

Congestion Games and Selfish Routing

Maria Serna

Fall 2016

- 1 Congestion games and variants
- 2 Selfish Routing
- 3 Price of Anarchy/Stability

Congestion games

Congestion games

A **congestion game** $(E, N, (d_e)_{e \in E}, (c_i)_{i \in N})$

- is defined on a finite set E of resources and
- has n players
- using a delay function d_e mapping \mathbb{N} to the integers, for each resource e .
- The actions for each player are subsets of E .
- The cost functions are the following:

$$c_i(a_1, \dots, a_n) = \sum_{e \in a_i} d_e(f_e(a_1, \dots, a_n))$$

being $f_e(a_1, \dots, a_n) = |\{i \mid e \in a_i\}|$.

Weighted congestion games

Weighted congestion games

A **weighted congestion game** $(E, N, (d_e)_{e \in E}, (c_i)_{i \in N}, (w_i)_{i \in N})$

- is defined on a finite set E of resources and
- has n players. Player i has an associated **natural weight** w_i .
- Using a delay function d_e mapping \mathbb{N} to the integers, for each resource e .
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Network weighted congestion games

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A **network weighted congestion game** is defined on a directed graph $G = (V, E)$, $(N, G, (d_e)_{e \in E}, (c_i)_{i \in N}, (w_i)_{i \in N}, (s_i)_{i \in N}, (t_i)_{i \in N})$.

- The resources are the arcs in G .
- The game has n players. Player i has an associated natural weight w_i .
- Using a delay function d_e mapping \mathbb{N} to the integers, for each arc $e \in E$.
- The action set for player i is the set of (s_i, t_i) -paths in G .
- The cost functions are the following:

$$c_i(a_1, \dots, a_n) = \sum_{e \in a_i} d_e(f_e(a_1, \dots, a_n))$$

being $f_e(a_1, \dots, a_n) = \sum_{\{i | e \in a_i\}} w_i$.

Congestion games terminology

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In **nonatomic** congestion games the number of players is infinite and each player controls an infinitesimal weight of the total traffic.

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In **nonatomic** congestion games the number of players is infinite and each player controls an infinitesimal weight of the total traffic. Named also **Selfish routing games**.

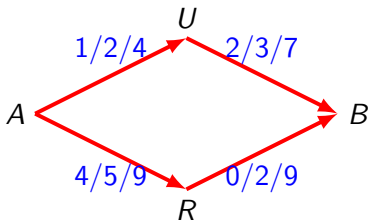
An example of a network congestion game

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- There are three players.
- and a network (with a delay function on arcs)

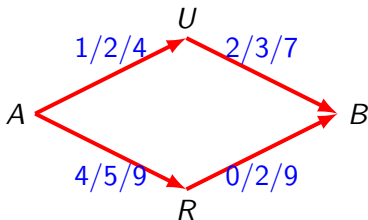
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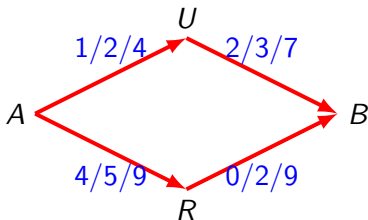
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- Player's objective: going from $s = A$ to $t = B$ as fast as possible.

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- Player's objective: going from $s = A$ to $t = B$ as fast as possible.
- Strategy profiles: paths from A to B .
- A NE?

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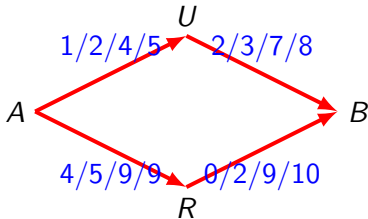
- There are three players with weights 1,1,2

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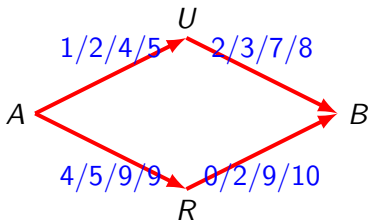
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An example of a weighted network congestion game

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- and a network (with a delay function on arcs)



- Player's objective: send w_i units from $s = A$ to $t = B$ as fast as possible.
- Strategy profiles: paths from A to B .
- A NE?

