

# Approximate pure Nash equilibria

## in weighted congestion games

Max Klimm



Combinatorial Optimization and Graph Algorithms



Technische Universität Berlin

Christoph Hansknecht



Combinatorial Optimization and Graph Algorithms



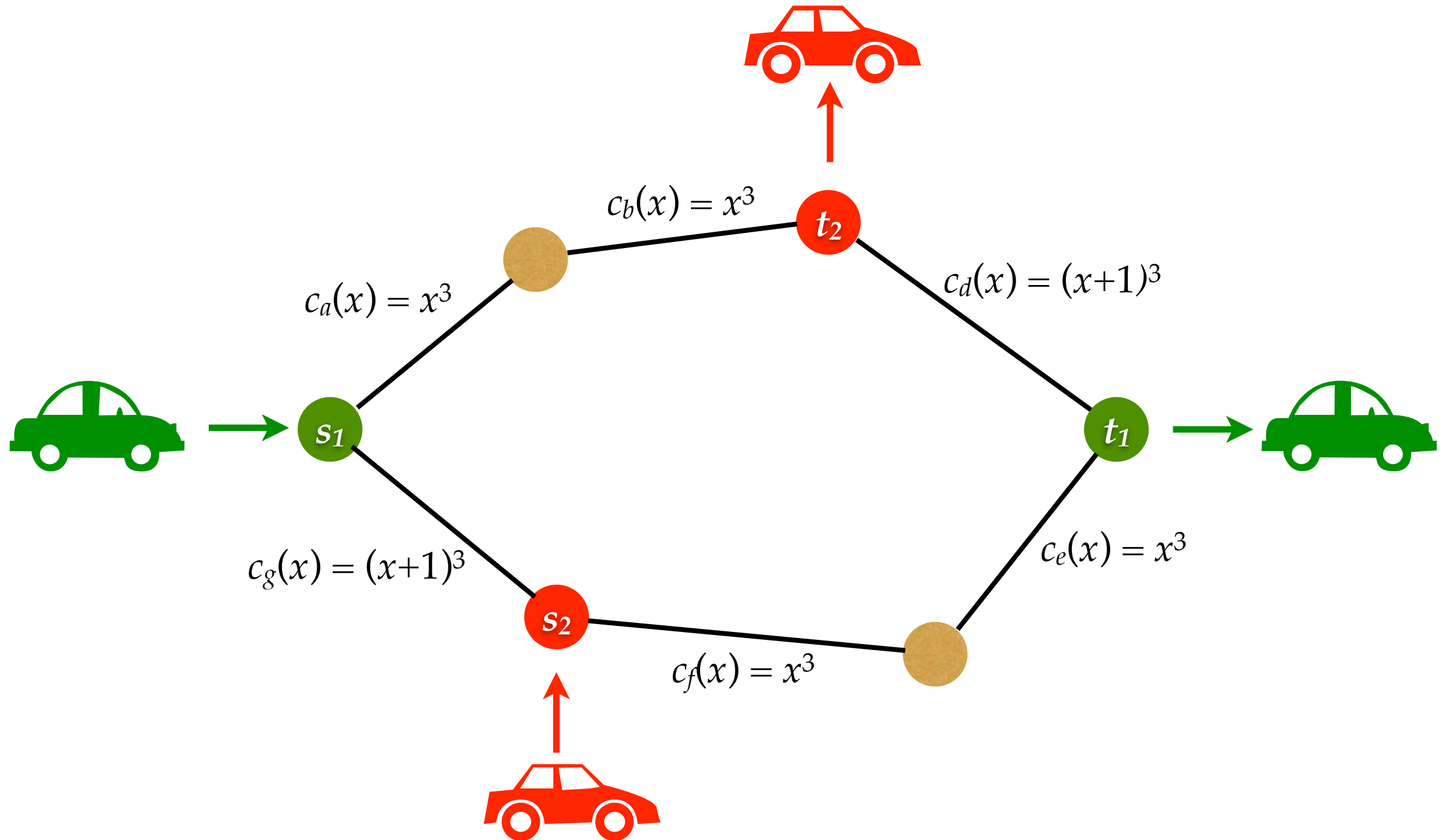
Technische Universität Berlin

Alexander Skopalik

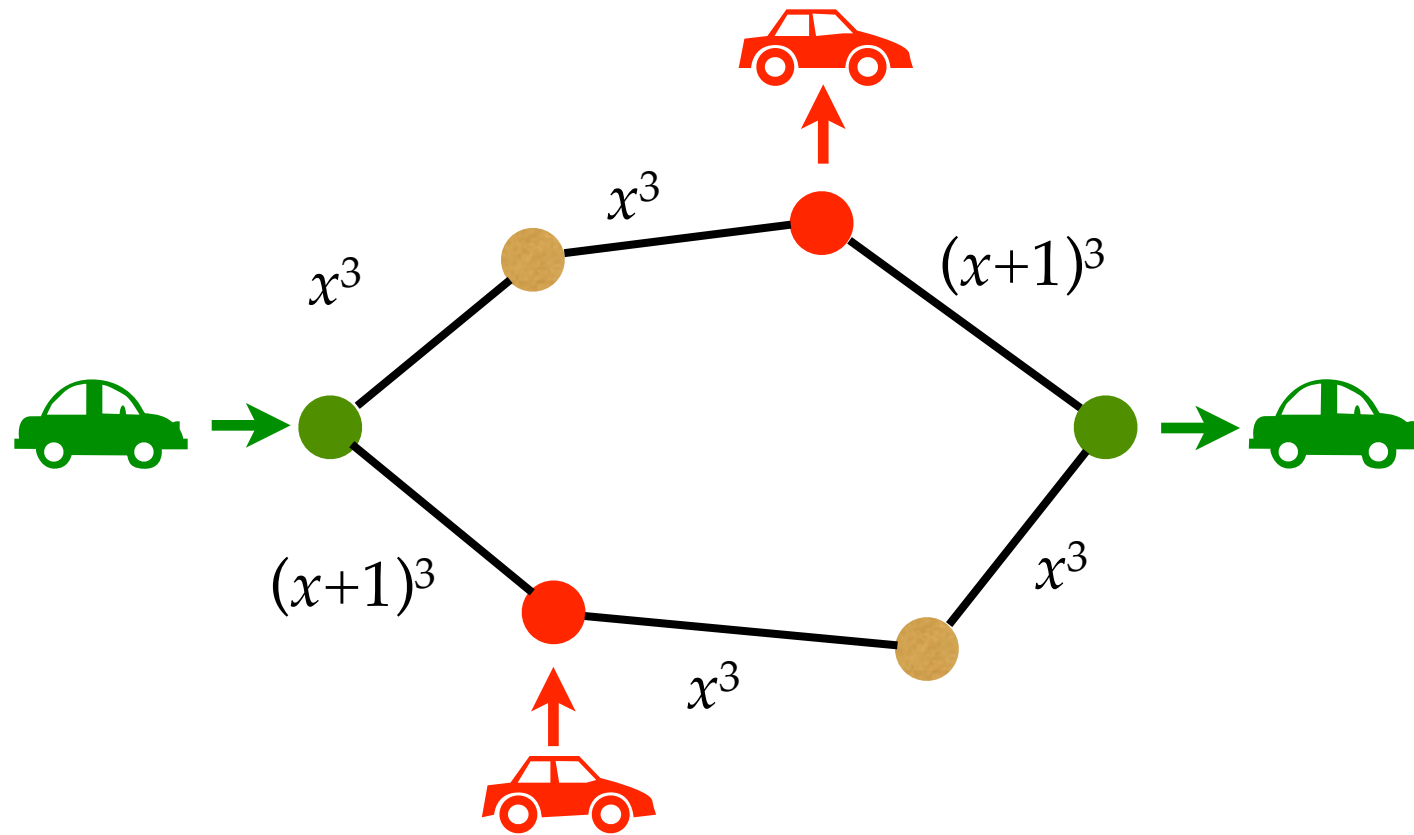


Heinz Nixdorf Institute  
University of Paderborn

# Introduction



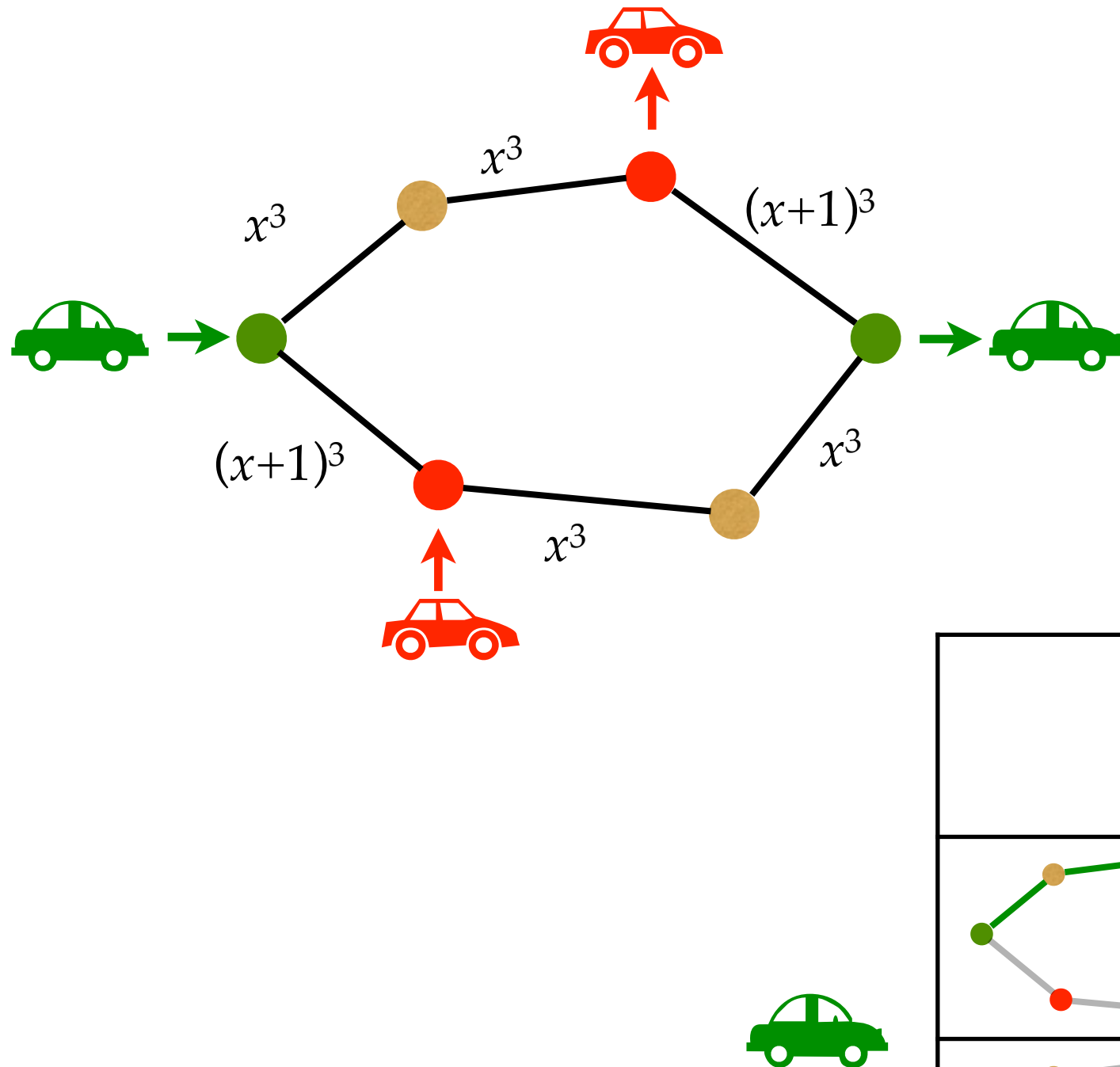
# Introduction



## Nash equilibrium

Strategy combination such that no player can unilaterally improve

# Introduction

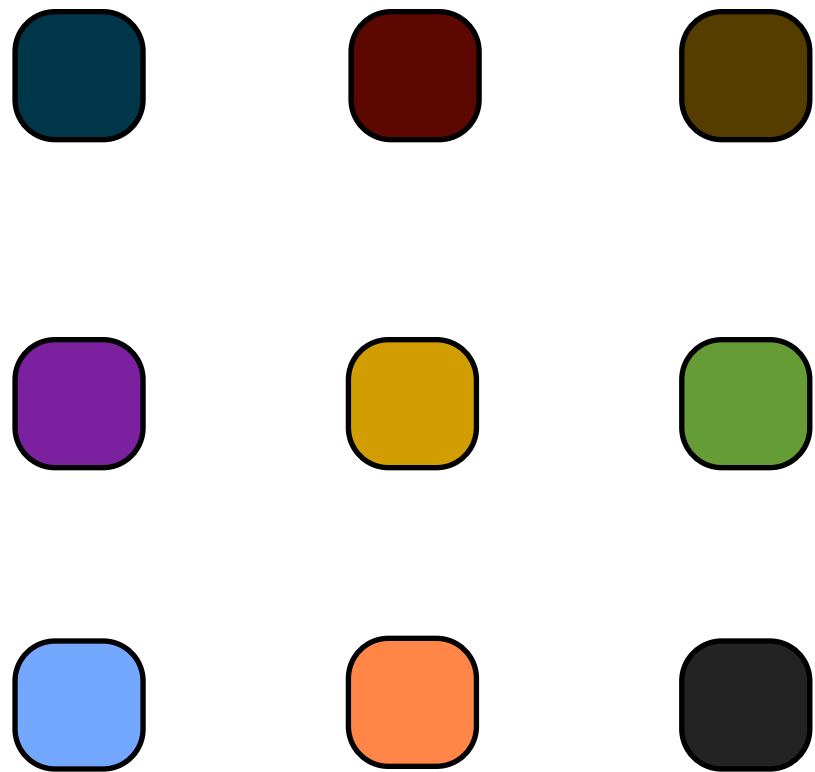


## Nash equilibrium

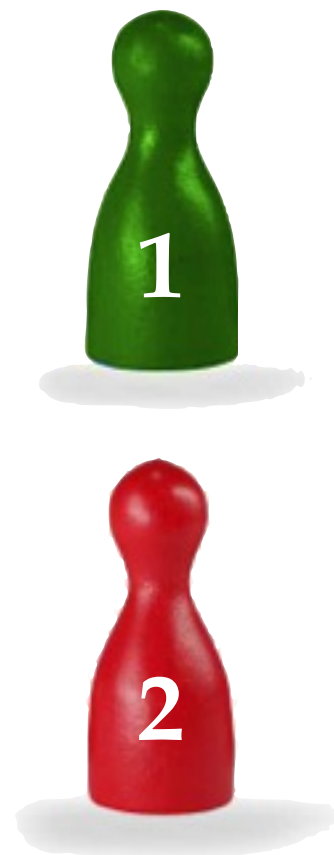
Strategy combination such that no player can unilaterally improve

