

CS243: Introduction to Algorithmic Game Theory

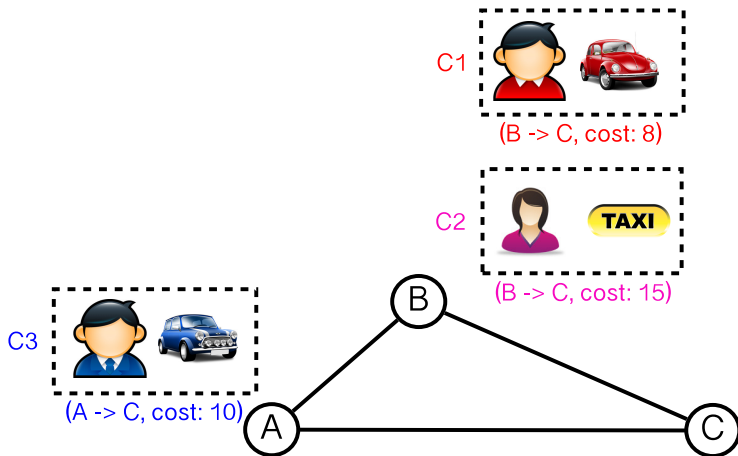
Week 10.1 Game Theory in Carsharing (Dengji ZHAO)

SIST, ShanghaiTech University, China

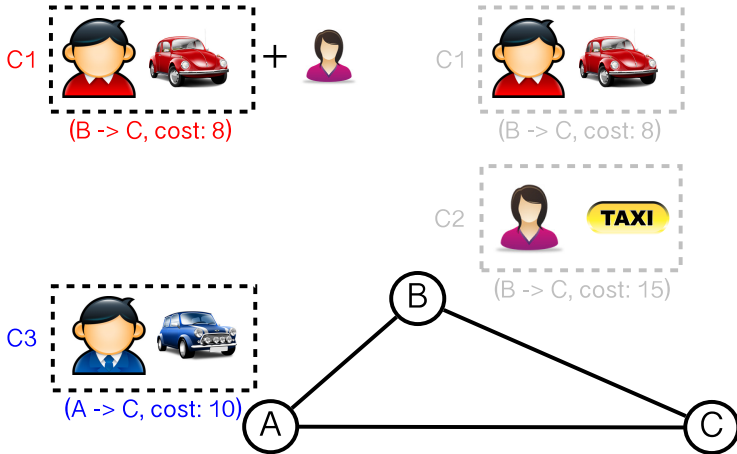
Survey

- Do you think we need a dedicated programming course during your first two-year study, especially before Data Structure course?
 - 1 If Yes, which language would you prefer: C/C++, Java or Python...? Why?
 - 2 If no, why?

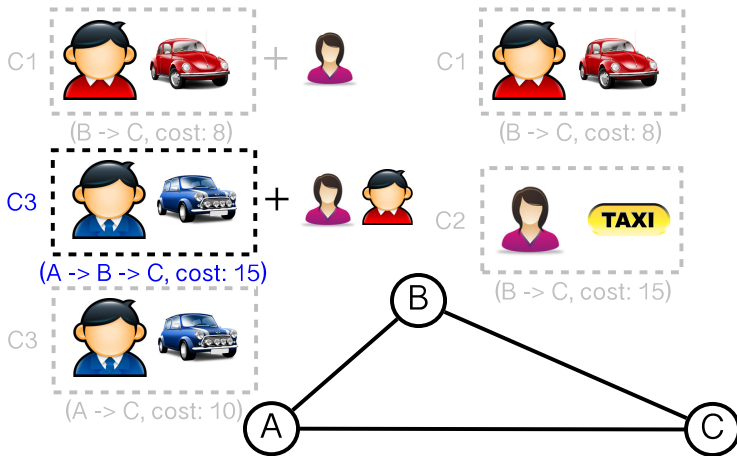
Ridesharing Example



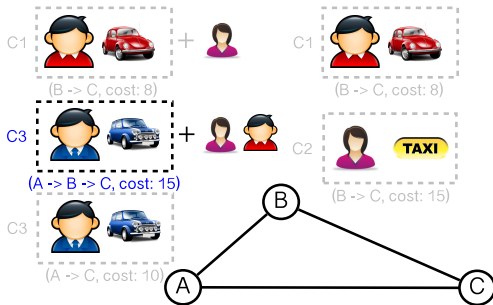
Ridesharing Example



Ridesharing Example



Ridesharing Example



Questions:

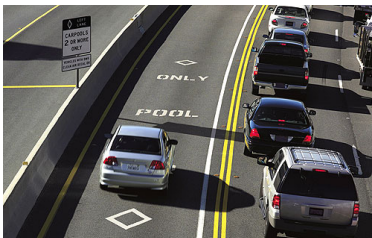
- How to arrange the sharing?
- How much should they pay/receive?