Another family: Fair Cost Sharing Games

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A **fair cost sharing game** $(E, N, (c_e)_{e \in E})$

- is defined on a finite set E of resources and
- has n players
- a **fixed cost** c_e , for each resource e .
- The actions for each player are subsets of E .
- The cost functions are the following:

$$c_i(a_1, \dots, a_n) = \sum_{e \in a_i} \frac{c_e}{f_e(a_1, \dots, a_n)}$$

being $f_e(a_1, \dots, a_n) = |\{i \mid e \in a_i\}|$.

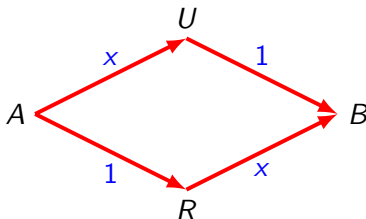
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Selfish Routing: an Example

- Total traffic is $r = 1$.
- Network (with delay functions on arcs)

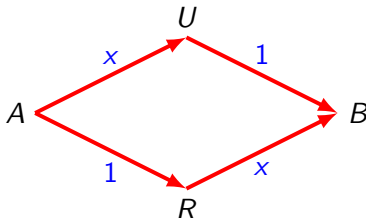
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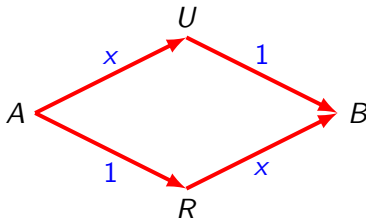
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Selfish Routing: an Example

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- Player's objective going from $s = A$ to $s = B$ with minimum delay.
- Strategy profiles: flows from A to B with total flow $r = 1$

Selfish routing: strategy profiles

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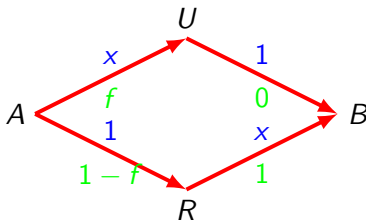
- Traffic as Flows:

Selfish routing: strategy profiles

- Traffic as Flows:
 - A flow vector f giving the routing of traffic.
 - f_P = amount of traffic routed on $(s_i - t_i)$ path P .

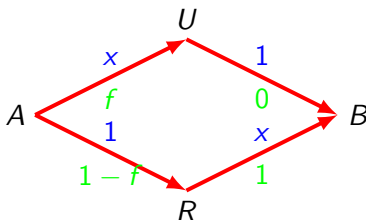
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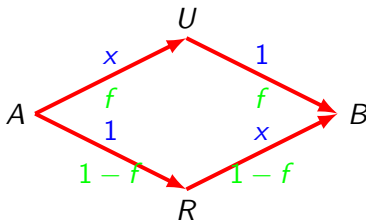
- Notation: for a path P and a feasible flow f , $C^P(f)$ denotes the cost corresponding to the traffic routed through P by f .

Selfish routing: equilibria

- A flow is a Nash equilibrium (or is a Nash flow) if all flow is routed on min-latency paths (given current edge congestion)

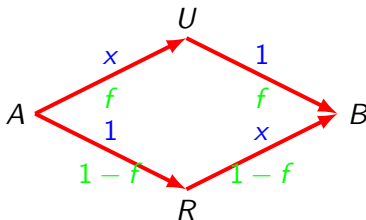
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- This flow is not a Nash flow unless $f = 1/2$.

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Theorem

A feasible flow x is an equilibrium flow iff for any feasible flow y

$$\sum_{e \in E} d_e(x[e])x[e] \leq \sum_{e \in E} d_e(y[e])x[e].$$

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- Called **Variational Inequality** (Smith 79 and Dafermos 80)
- As a consequence all Nash flows have the same cost per edge.
- Do PNE exist?

