madrid, ES

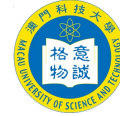
Double M.Sc., Computational Logic
Erasmus Mundus Full Scholarship



2006



2002



Macau University of Science and Technology

B.Sc., Computer Science

First Class Honors; Full Scholarship

2009



University of Western Sydney, AU
University of Toulouse, FR

Double PhD, Computer Science

ARC Discovery Scholarship

The Best Thesis Award



2013



Kyushu University, JP

Postdoc

Mentor: **Prof. Makoto Yokoo**
AAAI Fellow (first in Asia)



2014



University of Southampton, UK

Research Fellow



Mentor: **Prof. Nick Jennings**

IEEE/AAAI Fellow

Rigius Professor of CS

Vice-Provost at Imperial College

2017

ShanghaiTech University

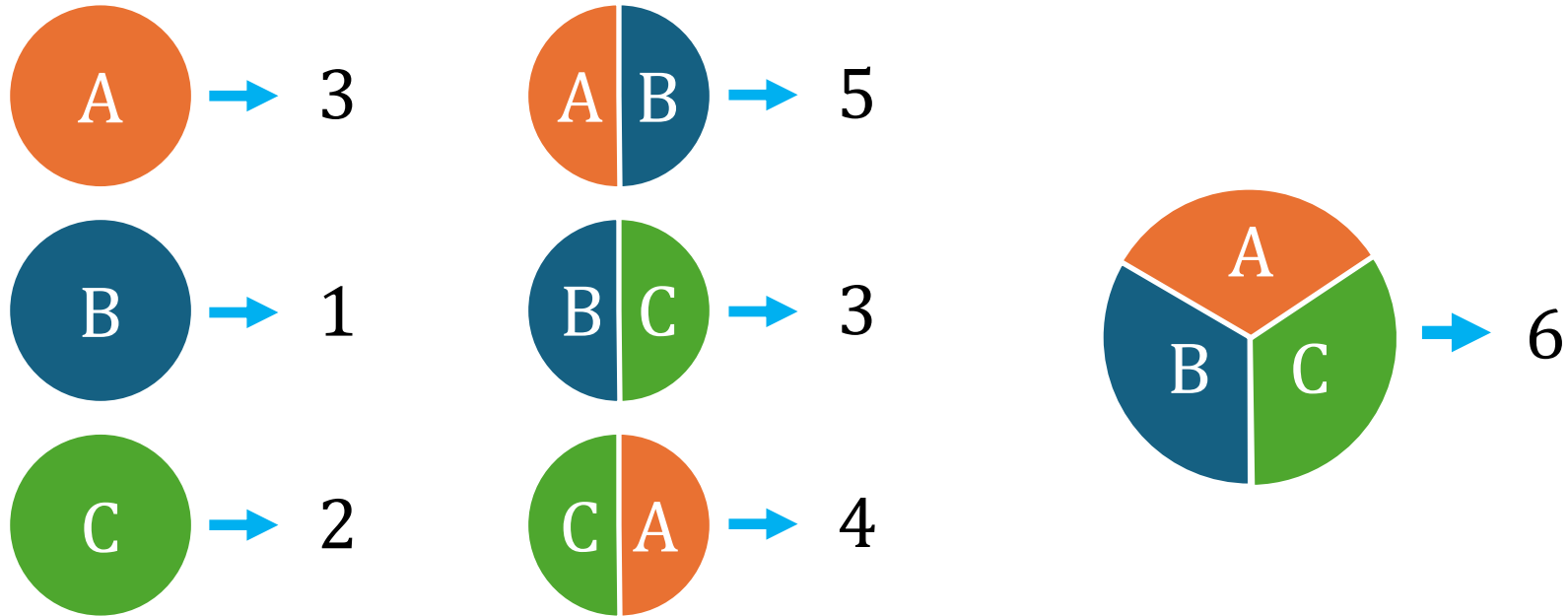
Assistant Professor

上海青年东方学者



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



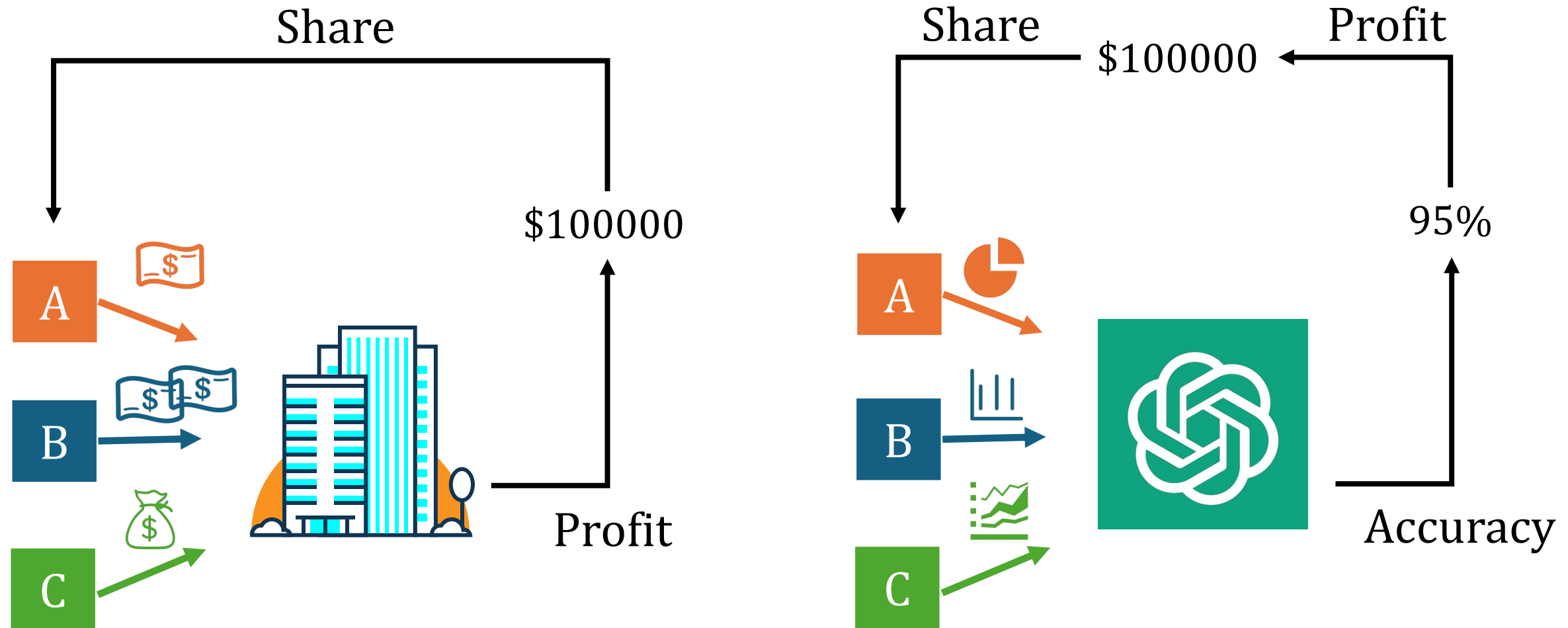
2 1 3



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				?