	24, 24	29, 29
	29, 29	24, 24

# Congestion games

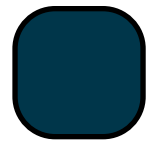


set of resources  $R$

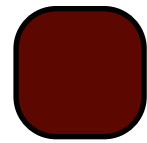


set of players  $N$

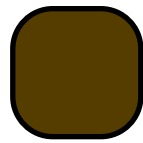
# Congestion games



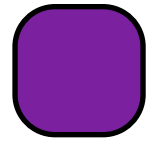
$c_a$



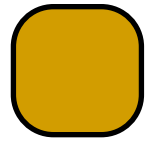
$c_b$



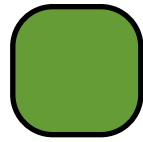
$c_d$



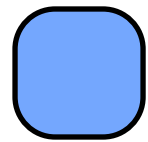
$c_e$



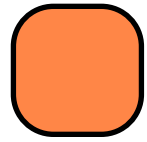
$c_f$



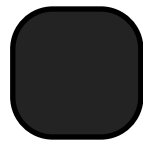
$c_g$



$c_h$



$c_k$



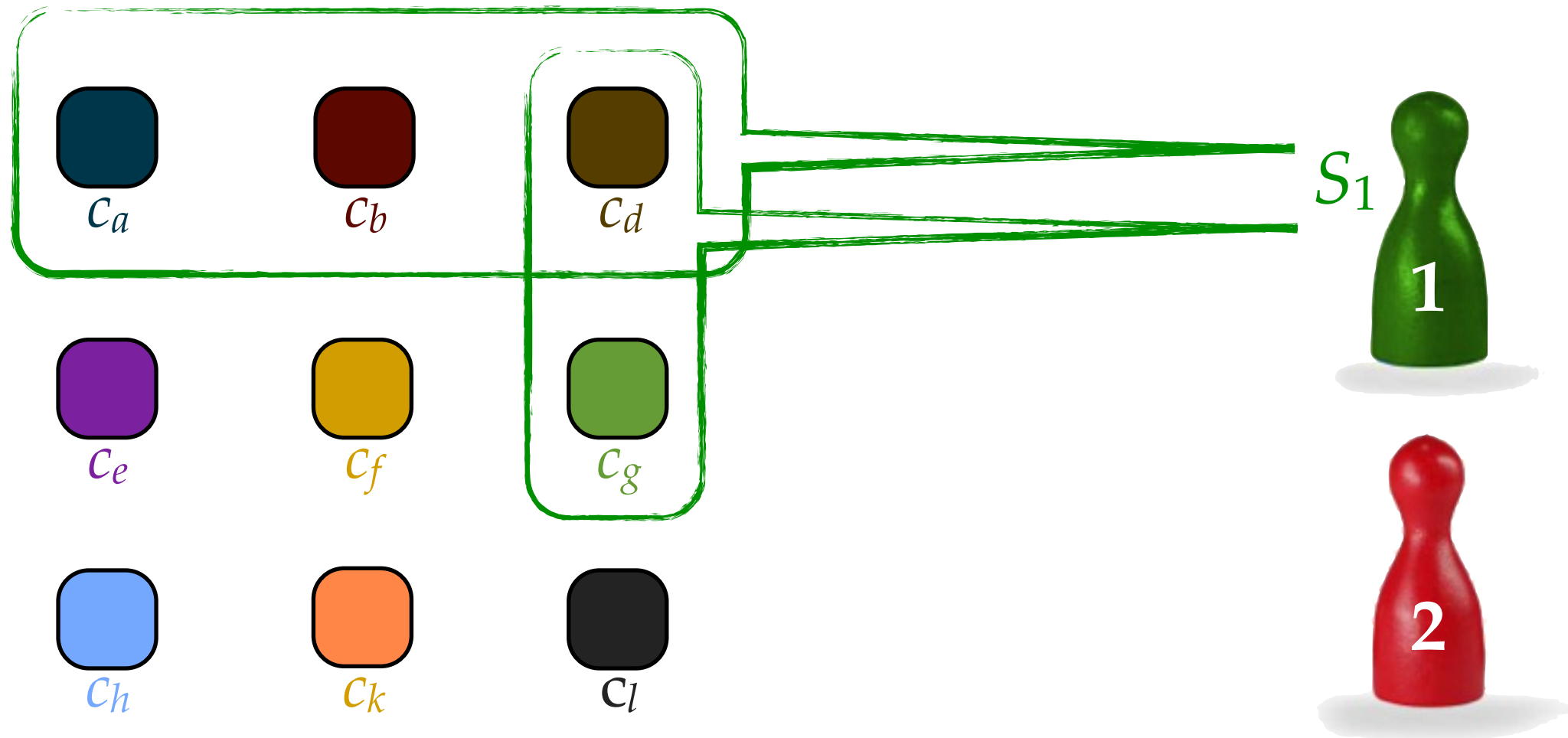
$c_l$

set of resources  $R$   
with cost functions  $c_r : \mathbb{R}_{\geq 0} \rightarrow \mathbb{R}$



set of players  $N$

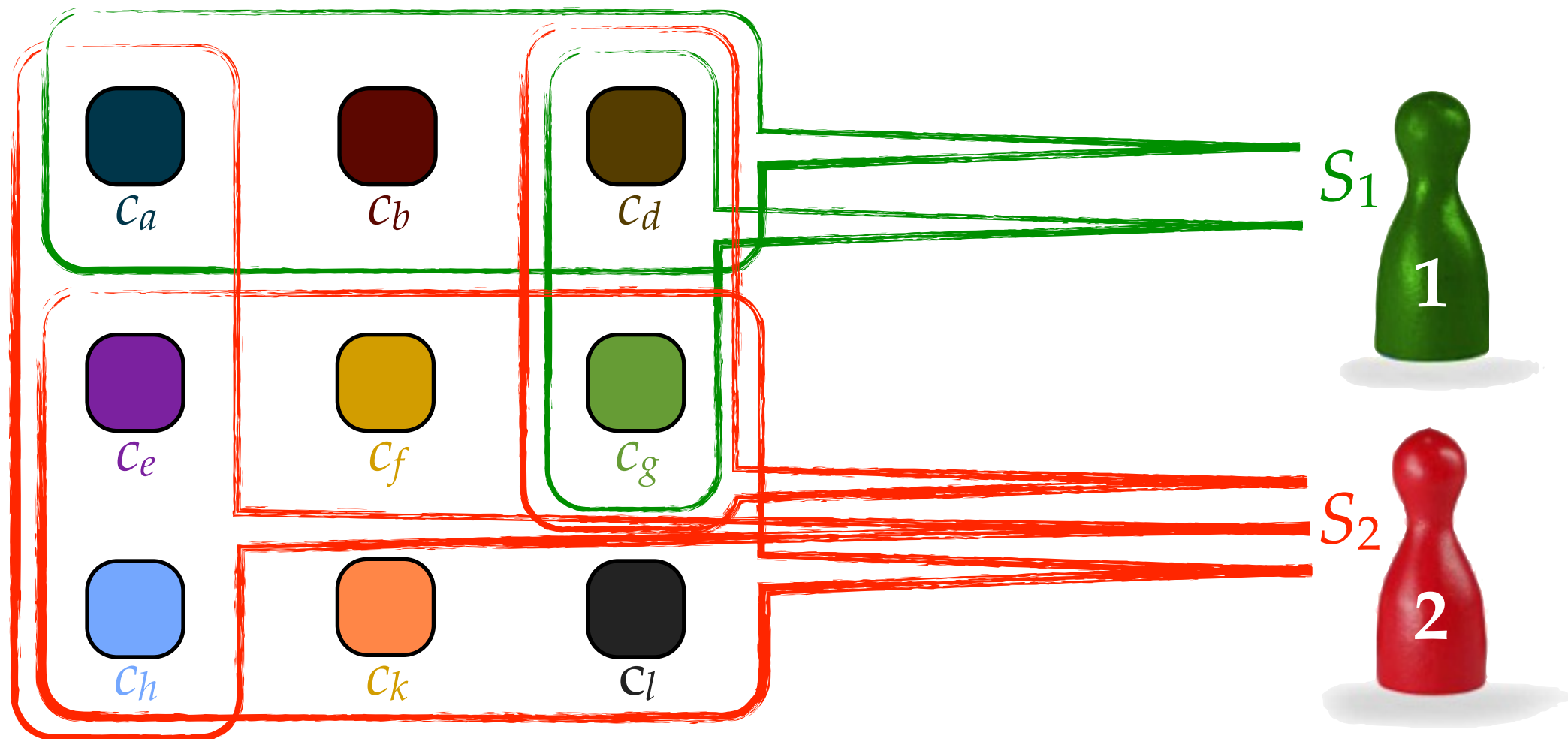
# Congestion games



set of resources  $R$   
with cost functions  $c_r : \mathbb{R}_{\geq 0} \rightarrow \mathbb{R}$

set of players  $N$   
with strategies  $S_i \subseteq 2^R$

# Congestion games

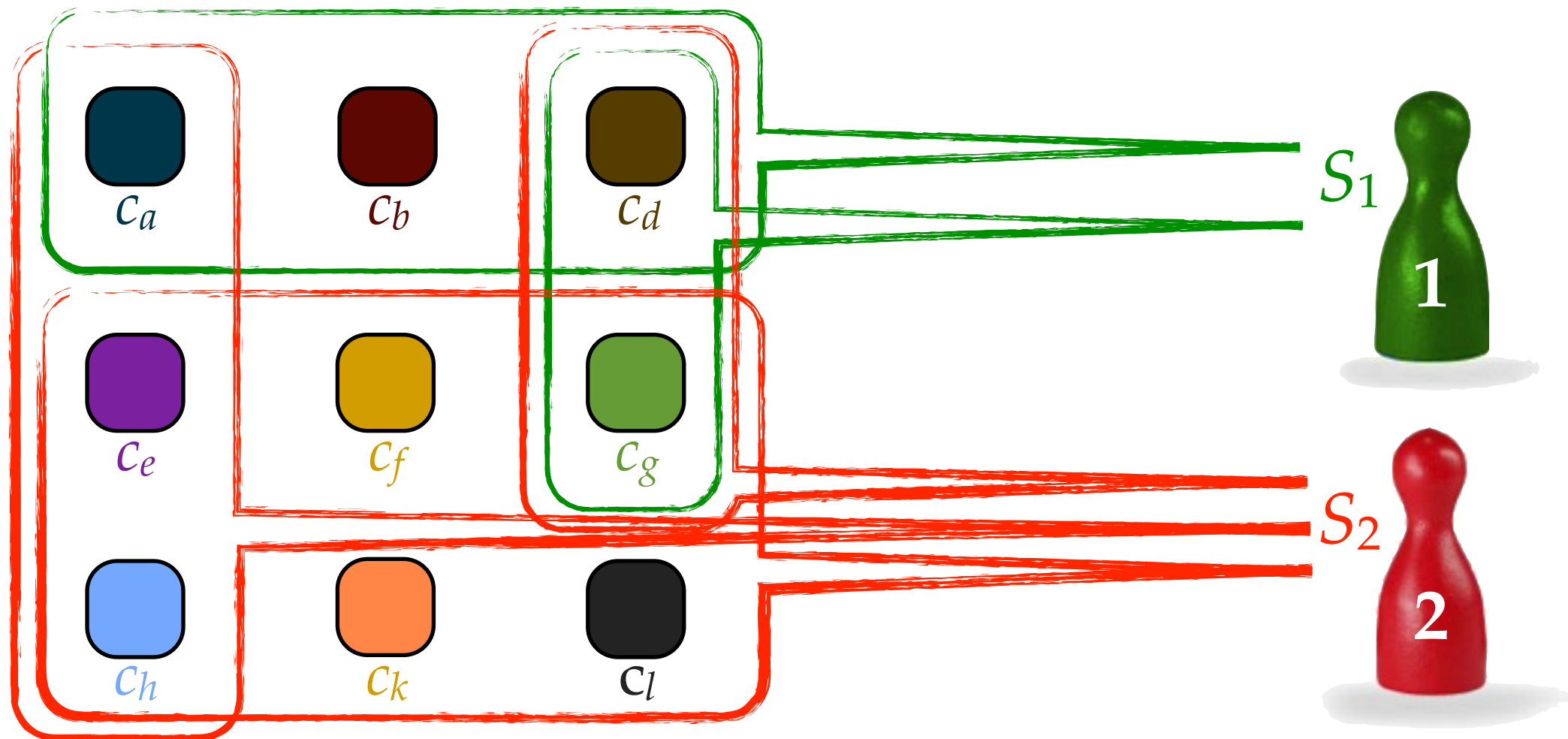


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# Congestion games



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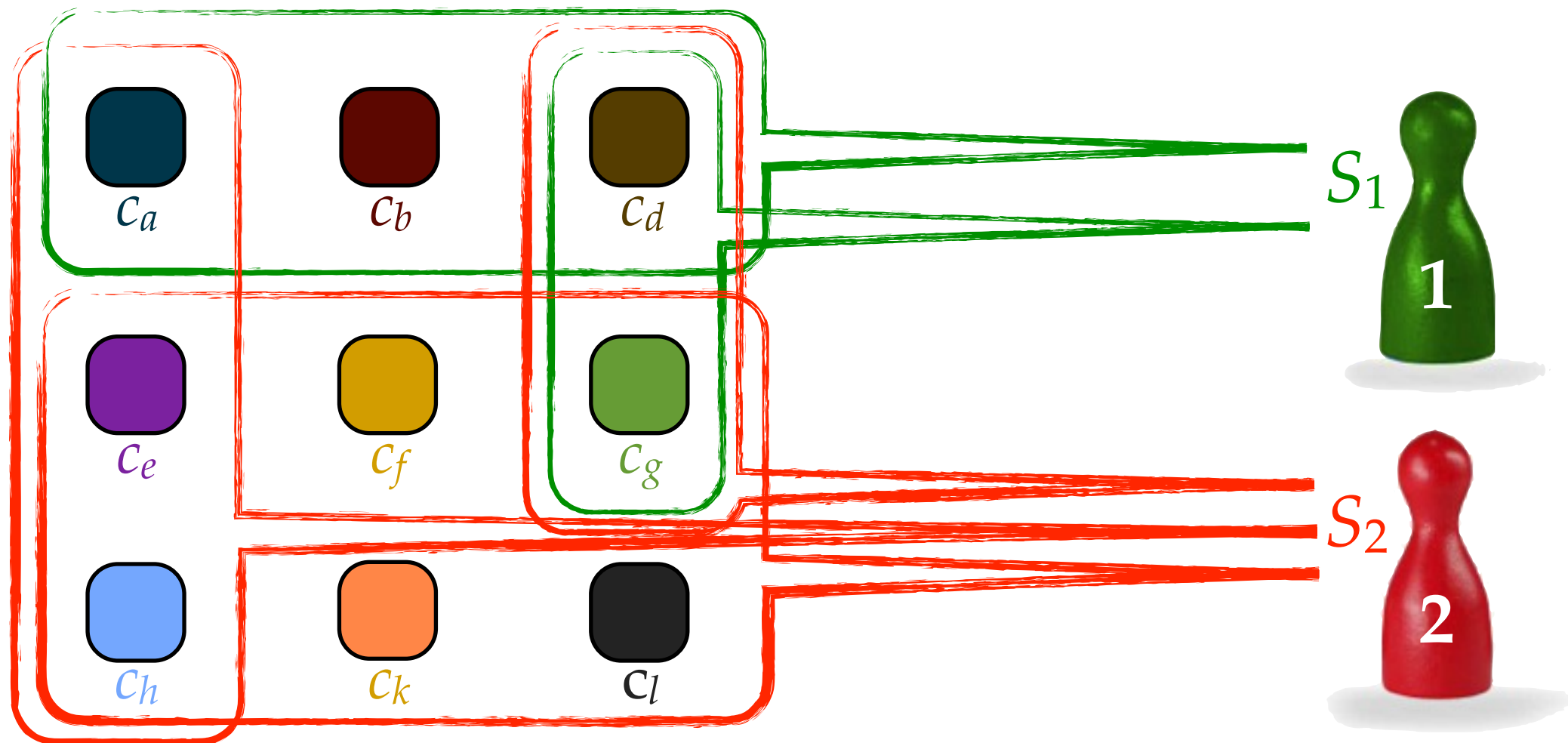
congestion game private costs:  $\pi_i(s) = \sum_{r \in s_i} c_r(|j \in N : r \in s_j|)$

# Congestion games

[Rosenthal, IJGT '73]

Theorem Congestion games have a Nash equilibrium.