Selfish routing: equilibria existence

- As for the atomic case we can consider a potential, for a given flow x

$$\Psi(x) = \sum_{e \in E} \int_0^{x[e]} d_e(u) du$$

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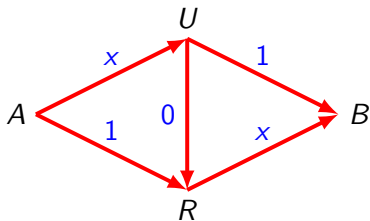
$$\Psi(x) = \sum_{e \in E} \int_0^{x[e]} d_e(u) du$$

Theorem

A feasible flow x is an equilibrium flow iff x is a minimum of Ψ over the set of feasible flows.

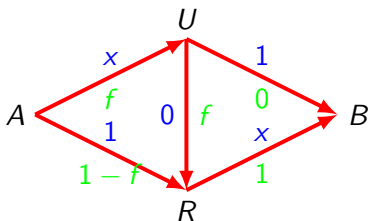
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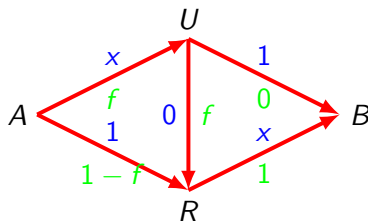
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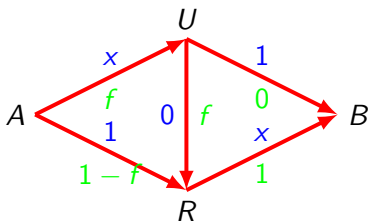
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- Is this a NE?

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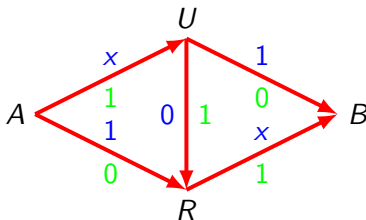
- Is this a NE? No unless $f = 1$

Selfish routing: equilibria

- A Nash flow

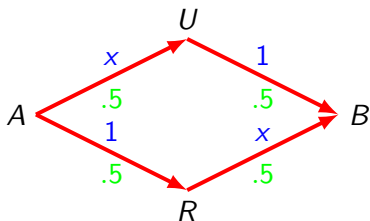
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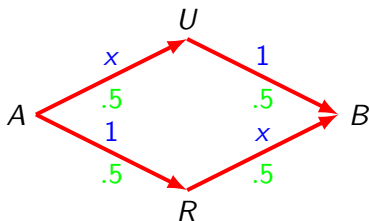


Braess' paradox: Nash flows

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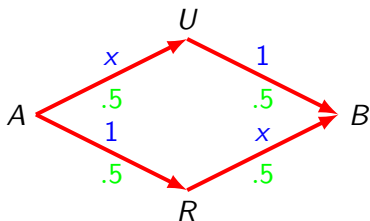
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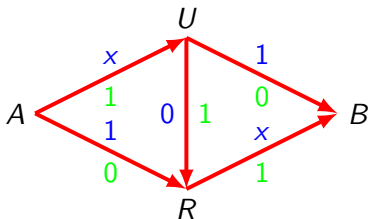
Delay is 1.5. We add a fast

connection

Braess' paradox: Nash flows

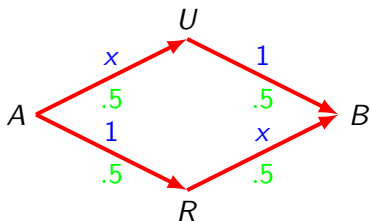


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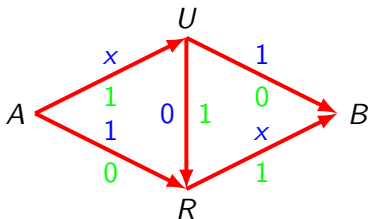


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and delay is 2!

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