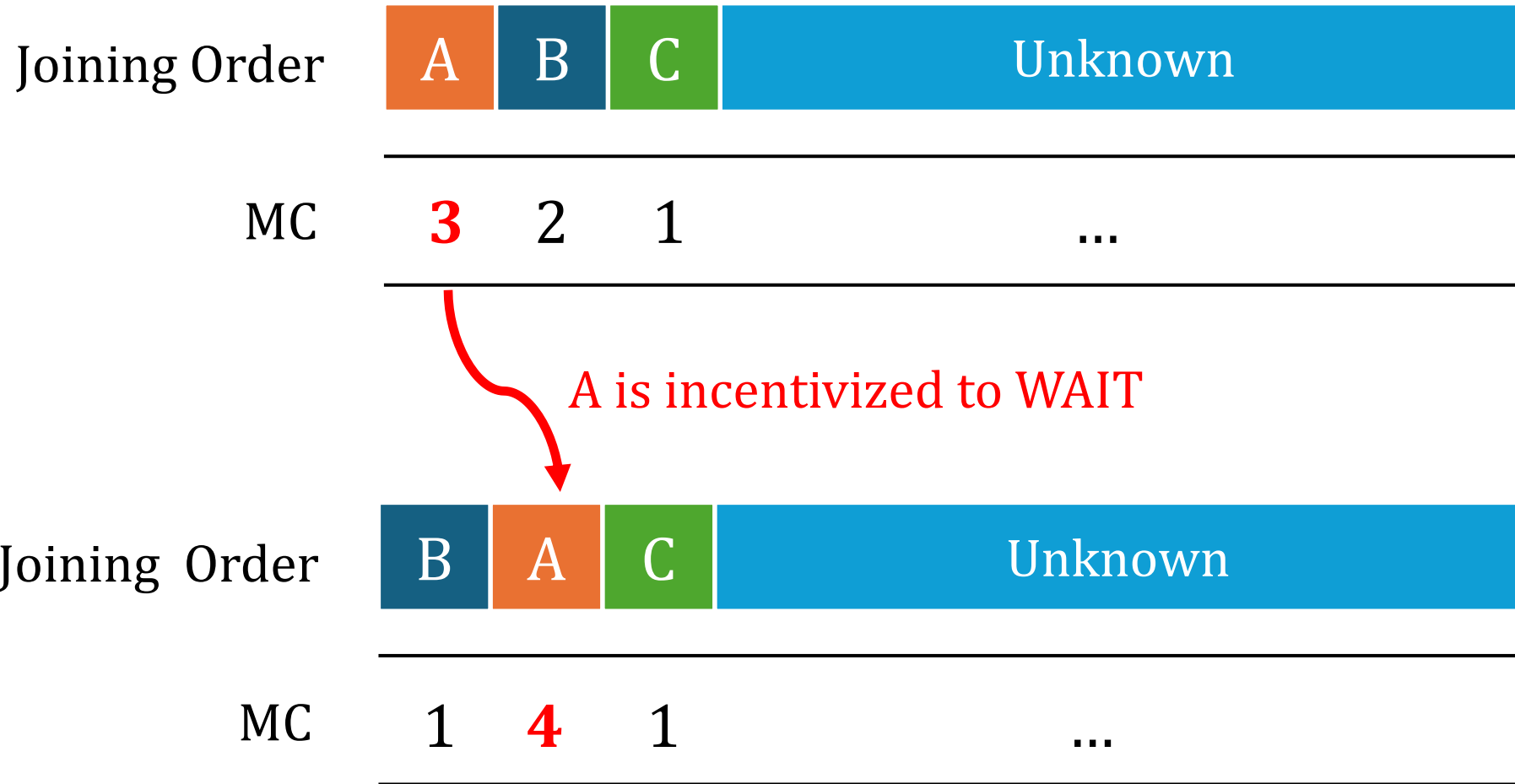
Online Cooperative Game Model

- 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: $MC(i, v, S) = v(S) - v(S \setminus i), \forall i \in S$

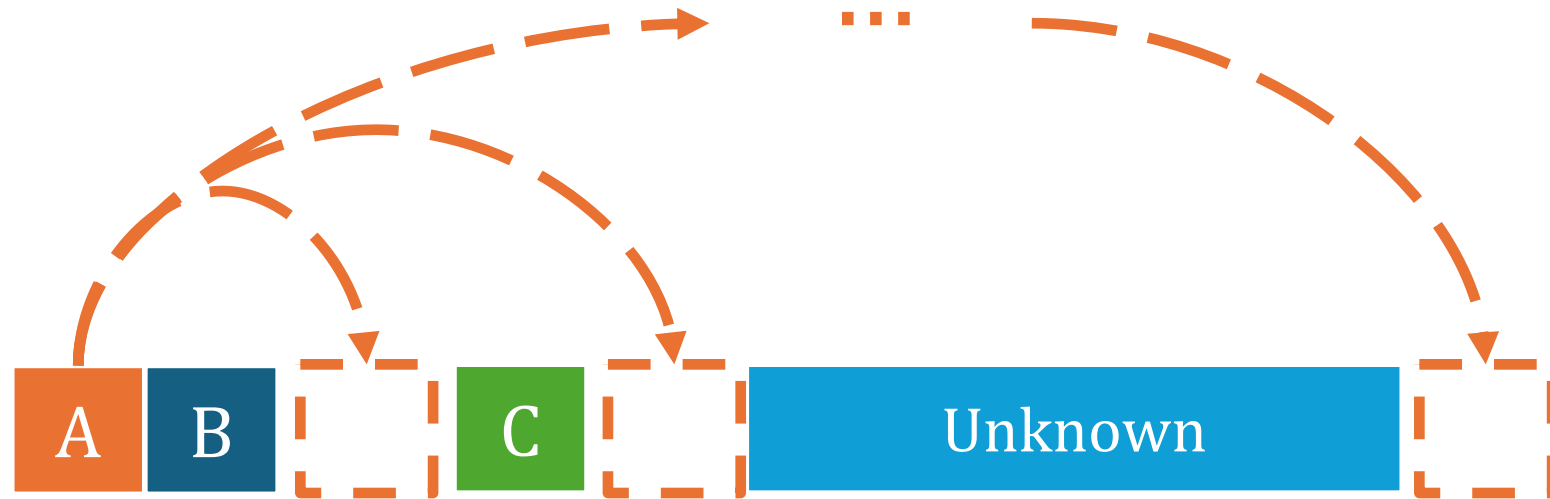
- Shapley Value:

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

How to share the value: *Marginal Contribution*

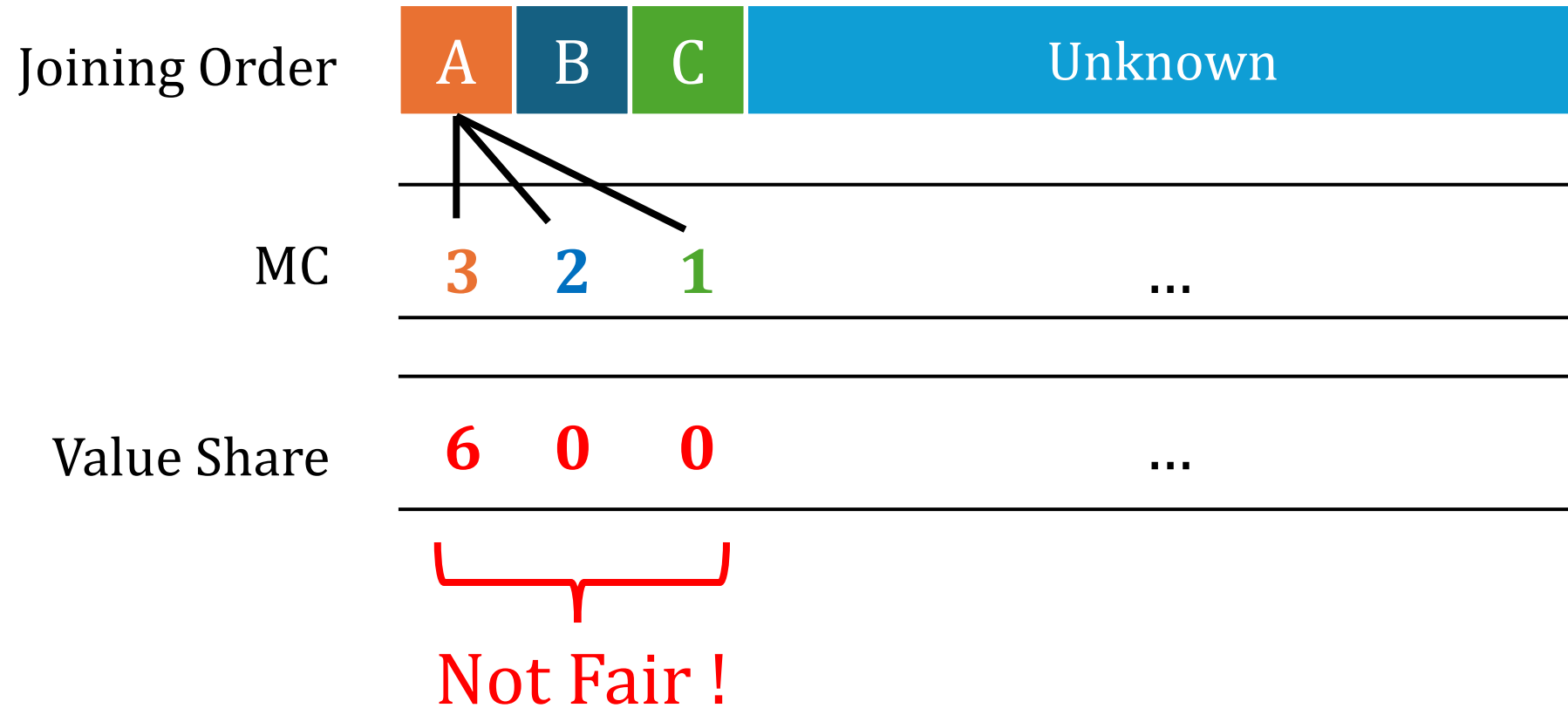


Incentivizing for Early Arrival (I4EA)

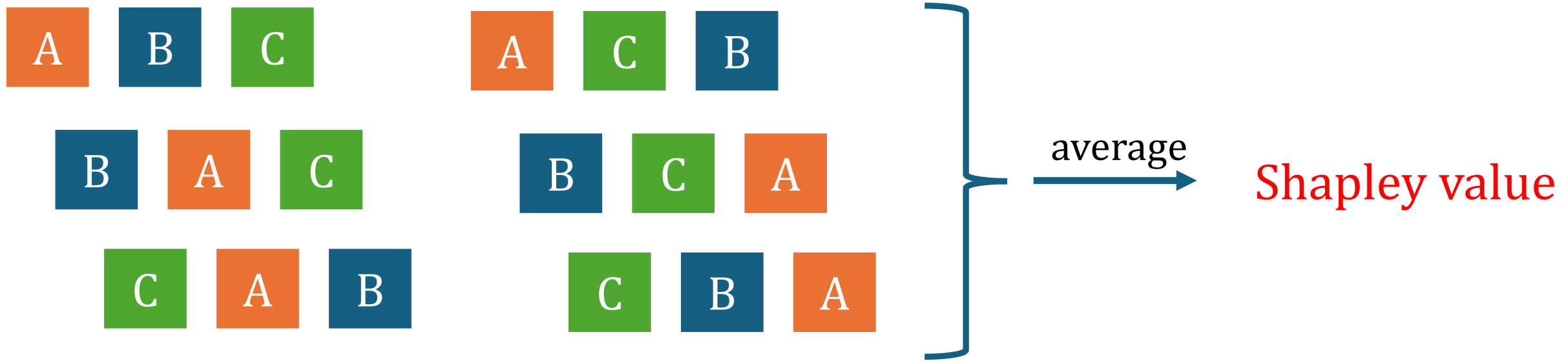


I4EA: When the order of others are fixed, the players are *incentivized to join as soon as possible*.

One Solution: *The First Gets All*

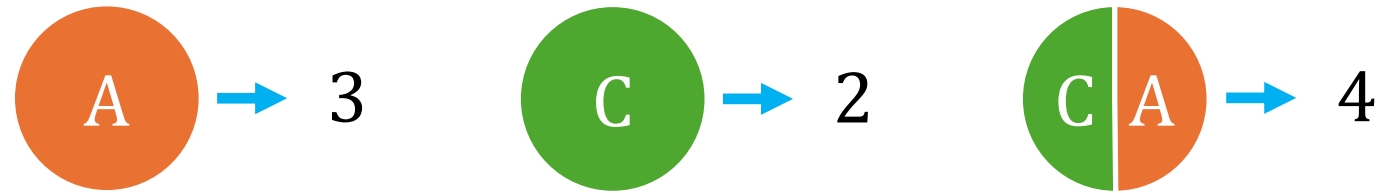


One Fairness: Shapley Fair (SF)



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

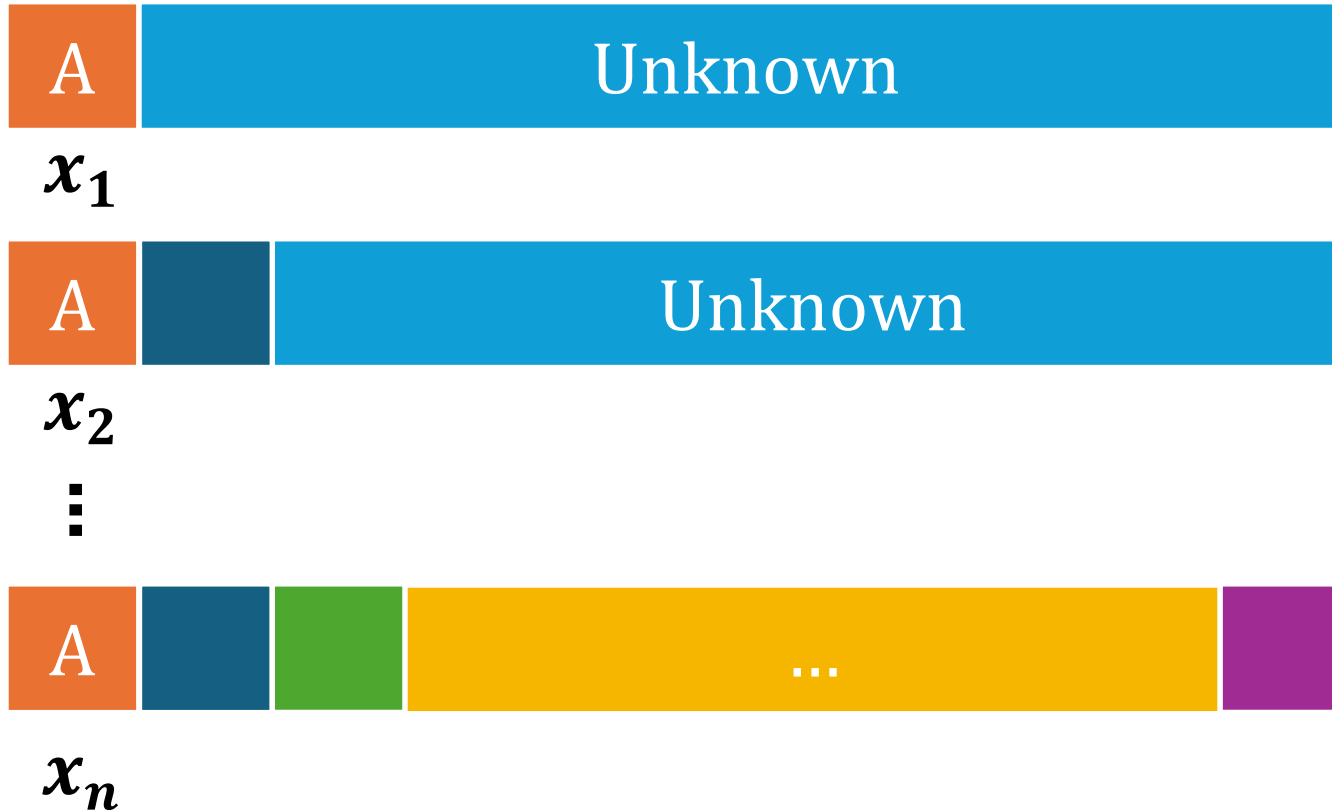
Shapley value?