# Weighted congestion games

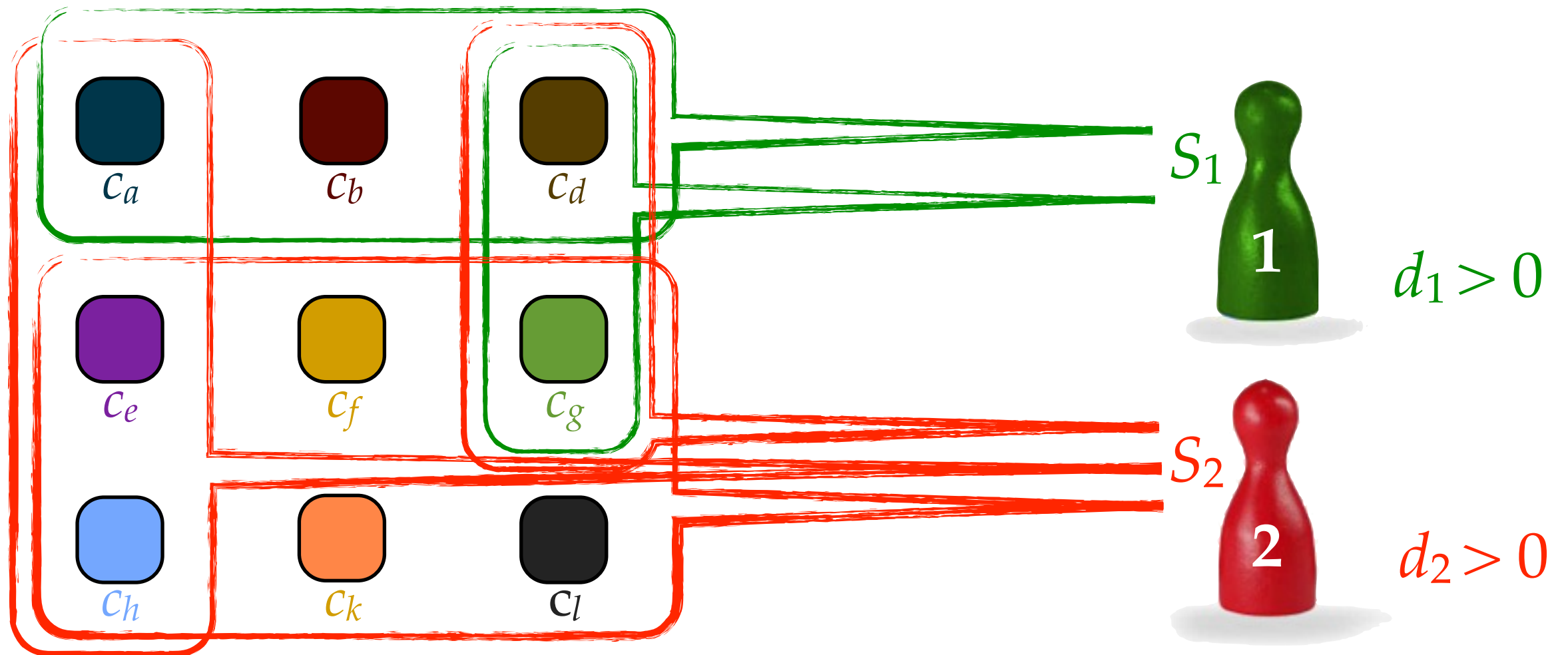


Set of Resources  $R$   
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# Weighted congestion games



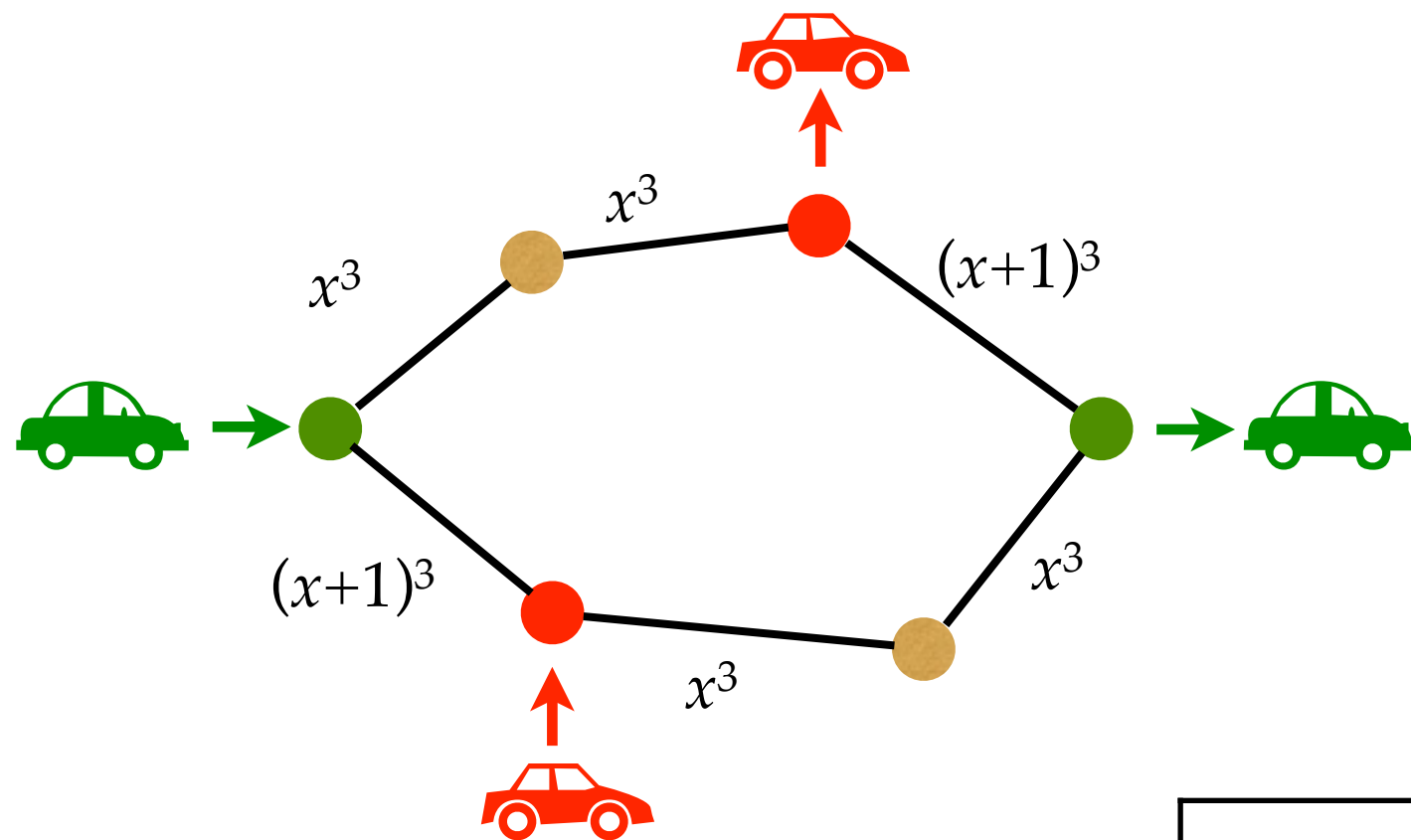
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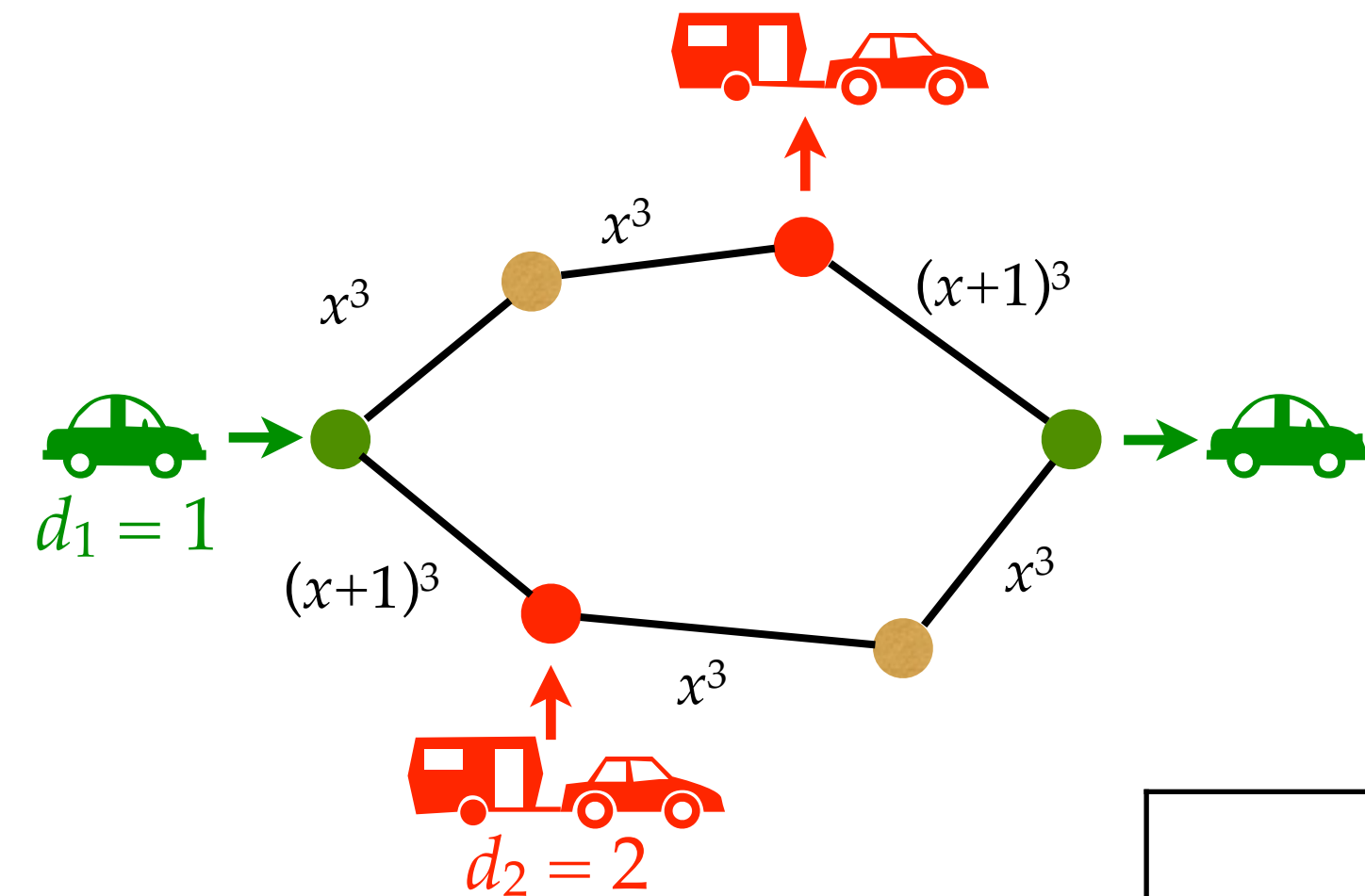
weighted congestion game private costs:  $\pi_i(s) = \sum_{r \in S_i} d_i c_r(\sum_{j \in N : r \in S_j} d_j)$

# Weighted congestion games



	24, 24	29, 29
	29, 29	24, 24

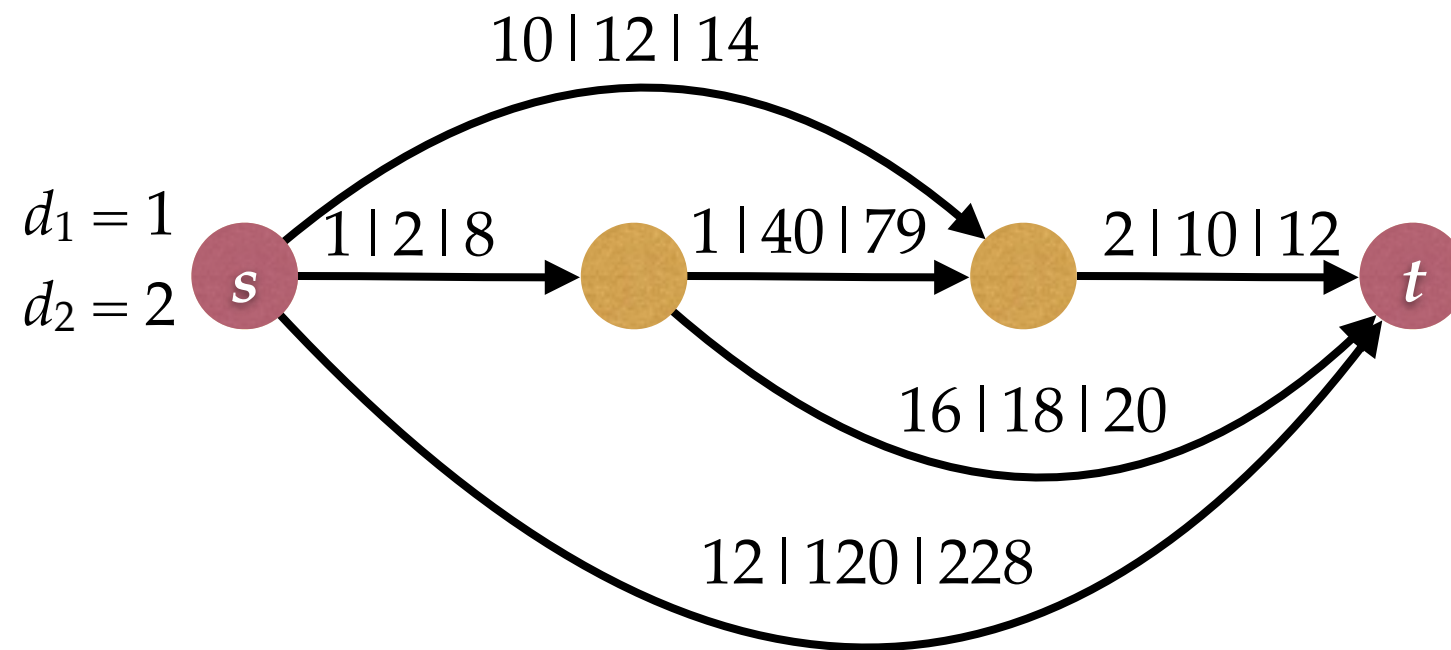
# Weighted congestion games



	62, 162	66, 160
	66, 160	62, 162

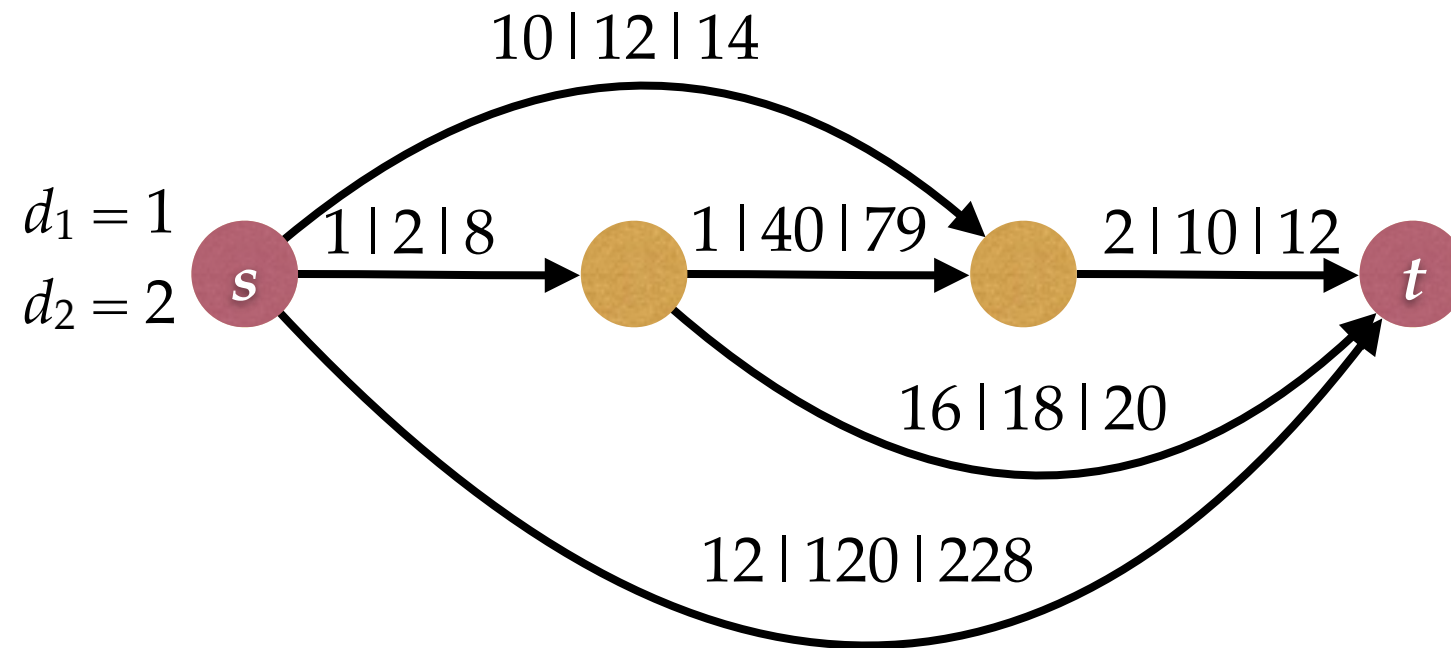
# Further counterexamples

[Fotakis et al., TCS '05]

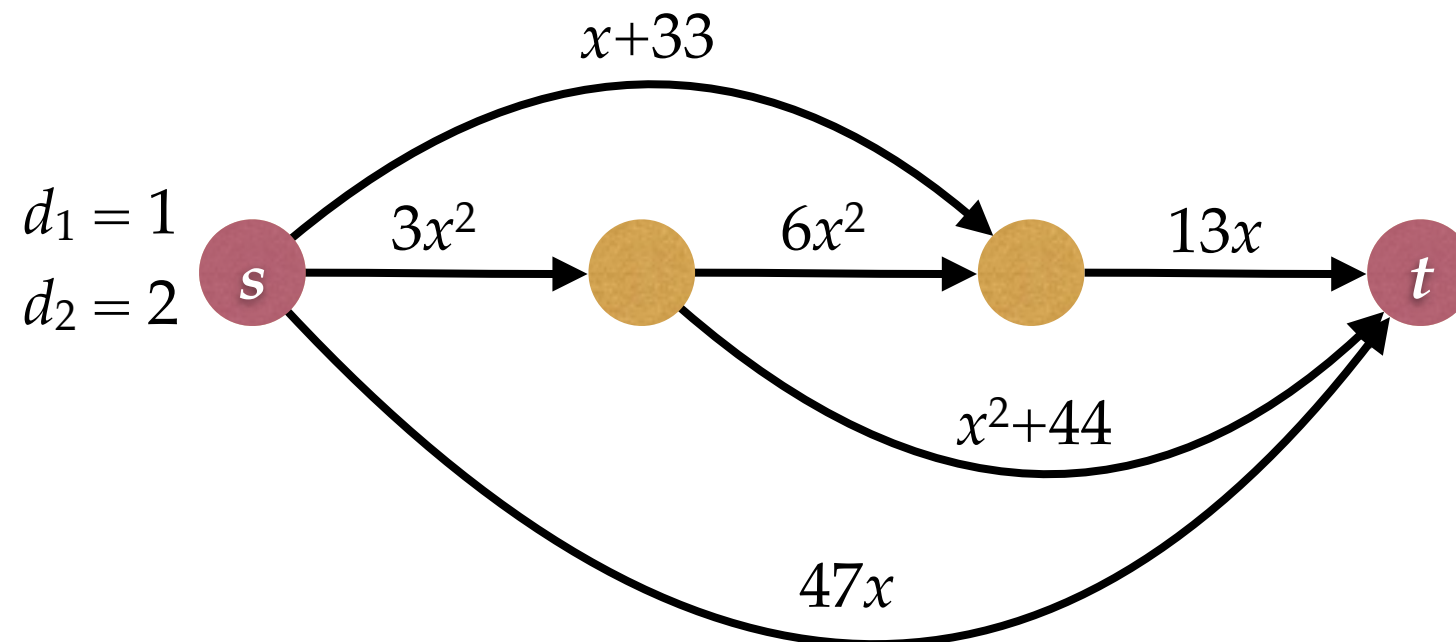


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[Fotakis et al., TCS '05]



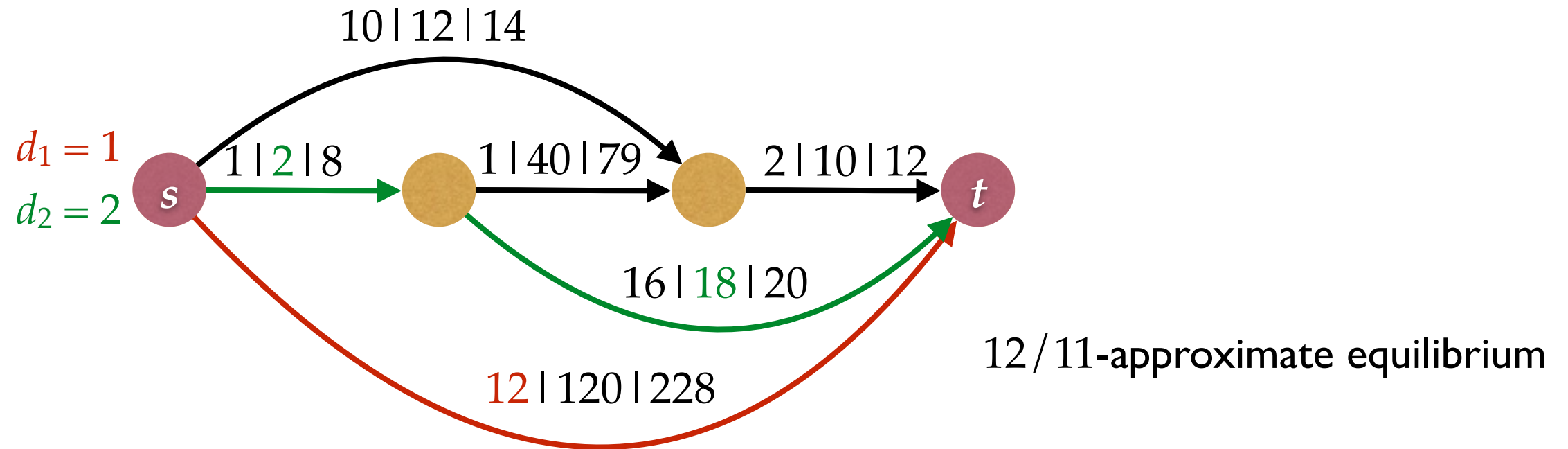
[Goemans et al., FOCS '05]



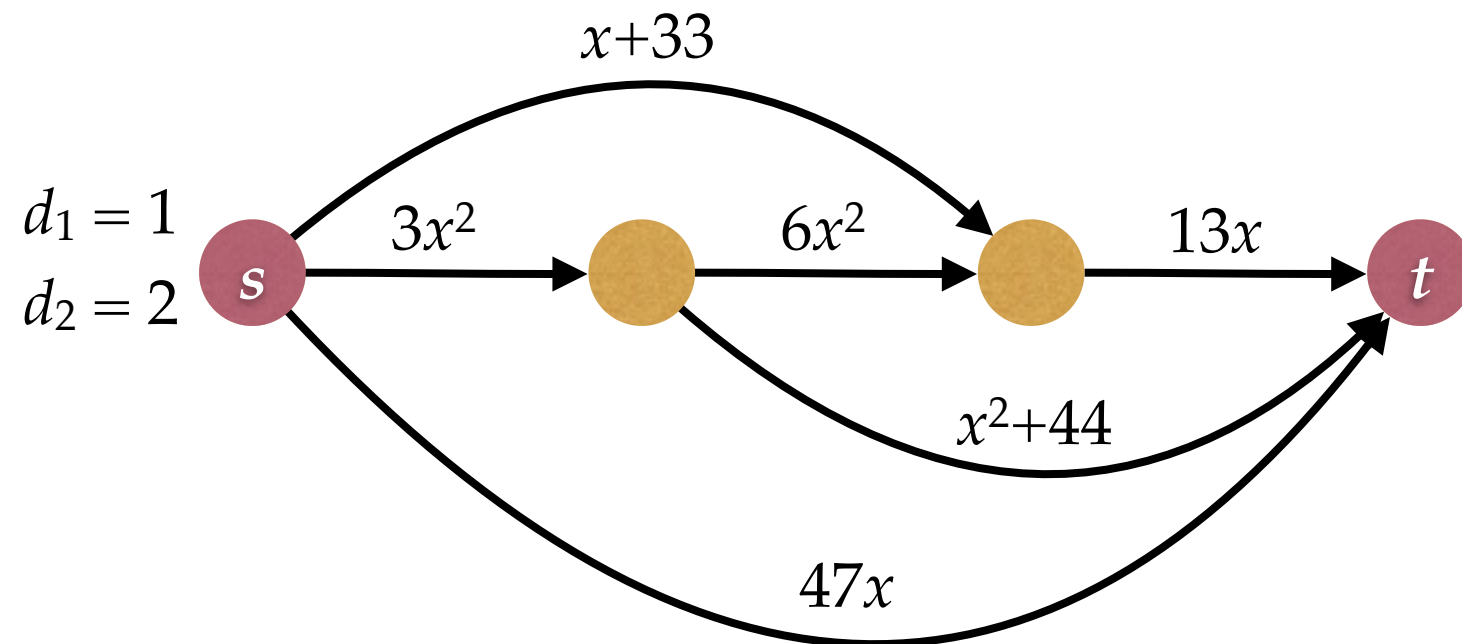


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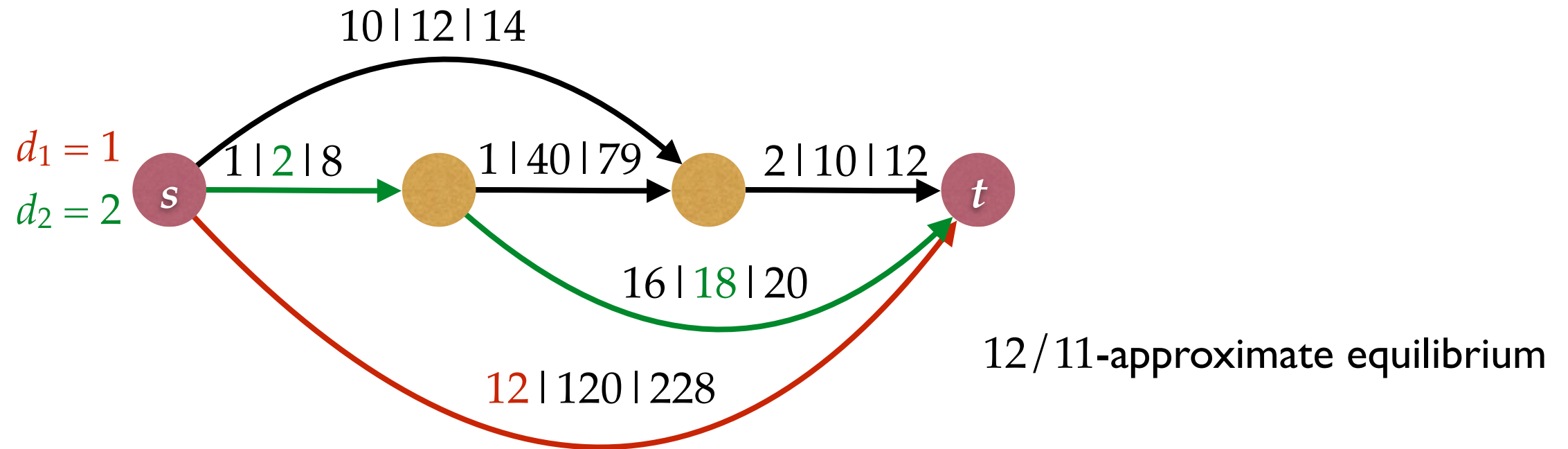


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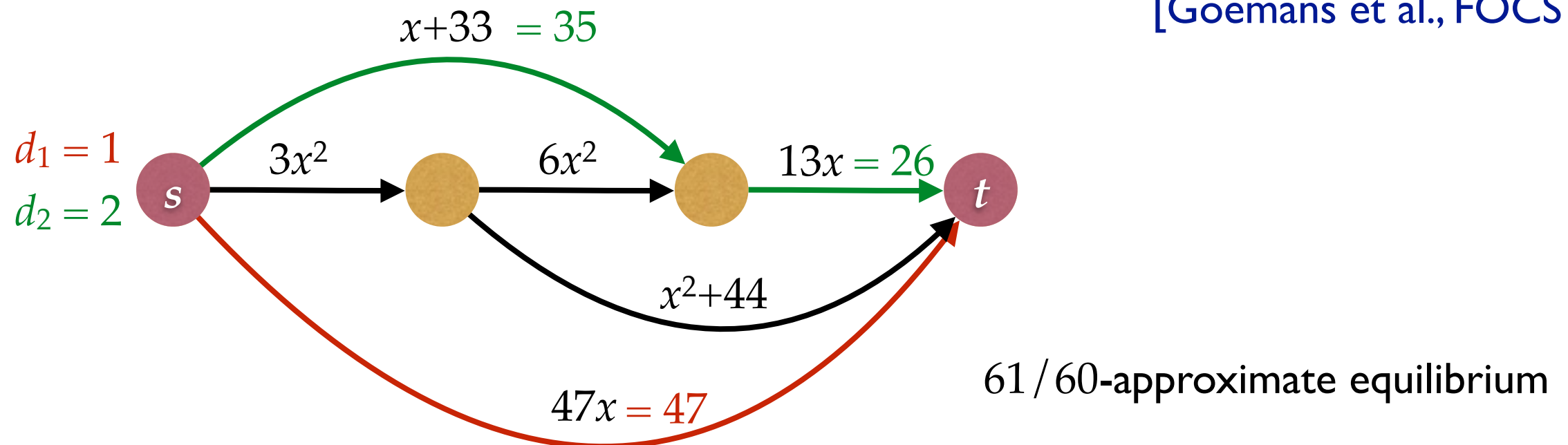


# Further counterexamples

[Fotakis et al., TCS '05]



[Goemans et al., FOCS '05]



# Previous work

[Caragiannis et al., EC '12]

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Functions	Approximation factors
quadratic	2
cubic	6
polynomials of max. degree $\Delta$	$\Delta!$

---

# Our results

---

Functions

Approximation factors

---

quadratic

2

cubic

6

polynomials of max. degree  $\Delta$

$\Delta+1$

---

# Our results

---

Functions

Approximation factors

---

quadratic

$4/3$

cubic

$1.785\dots$

polynomials of max. degree  $\Delta$

$\Delta+1$

---

# Our results

---

Functions

Approximation factors

---

quadratic

$4/3$

cubic

1.785...

polynomials of max. degree  $\Delta$

$\Delta+1$

concave

$3/2$

---

# Our results

---

Functions

Approximation factors

2 players

all games

---

quadratic

1.054...

$4/3$

cubic

1.074...