Order	A	Unknown	
Shapley value	3	...	
Order	A	C	Unknown
Shapley value	2.5	1.5	...

A's share Decreases!

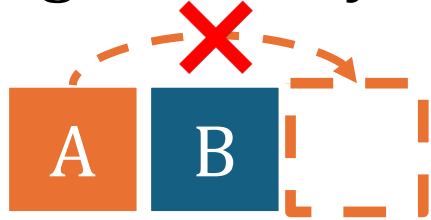
Online Individual Rational (OIR)



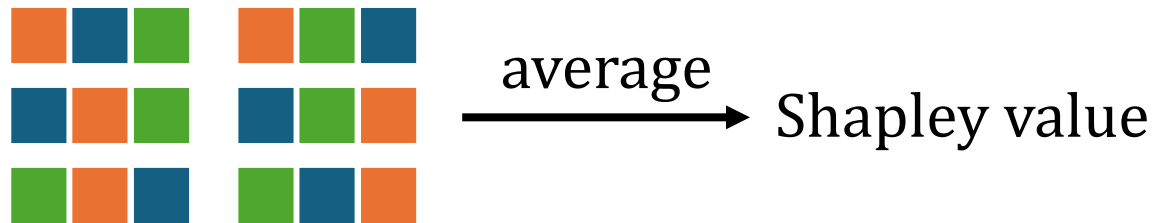
OIR: $x_n \geq \dots \geq x_2 \geq x_1 \geq \mathbf{0}$ (*non-decreasing, non-negative*)

All the Desire Properties

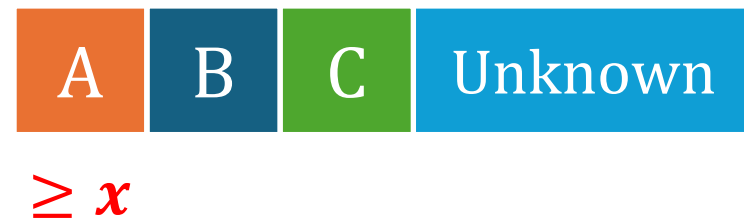
- Incentivizing For Early Arrival (I4EA)



- Shapley-fair (SF)



- Online Individual Rational (OIR)