1.785...

polynomials of max. degree  $\Delta$

$\Delta+1$

concave

$3/2$

---

# The potential function argument

[Rosenthal, IJGT '73]

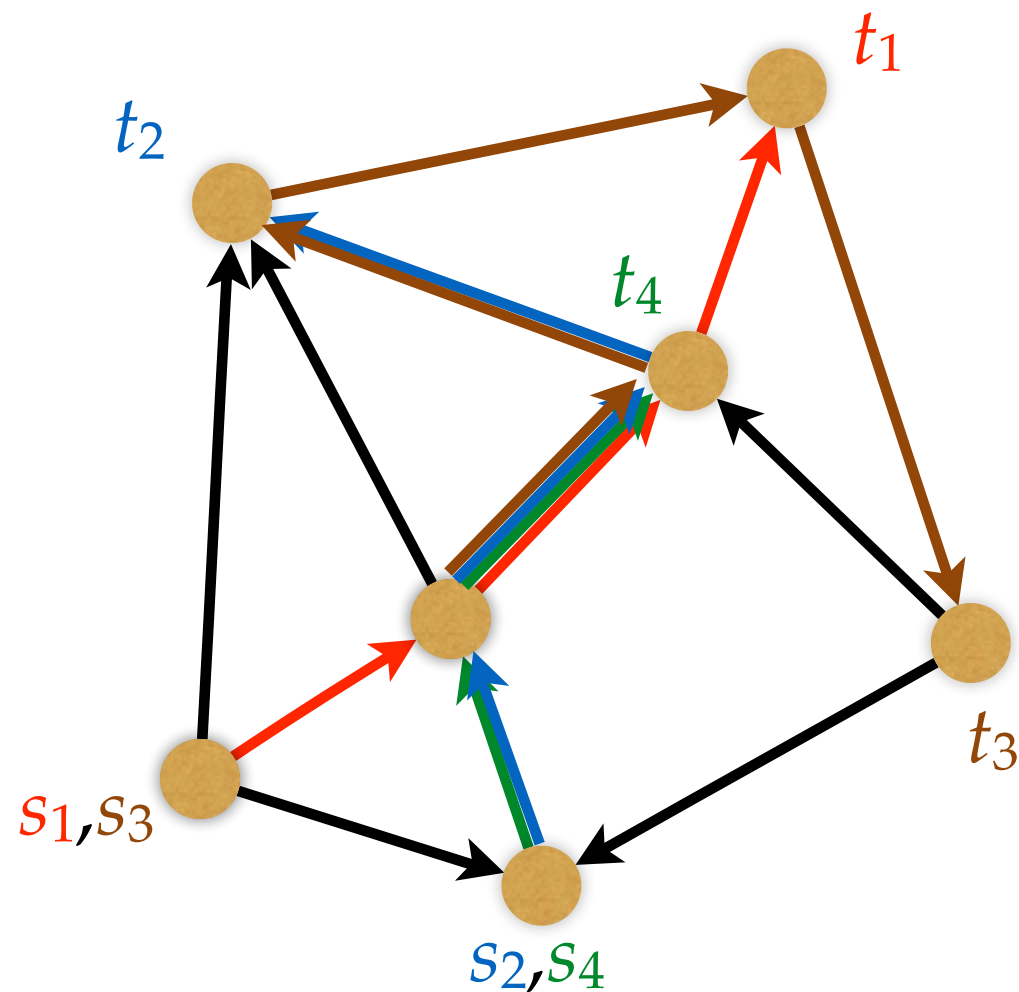
- ▶ Let  $P(s) = \sum_{r \in R} P_r(s)$ , where  $\sum_{k=1, \dots, d_r(s)} c_r(k)$



# The potential function argument

[Rosenthal, IJGT '73]

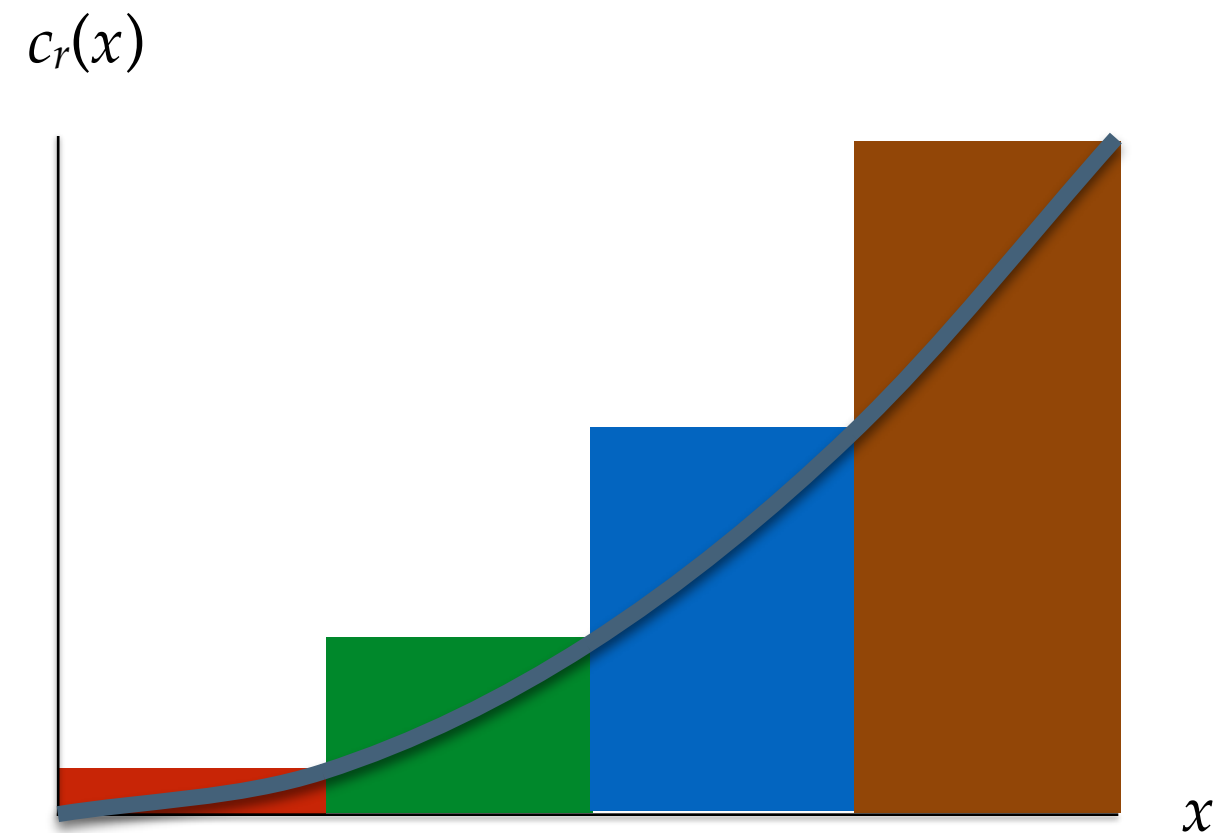
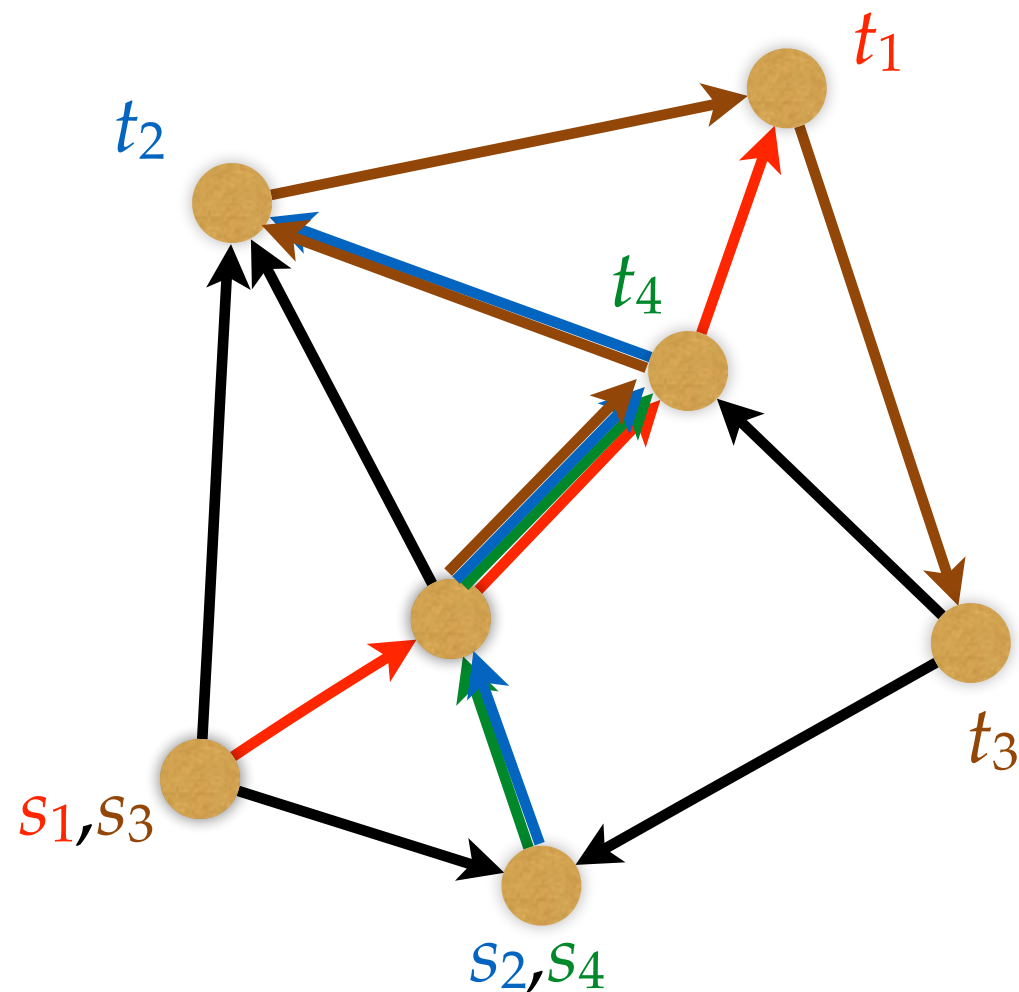
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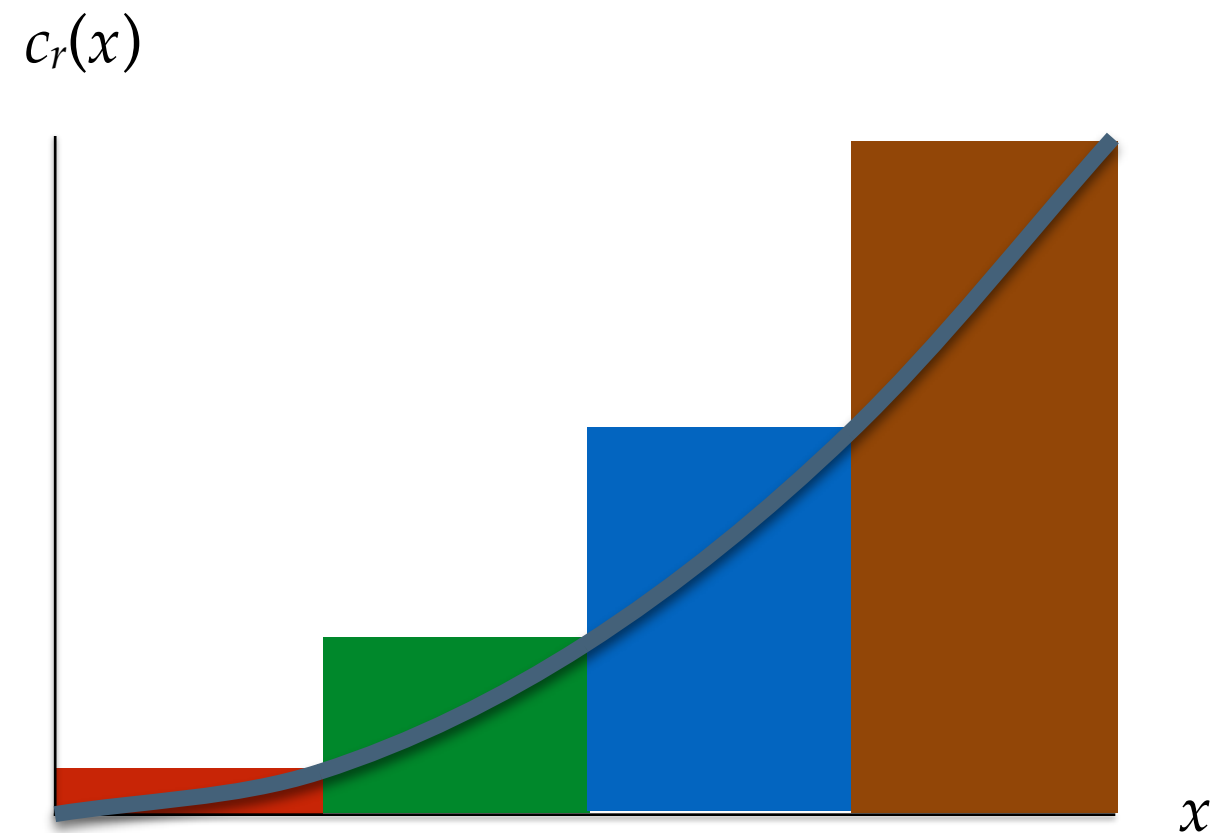
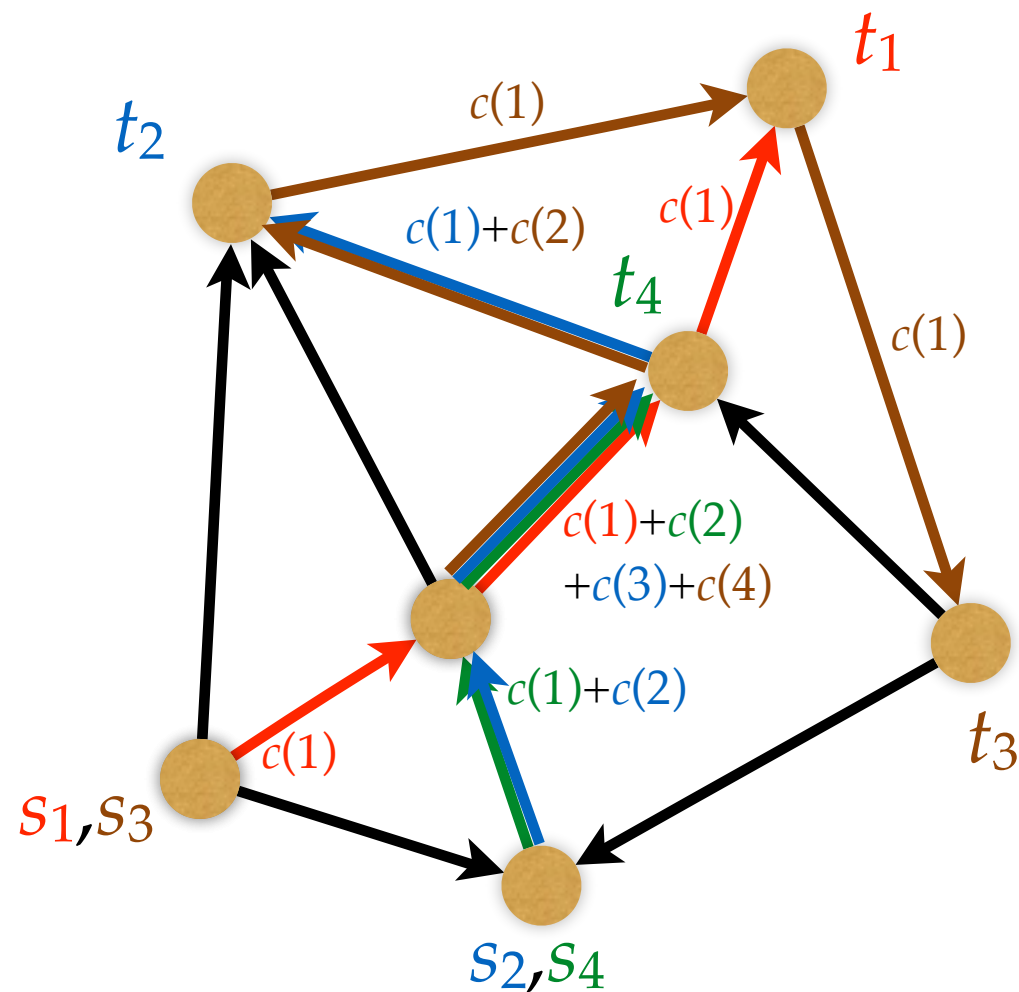
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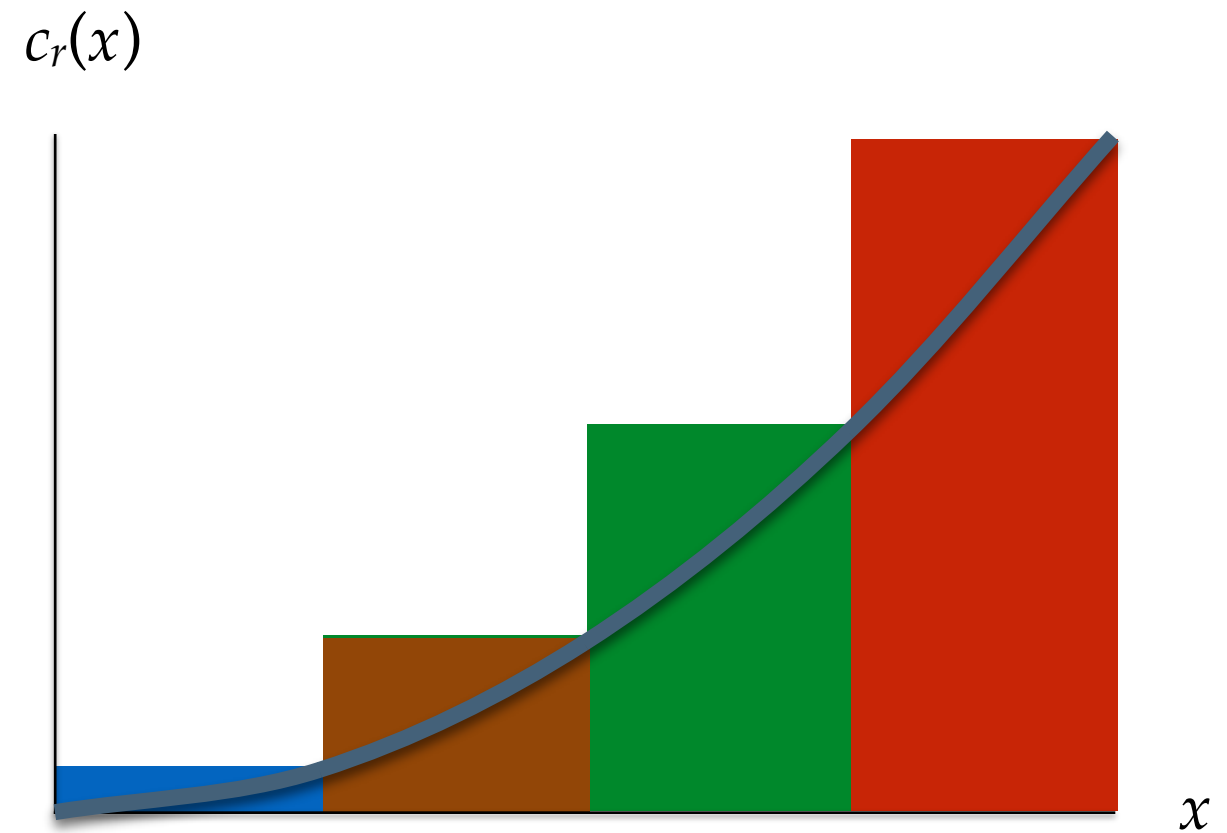
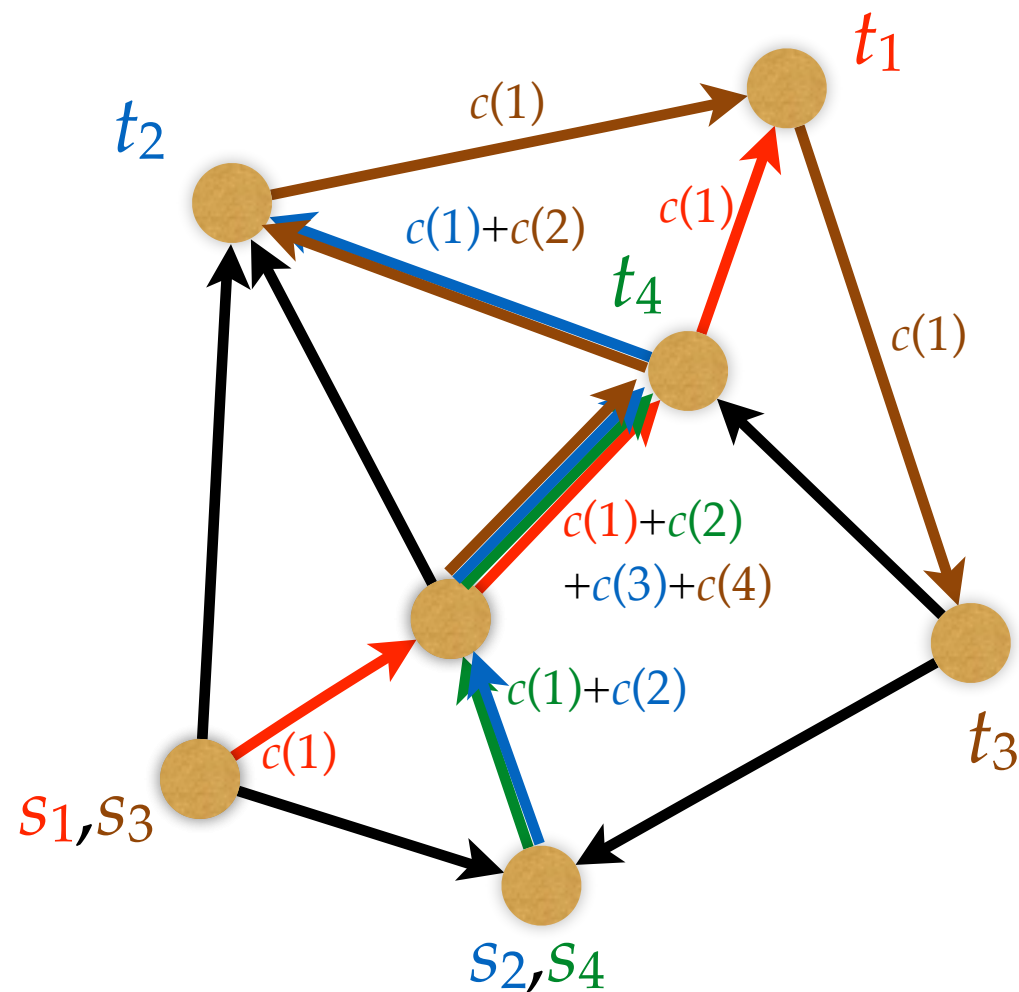
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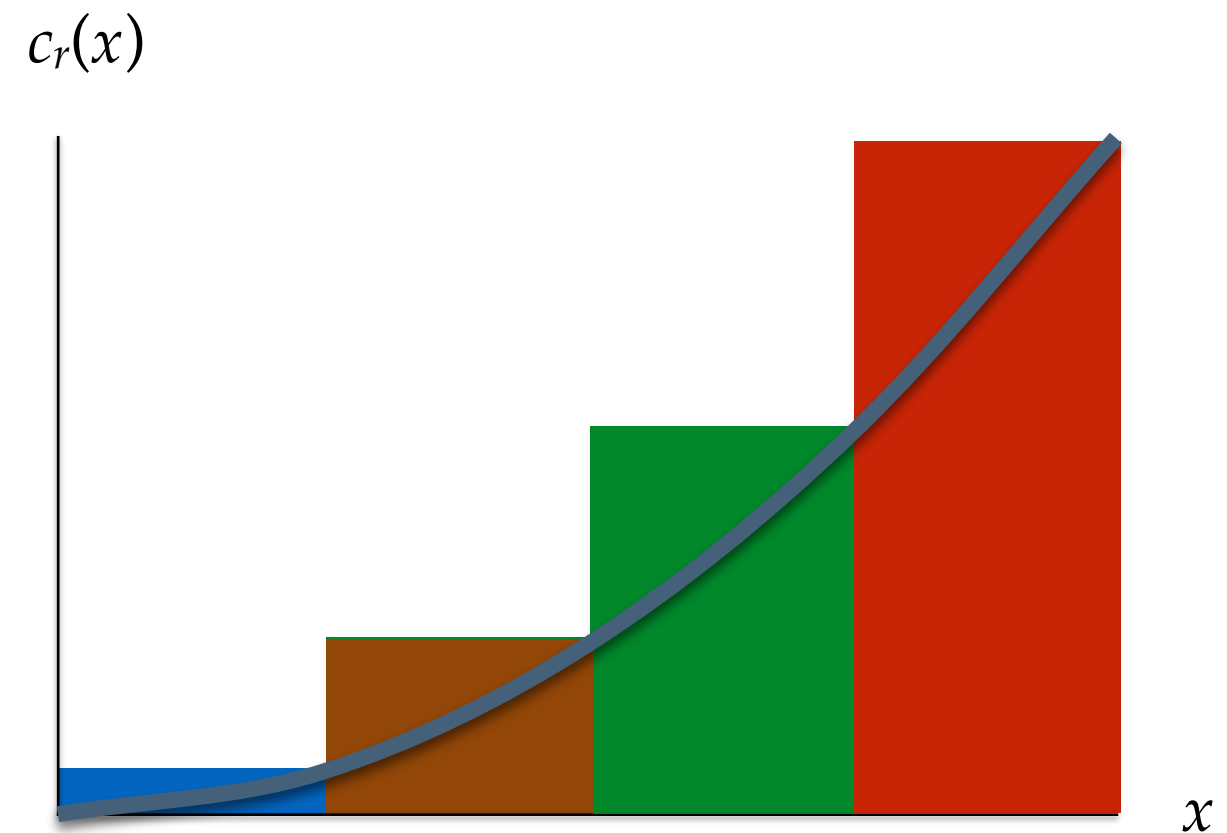
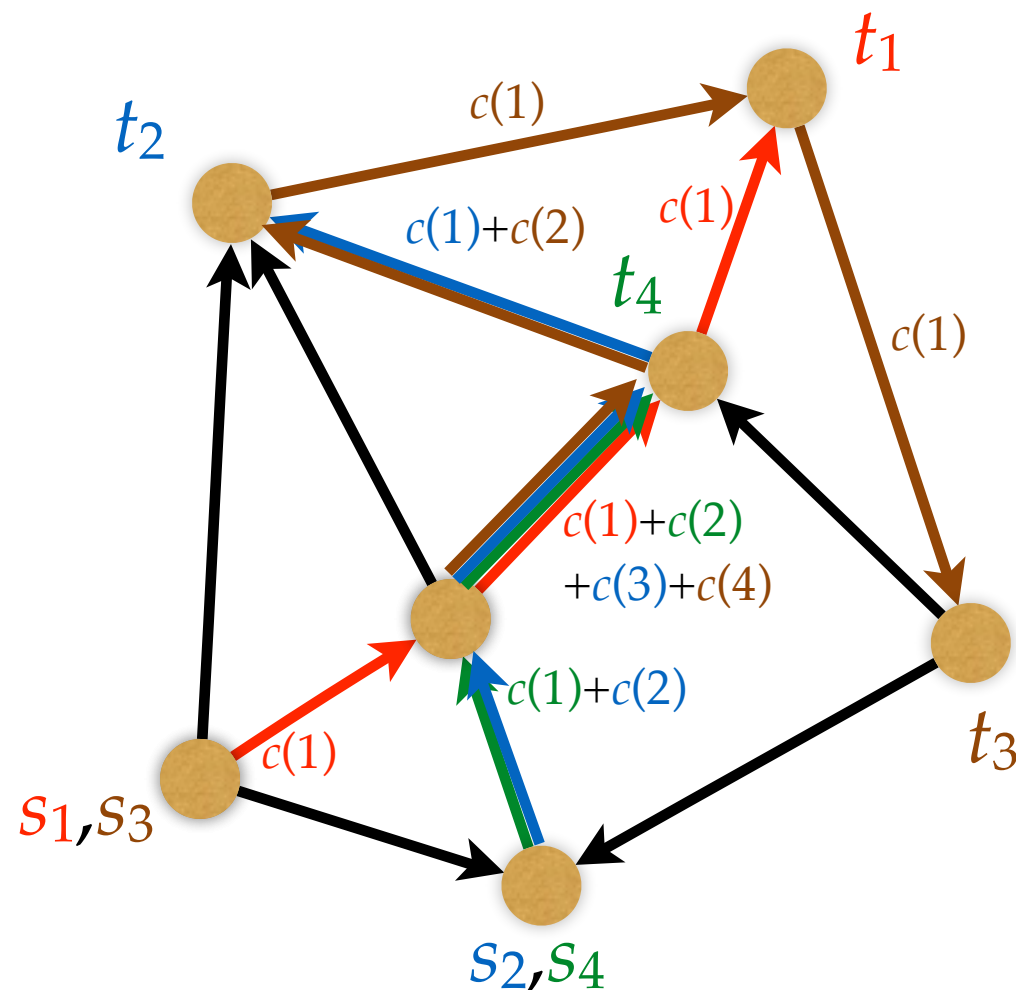
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# The potential function argument

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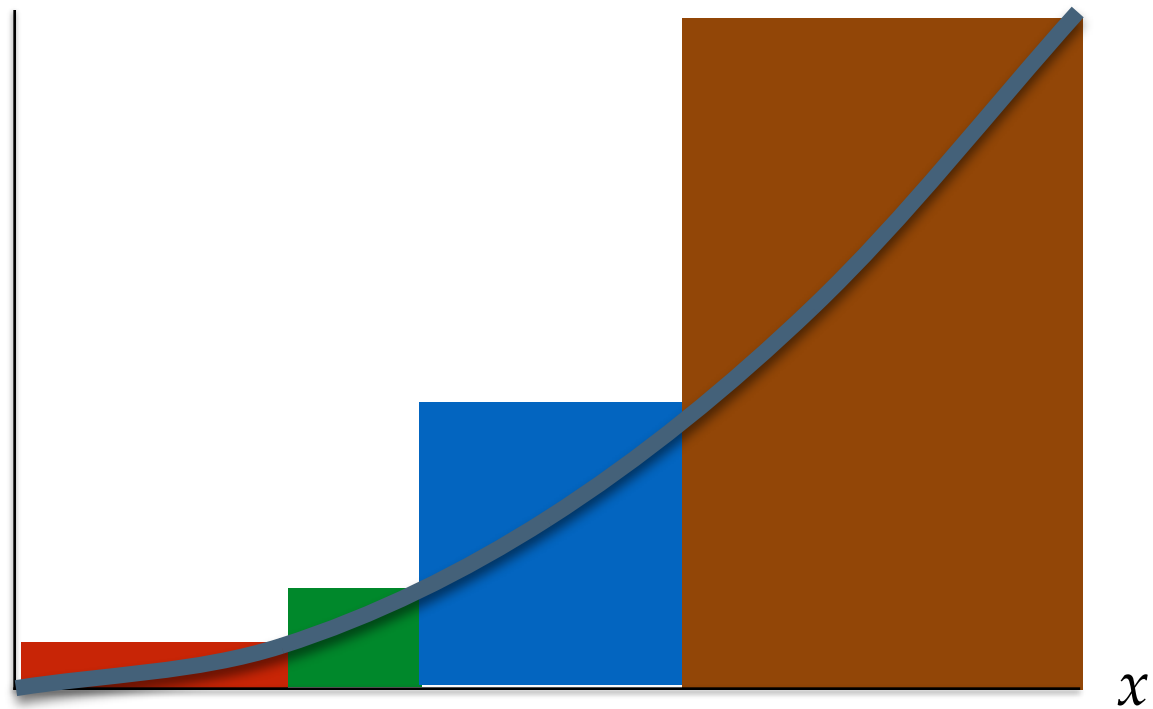
- **Let  $P(s) = \sum_{r \in R} P_r(s)$ , where  $\sum_{k=1, \dots, d_r(s)} c_r(k)$**



$$P(t_n, s_n) - P(s) = \sum_{r \in t_n} c_r(d_r(t_n, s_n)) - \sum_{r \in s_n} c_r(d_r(s)) = \pi_i(t_i, s_i) - \pi_i(s)$$