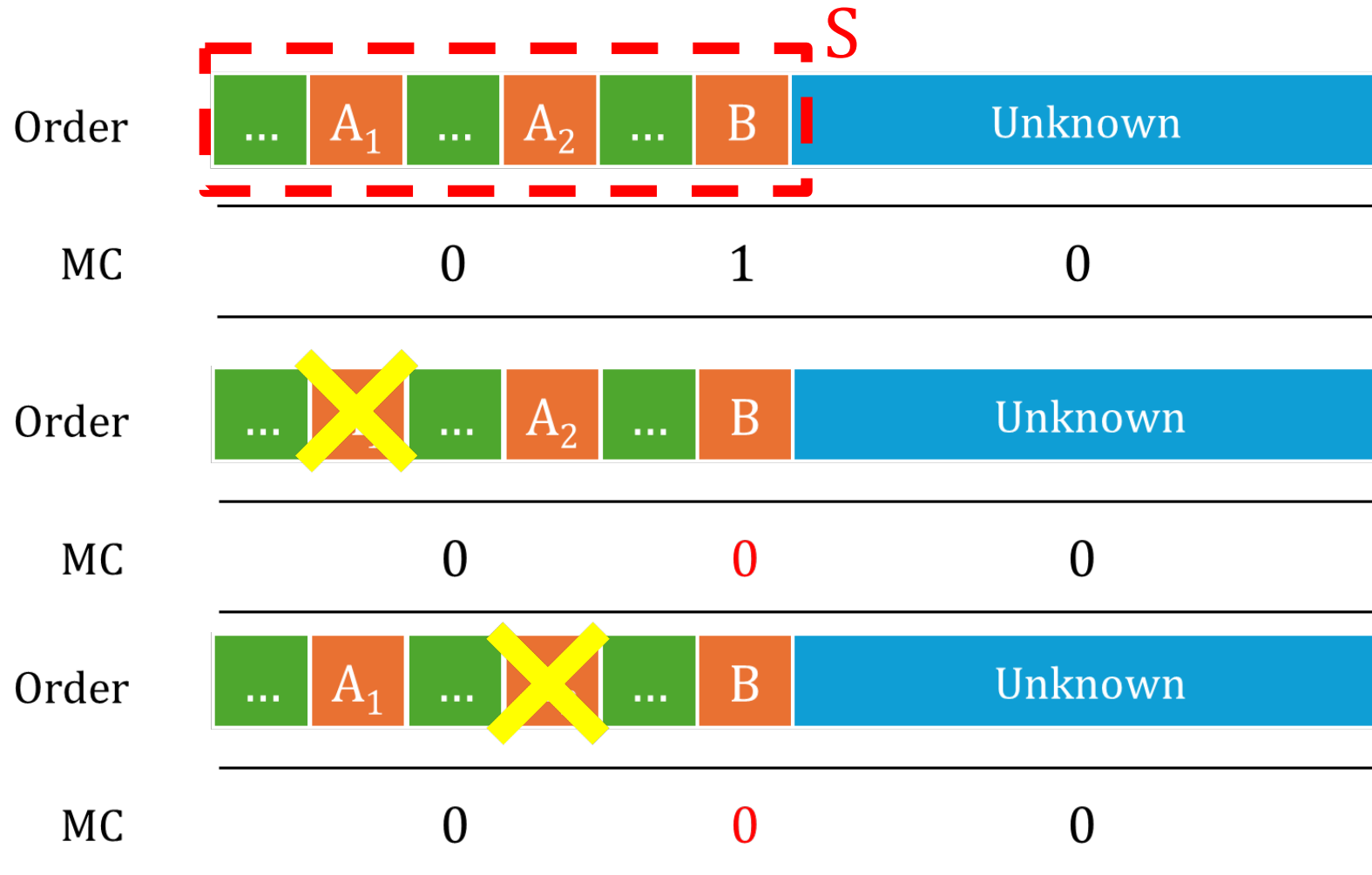


Start with 0-1 Valued Monotone Games: $A_1 \wedge A_2 \wedge B$

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: $A_1 \wedge A_2 \wedge B$

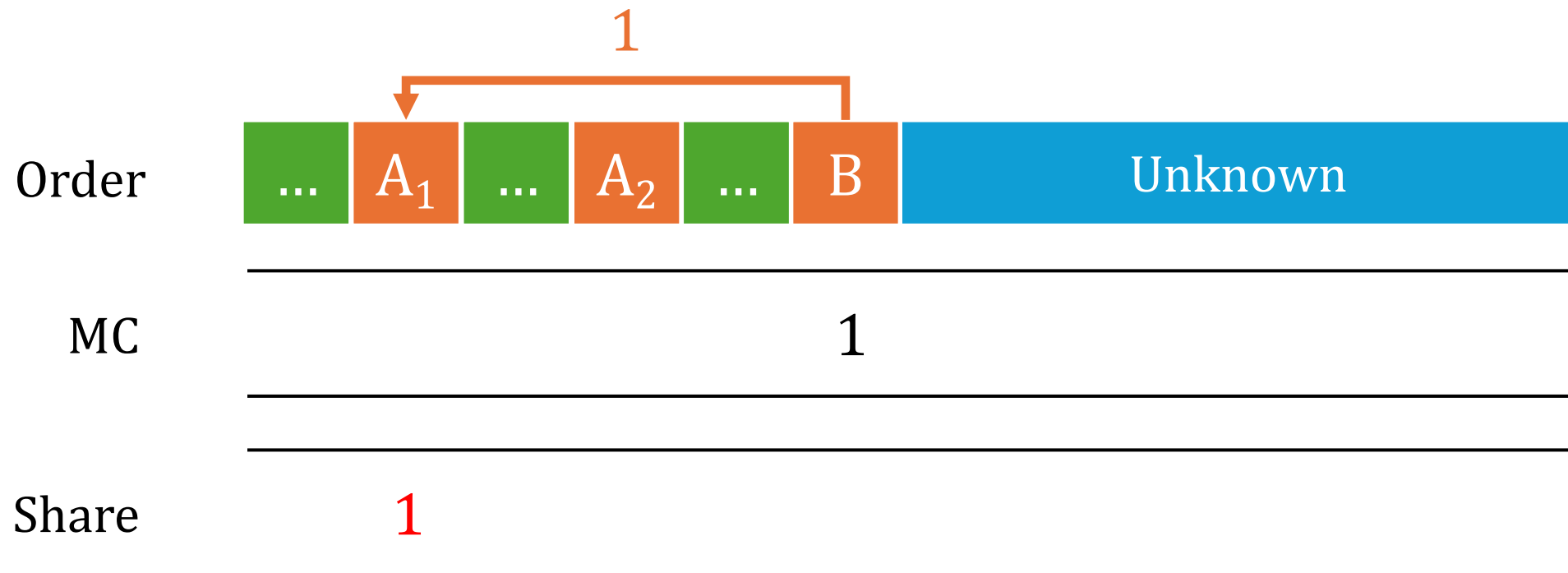


Critical Players: $\{i \mid v(S \setminus \{i\}) = 0\}$

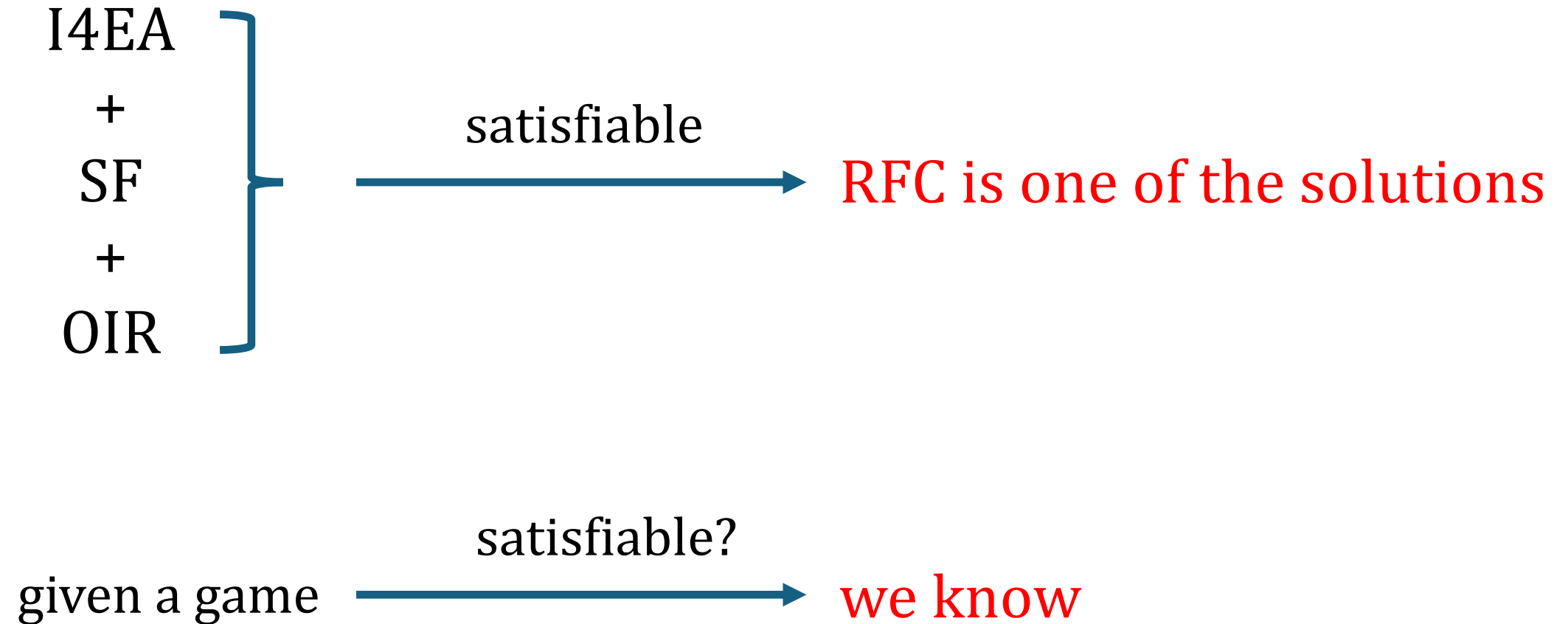
Reward First Critical Player (RFC)

Definition: RFC

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



Properties Overview



Properties of RFC

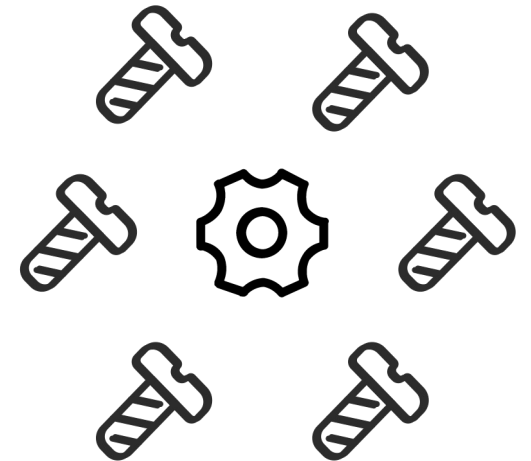
Theorem

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

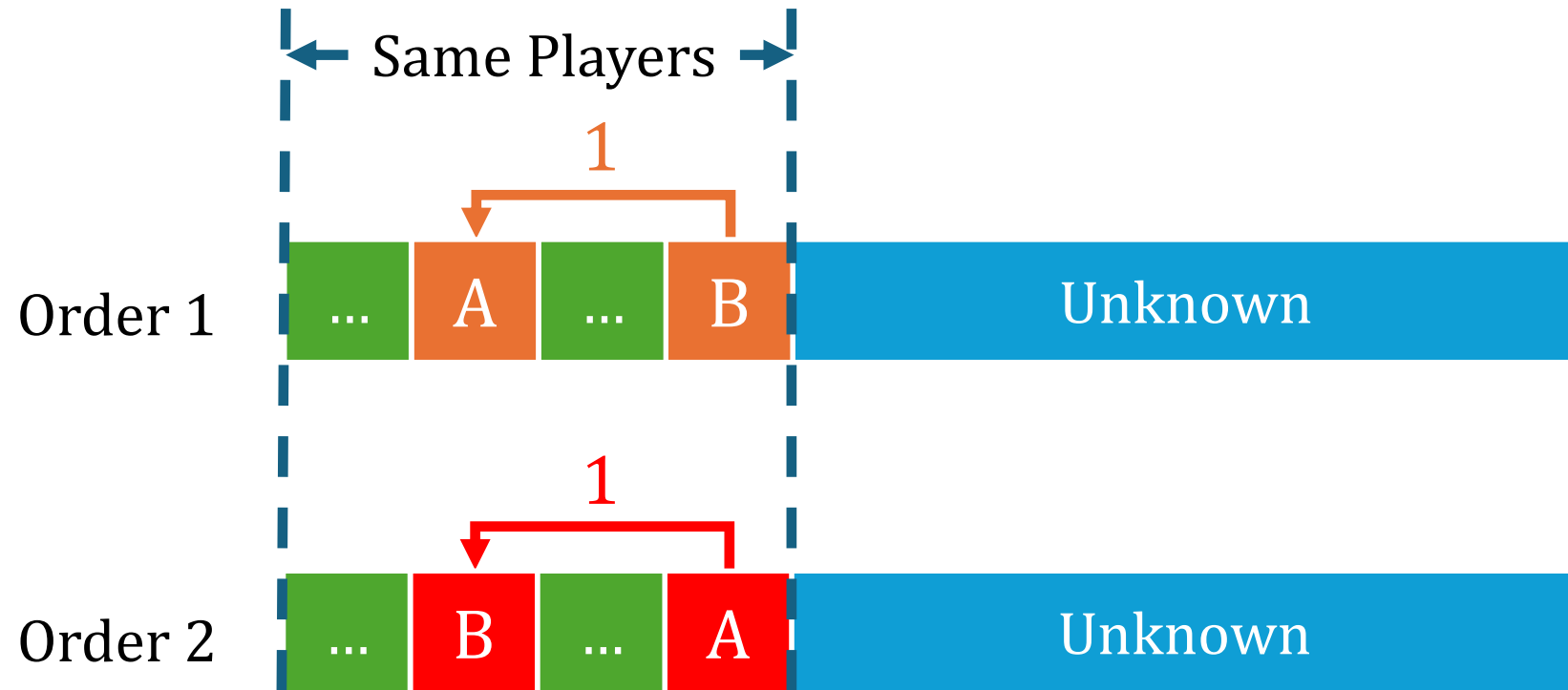
RFC is **not I4EA** only on games satisfying: $\exists i, v(i) = 0$ and $\exists S \subseteq N, S^* = \{i\}$. Here $S^* := \{i \in S \mid v(S) = 1, v(S \setminus \{i\}) = 0\}$.

- 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)