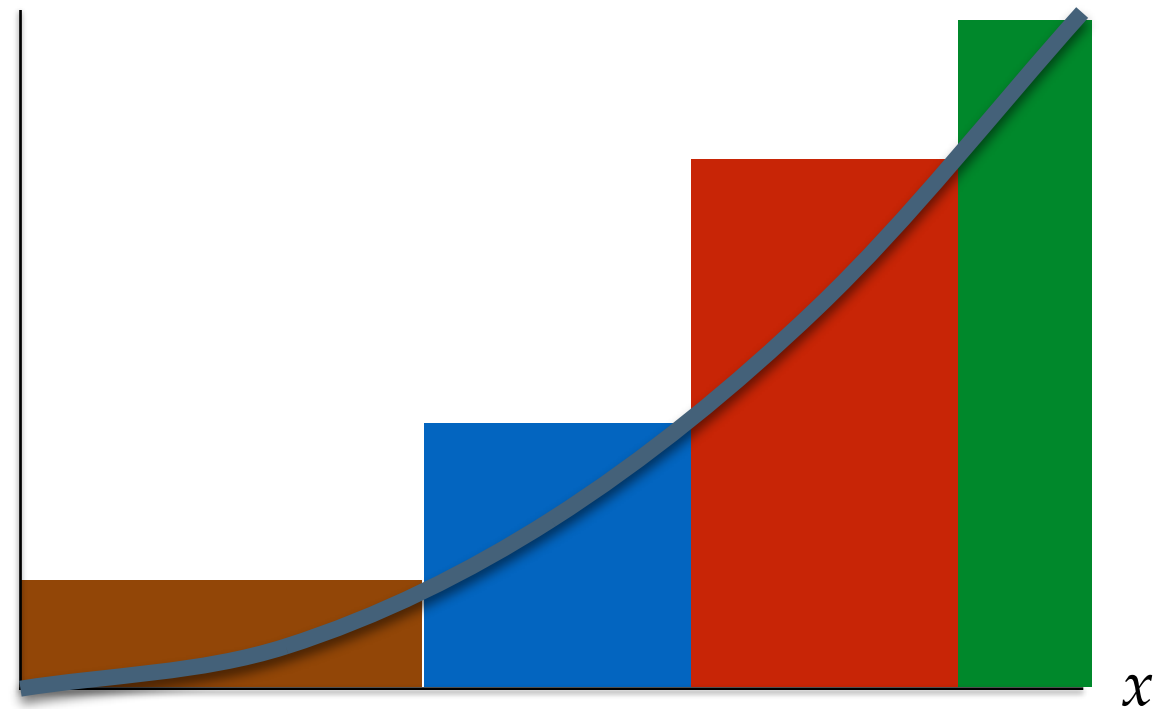
# Weighted players

$c_r(x)$

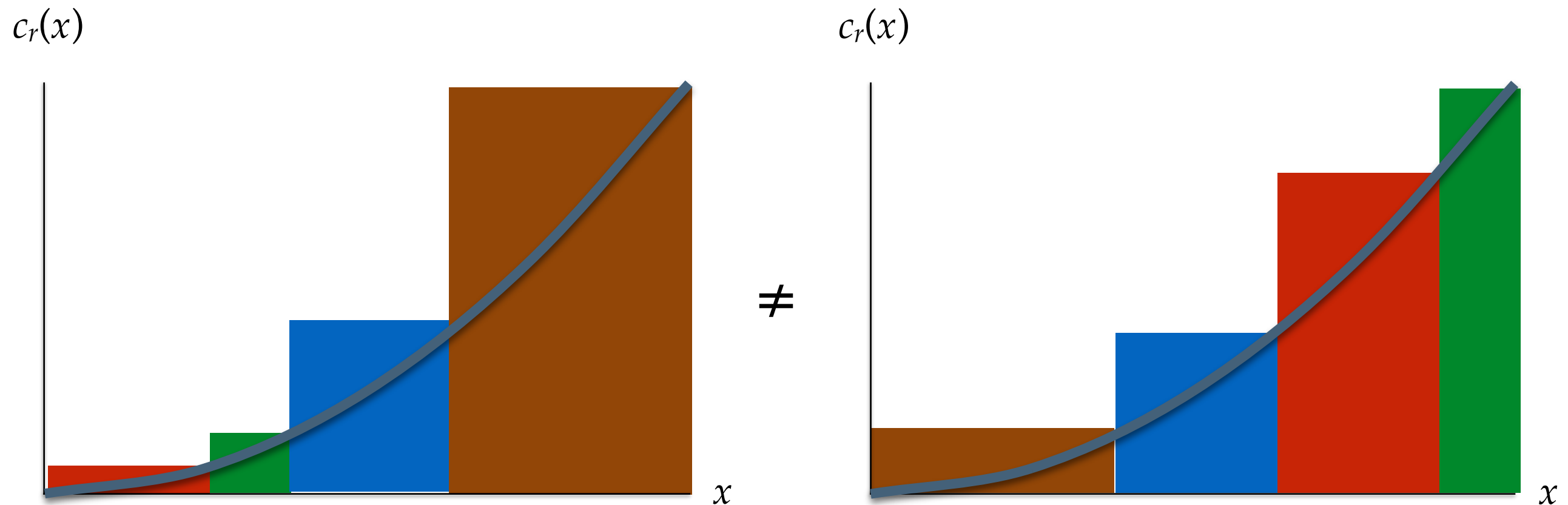


$\neq$

$c_r(x)$



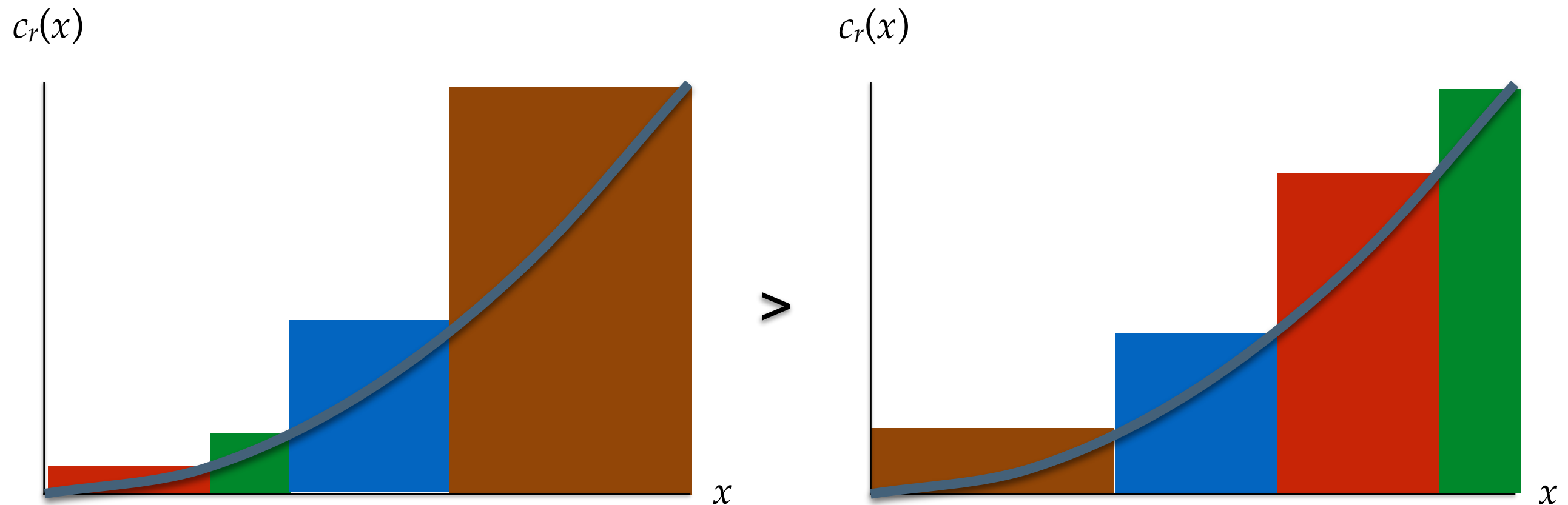
# Weighted players



**Observation** For a convex function,

- ▶ the potential is minimized for non-increasing players
- ▶ the potential is maximized for non-decreasing players

# Weighted players

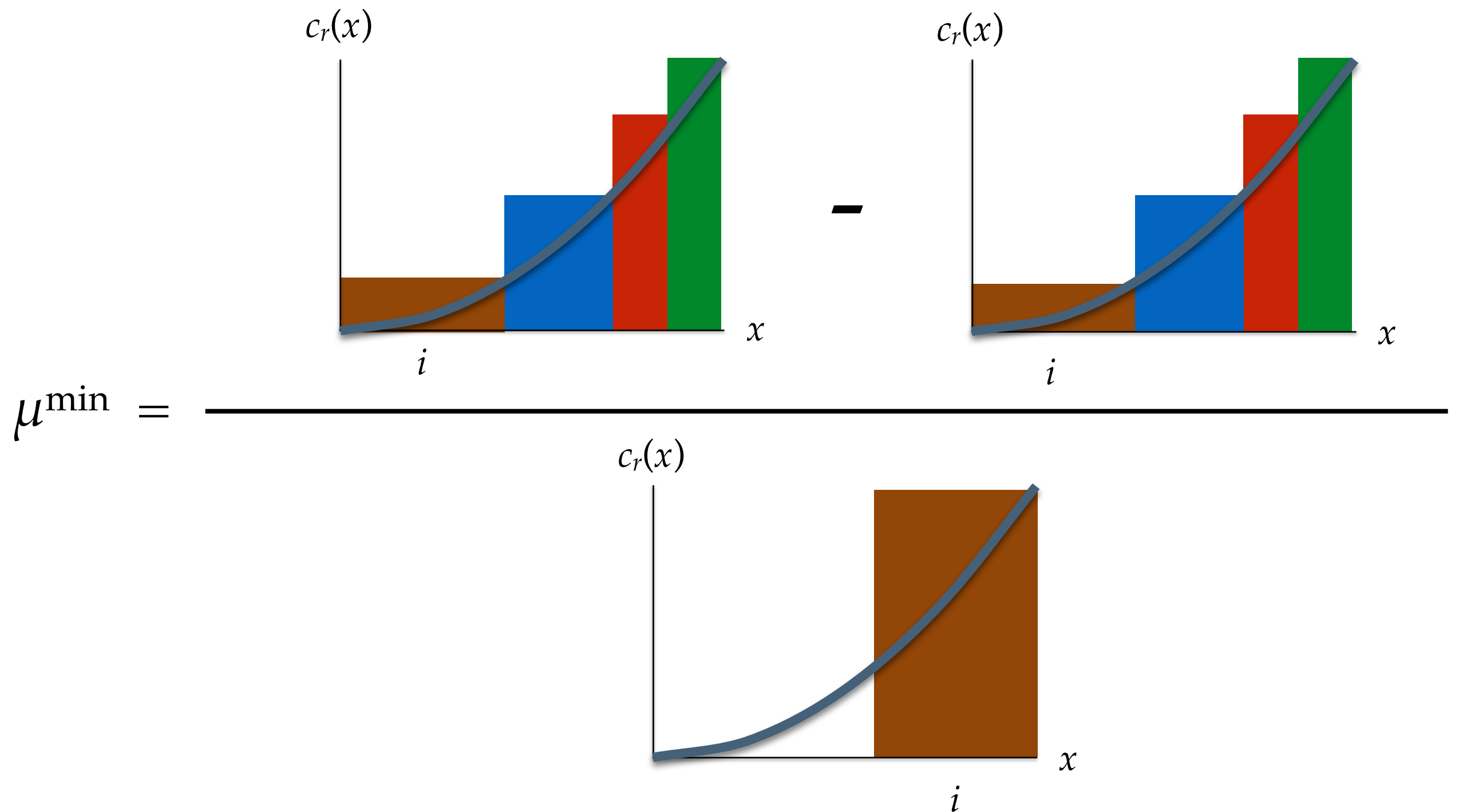


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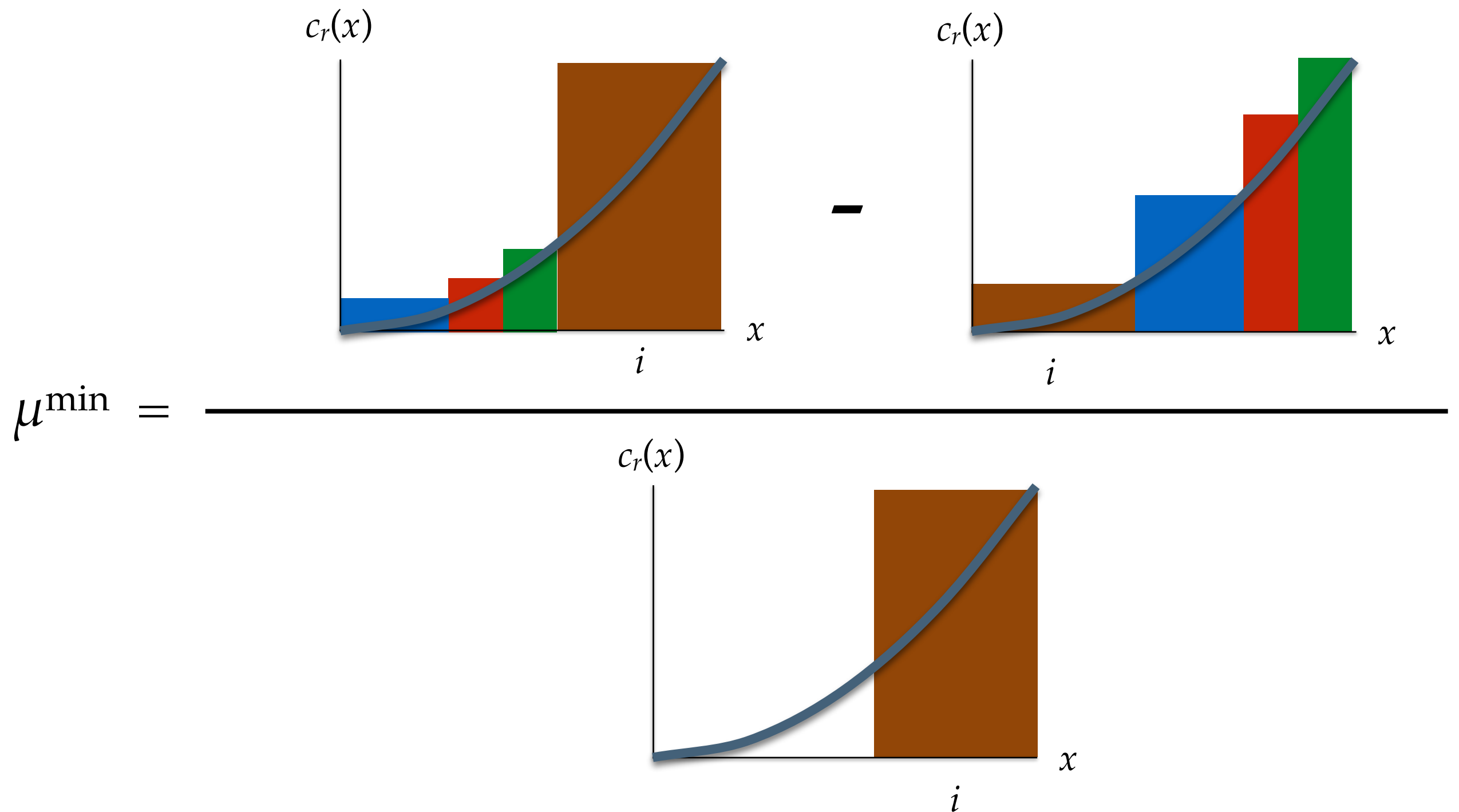
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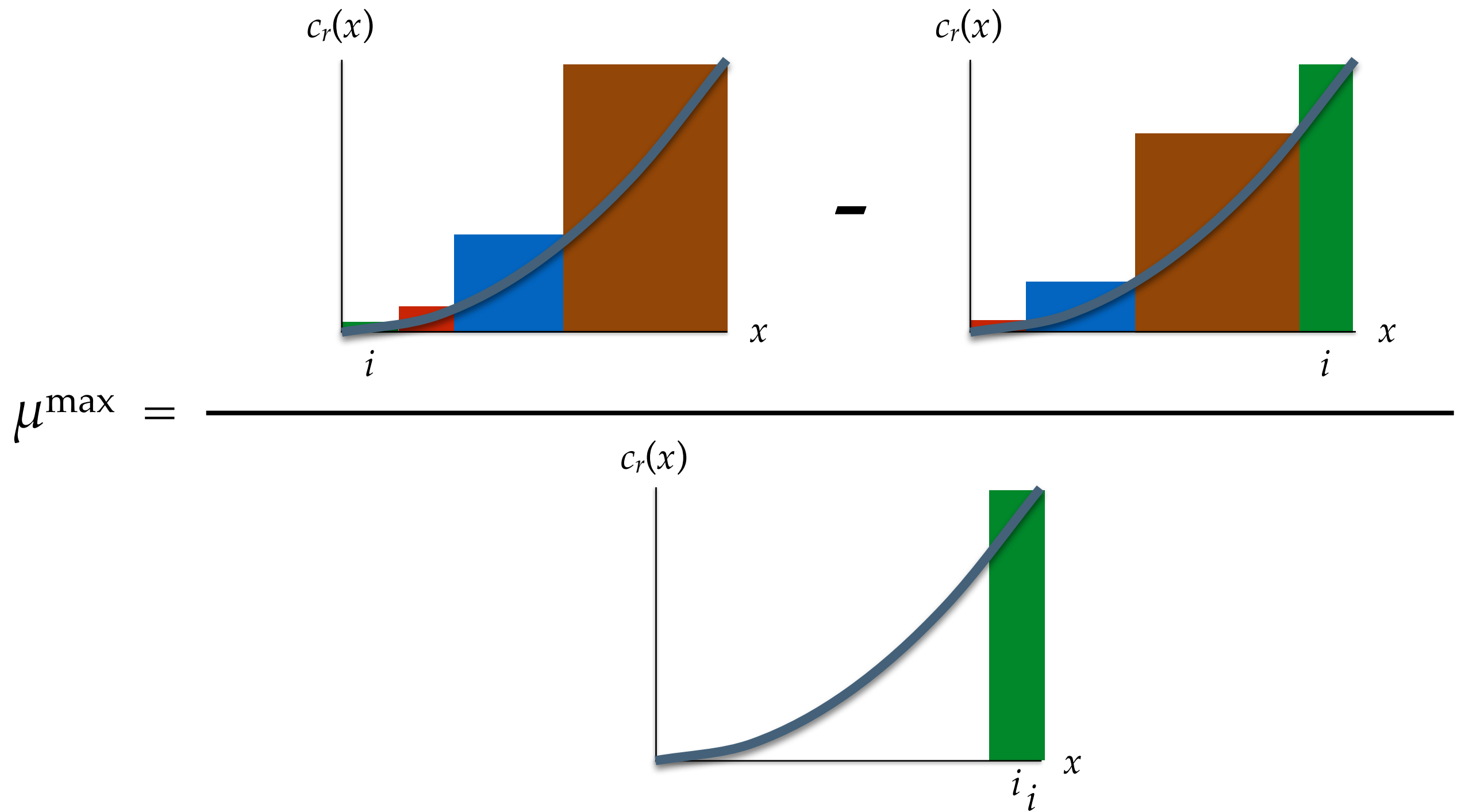
# Bounding the approximation factor