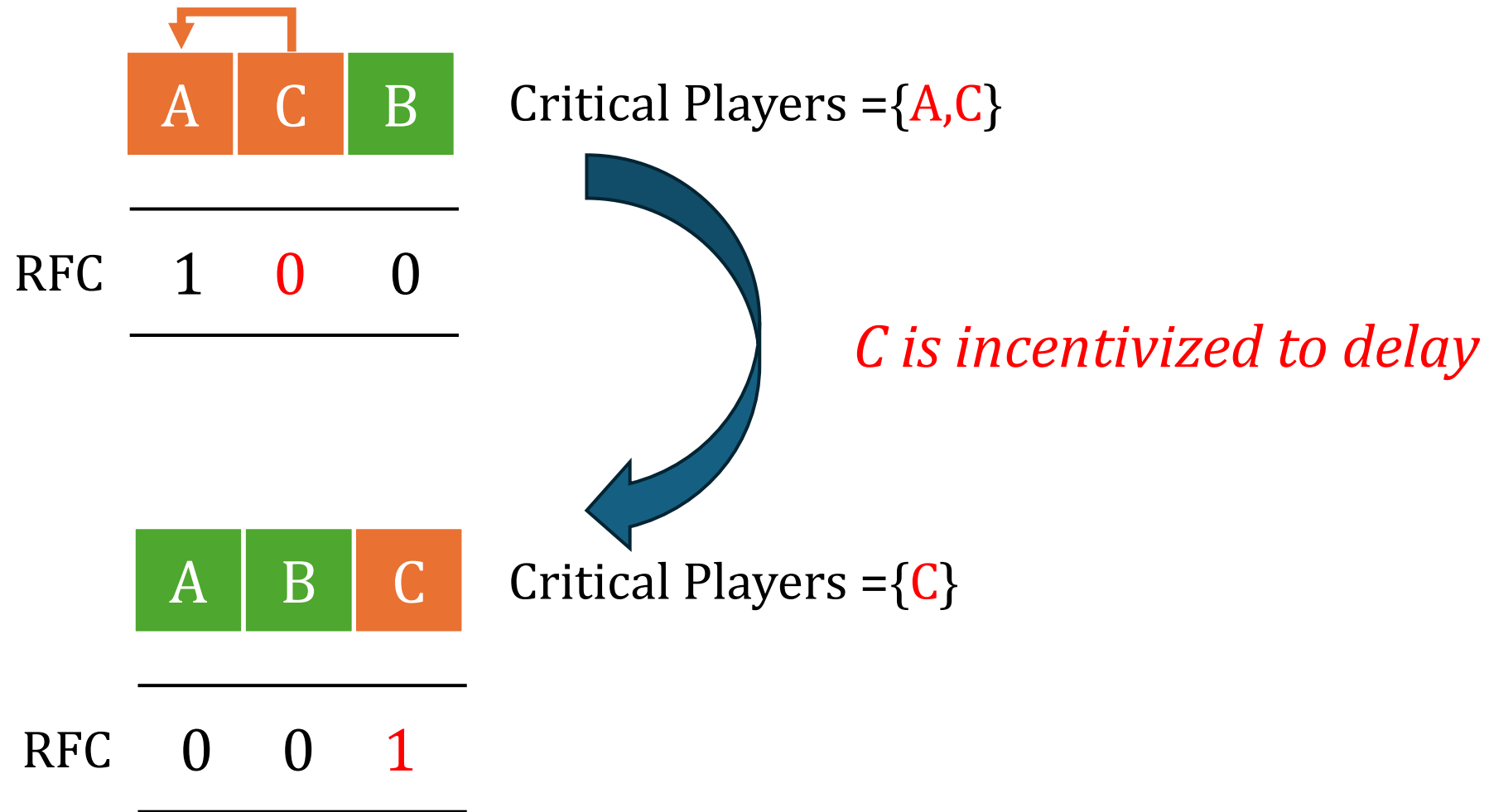
B must be the first critical player

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 $1 - x$

$x \in [0, 1]$

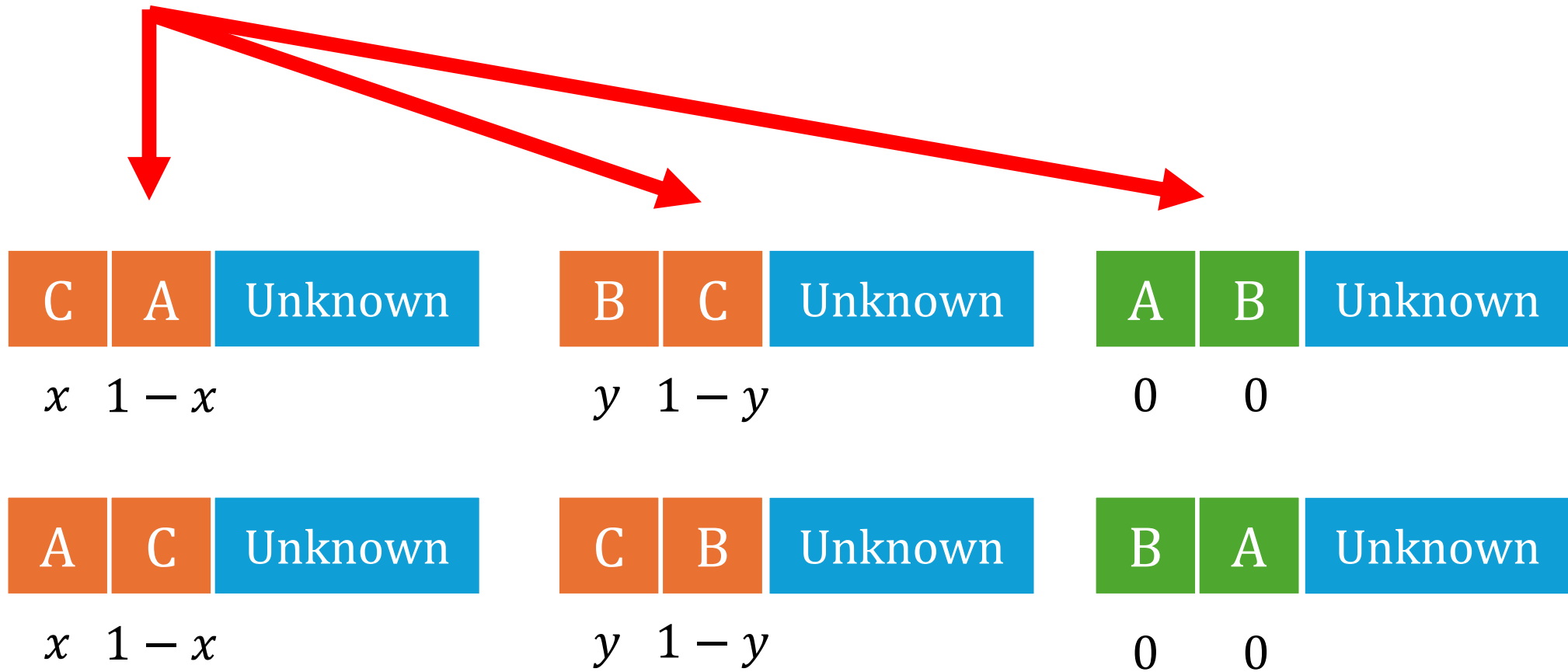


x $1 - x$



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

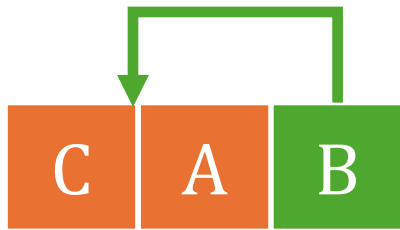
SF + OIR



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

The 3rd player joins...

No value to transfer (OIR)



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



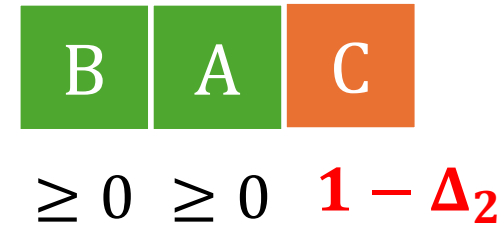
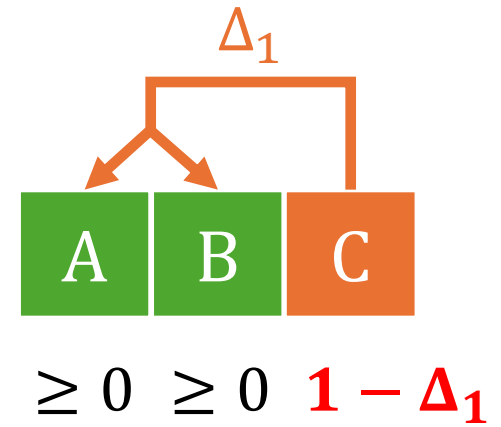
$x \quad 1 - x \quad \mathbf{0}$



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



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



$(A \vee B) \wedge C$ 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
---	---	---

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

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

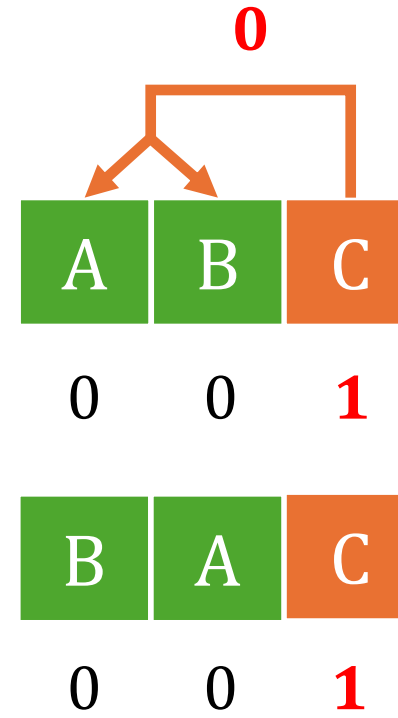
$$x \quad 1 - x \quad 0$$

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



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

x $1-x$ 0

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

x $1-x$ 0

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

y $1-y$ 0

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

y $1-y$ 0

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

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

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

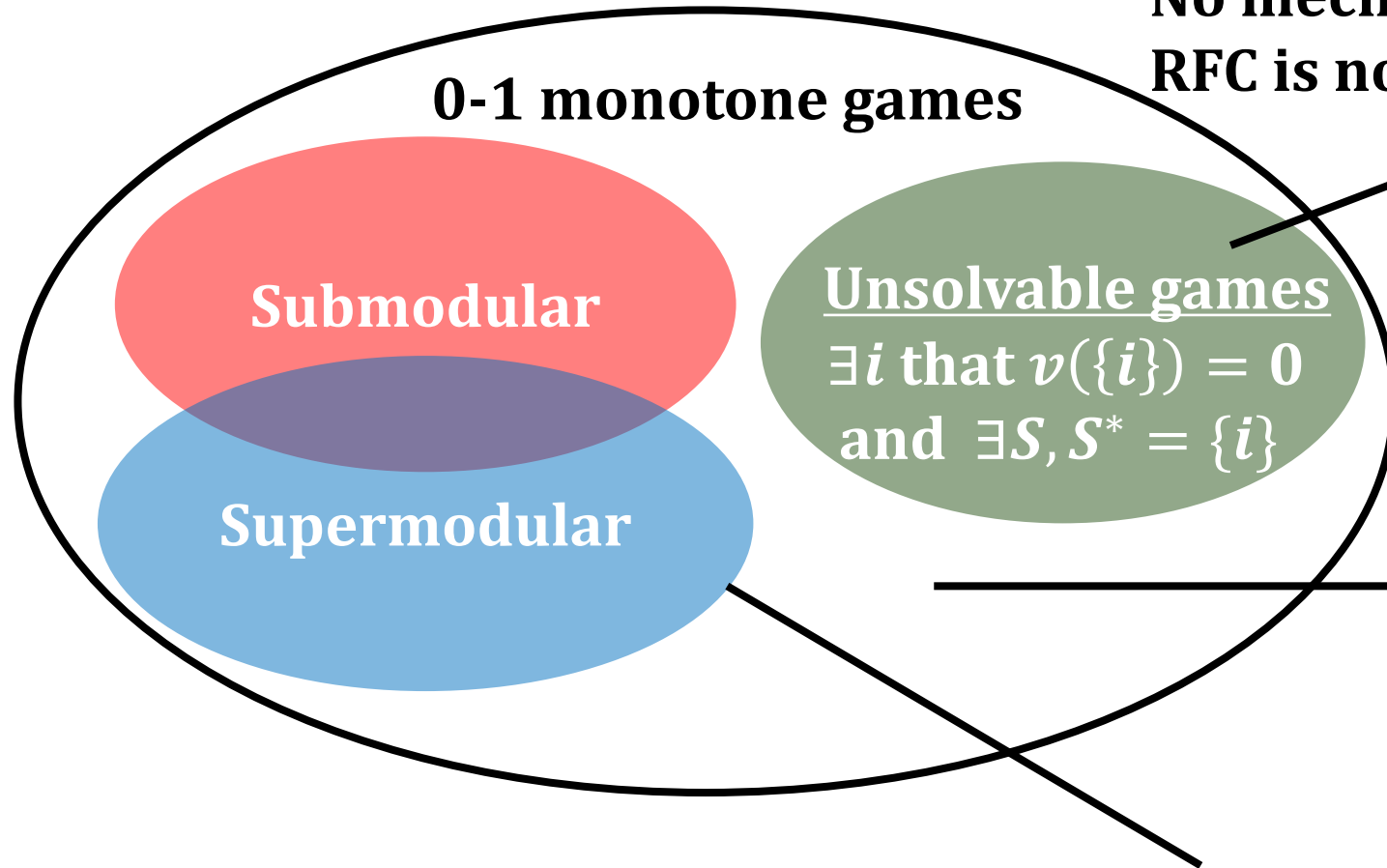
0 0 1

Summary of Properties

Characterization of Unsolvable Games:

No mechanism satisfying OIR SF and I4EA.

RFC is not I4EA.



0-1 monotone games

Submodular

Supermodular

Unsolvable games

$\exists i$ that $v(\{i\}) = 0$
and $\exists S, S^* = \{i\}$

Completeness of RFC:

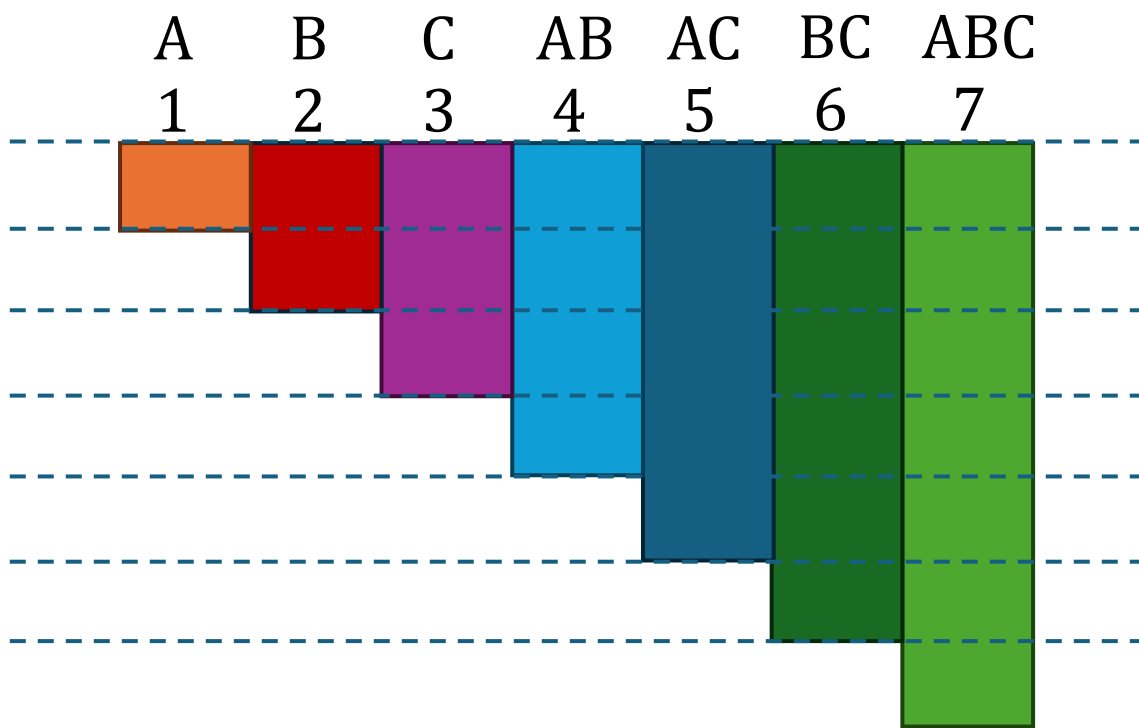
RFC is I4EA, SF and OIR.

submodular and supermodular games are solvable

Extend RFC to General Valued Monotone Games

Definition: eRFC

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



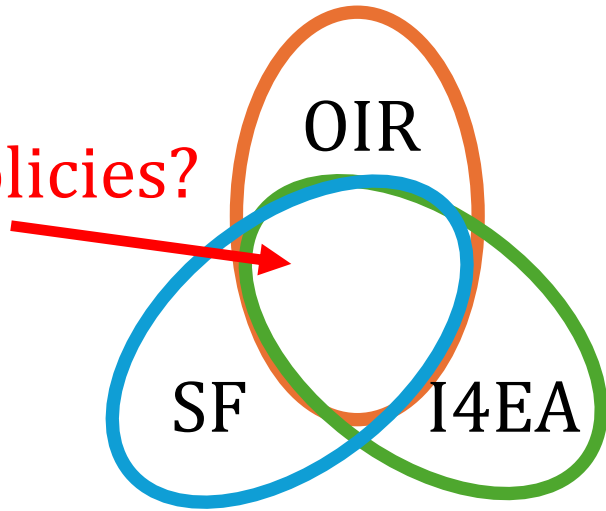
A	B	C	AB	AC	BC	ABC
1	2	3	4	5	6	7
1	1	1	1	1	1	1
	1	1	1	1	1	1
		1	1	1	1	1
			1	1	1	1
				1	1	1
					1	1
						1

0-1 valued components

Future Work

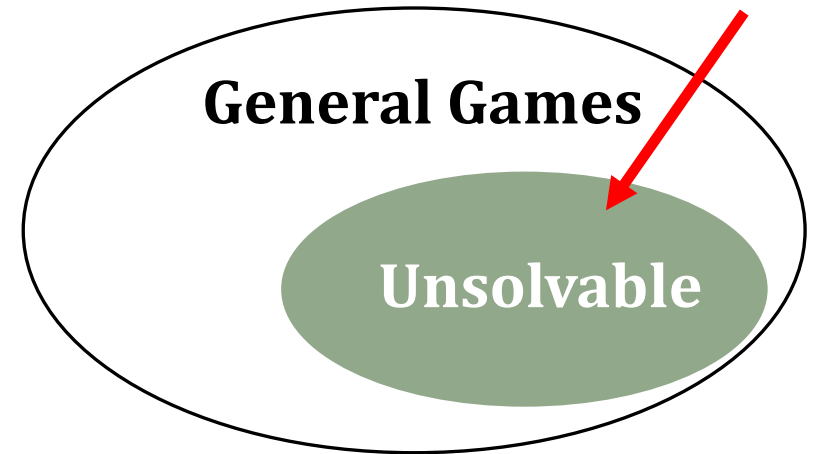
RFC ✓

Other policies?

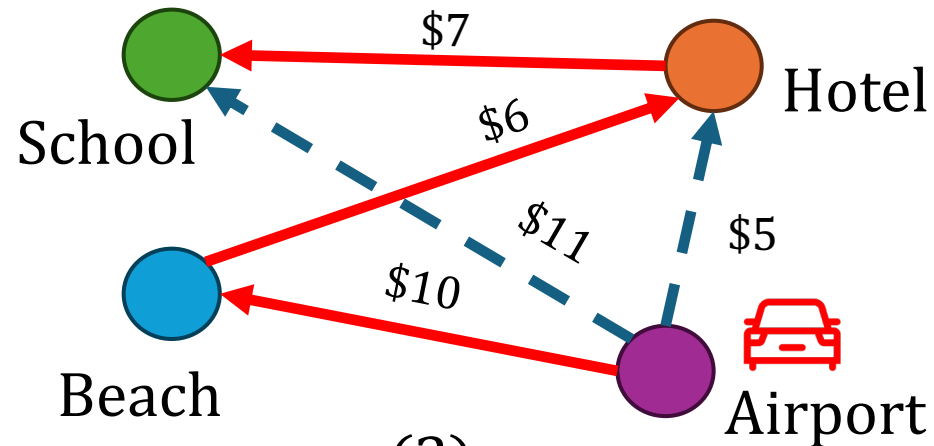


(1)

Characterization?



(2)



(3)