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# Main result

[Hansknecht K. Skopalik, '14]

Theorem Weighted congestion game have an  $\alpha$ -approximate pure Nash equilibrium, where  $\alpha \leq \min \{1 + \mu^{\max}, 1/(1 - \mu^{\min})\}$ .

# Main result

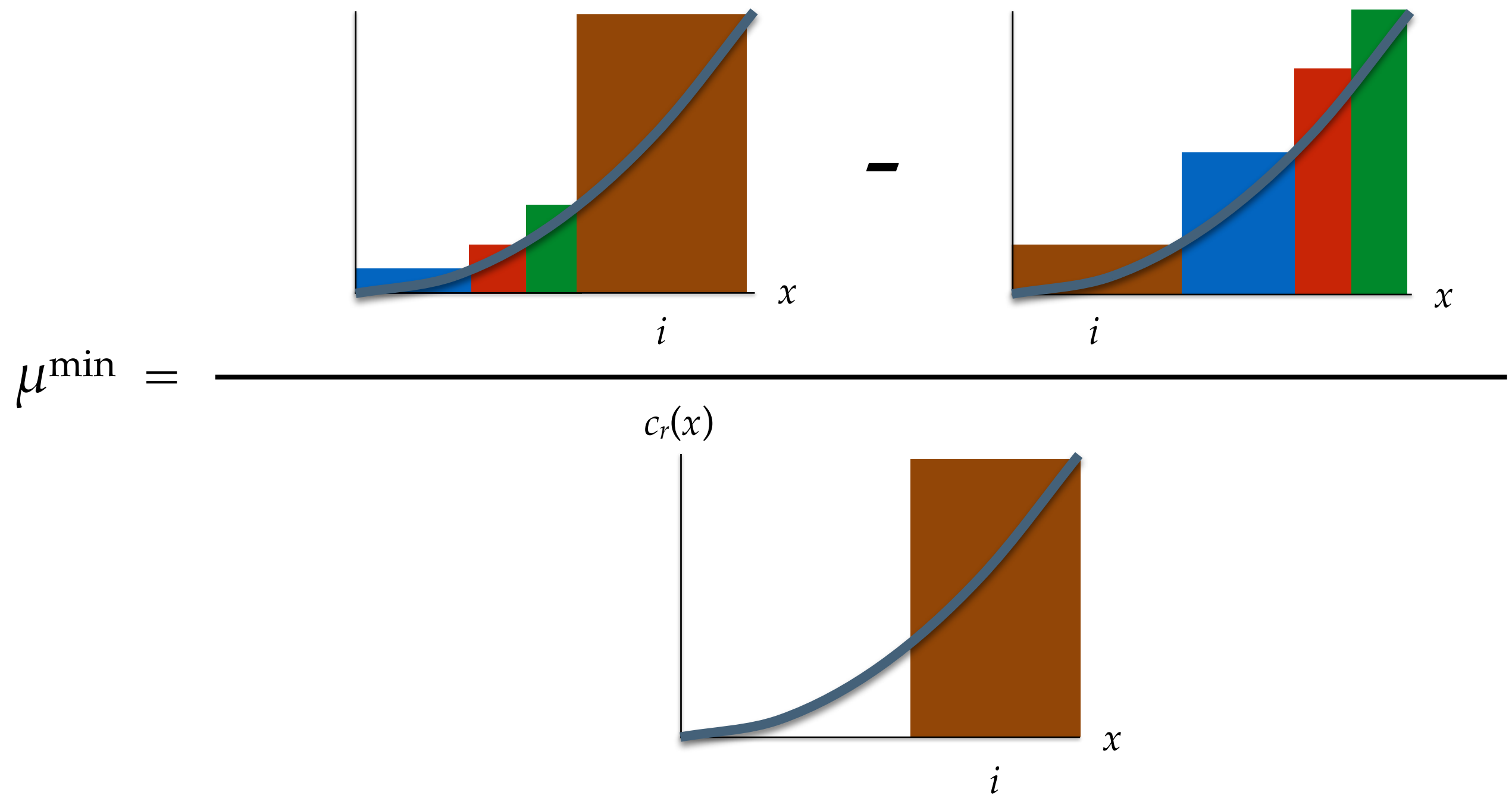
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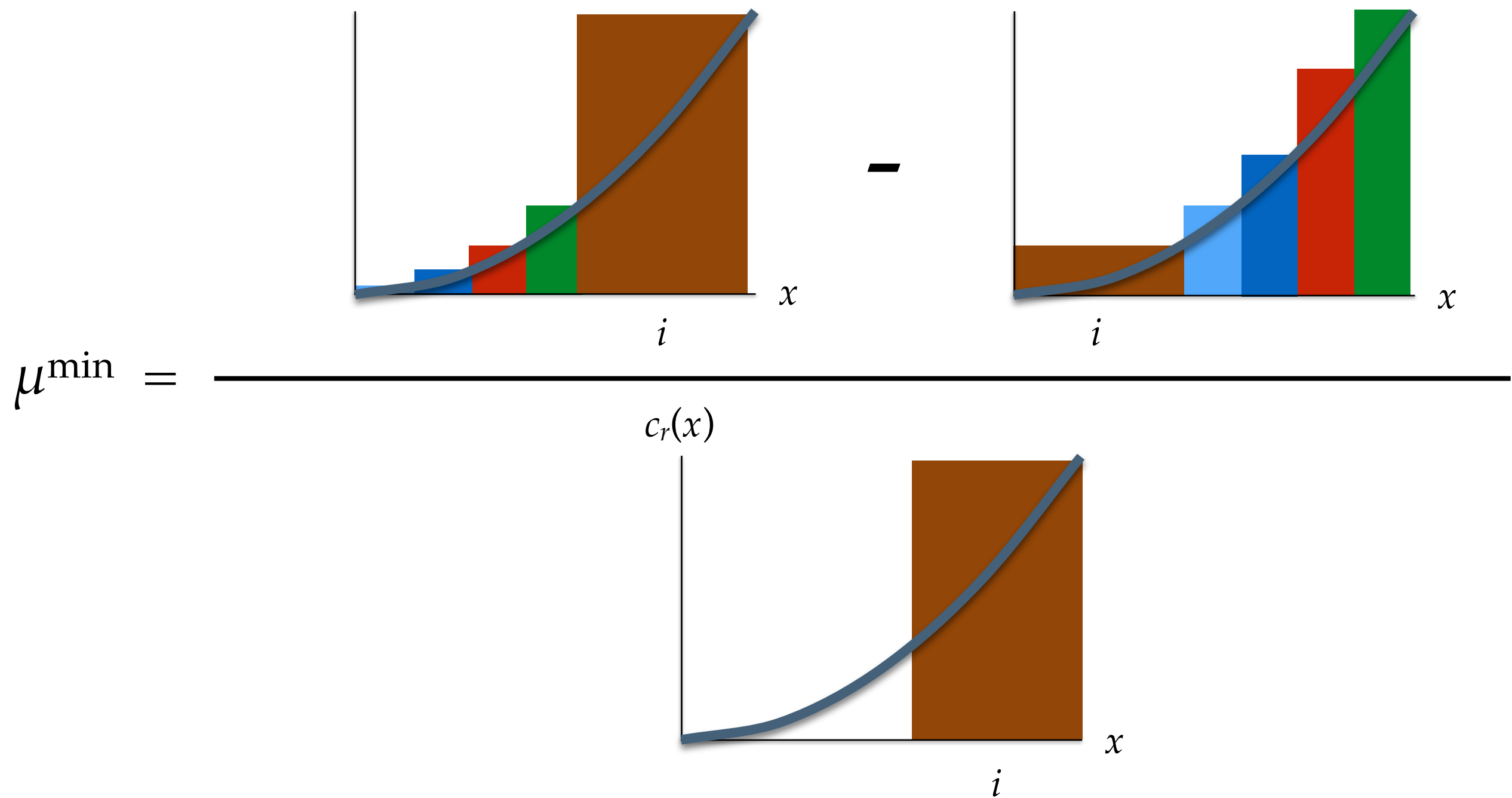
Proof:

- ▶ Show that either the maximizing order is an  $\alpha$ -approximate potential.

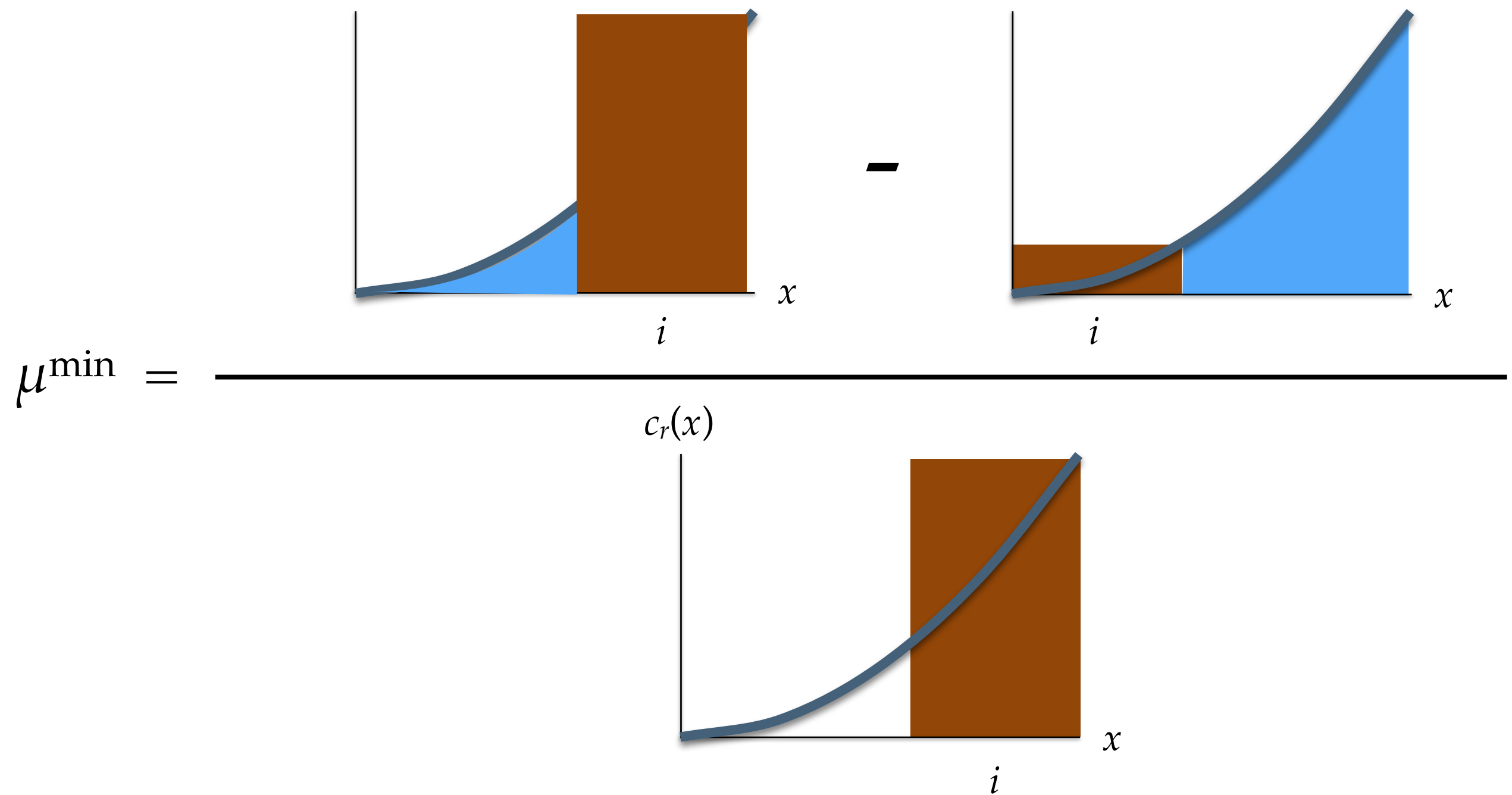
# Bounding $\mu^{\min}$



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# Bounding $\mu^{\min}$





# Our results

Functions	Approximation factors	
	2 players	all games
quadratic	1.054...	$4/3$
cubic	1.074...	1.785...
polynomials of max. degree $\Delta$		$\Delta+1$
concave		$3/2$

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