History

- **Began** in the 1940s in North America
- Been **promoted** because of
 - fuel shortages, air pollution and traffic congestion
- **Peaked** in the US in 1970 with a commute mode share of 20.4%



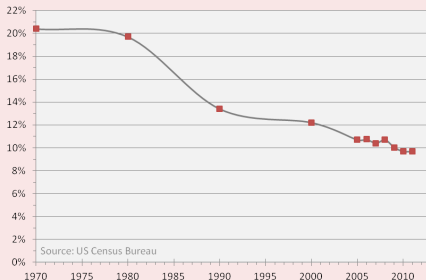
Public and Private Promotions



People are still NOT well motivated!

not going well...

Workers Commuting by Carpool in USA



- Australia (Queensland) will end ridesharing lanes
- The average car carries just 1.6 people

What are the obstacles?

- Safety and Privacy
- Flexibility and Reliability
- ...
- Complicated join procedures
- No free market competition!

What can we do?

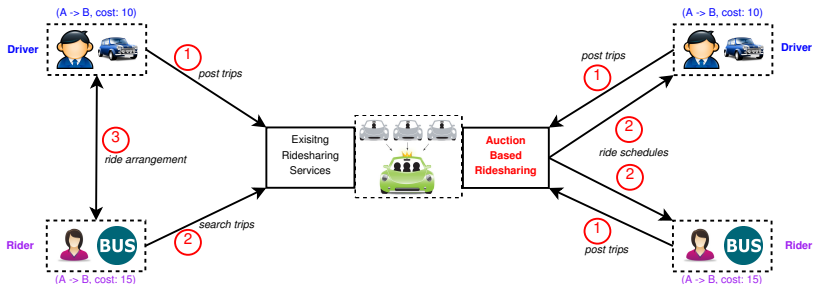
Use Mechanism Design to build ridesharing:

- Automated ride matching/scheduling
- Automated (profitable) price setting

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What can we do?

Use Mechanism Design to build ridesharing:

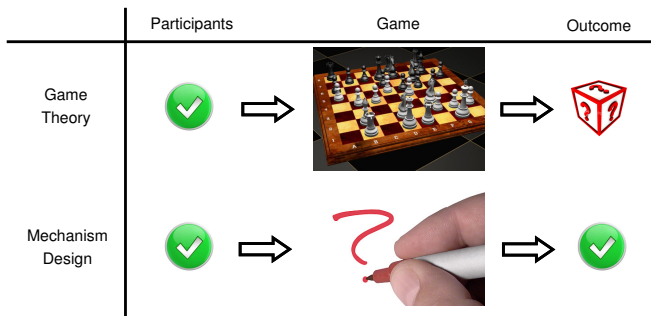
- Automated ride matching/scheduling
- Automated (profitable) price setting

to answer...

Questions:

- How to arrange the sharing?
- How much should commuters pay/receive?

Mechanism Design (Reverse Game Theory)



Mechanism design answers...

How to **design** a mechanism which leads to a **desired outcome**?

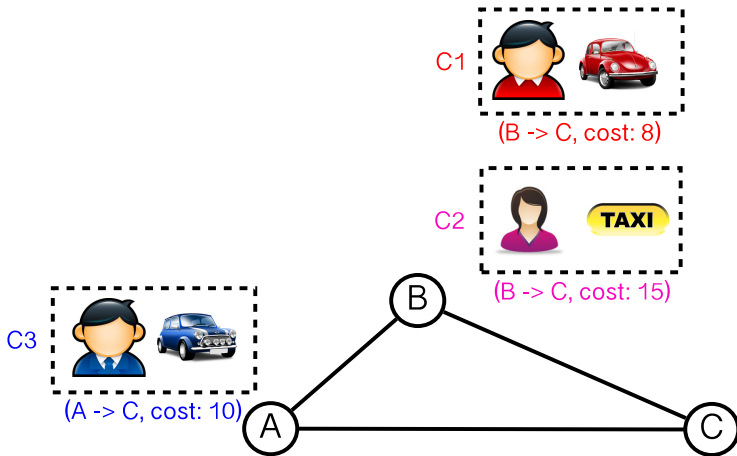
Outline

- 1 The Model
- 2 Fixed-price Mechanisms
- 3 VCG with Reserve Prices
- 4 Balanced Trade Reduction

Outline

- 1 The Model
 - Auction-based Ridesharing
- 2 Fixed-price Mechanisms
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System Overview



System Overview

Input:

- Route map: a graph $G = (L, E)$,
 - L : stopping points/locations,
 - E : routes between stopping points,
 - $w(e)$: time required to travel via route $e \in E$.
- Commuter i 's **private** trip/type: $\theta_i = (l_i^d, l_i^a, t_i^d, t_i^a, c_i, q_i)$
 - $l_i^d, l_i^a \in L$: departure and arrival **locations**,
 - t_i^d, t_i^a : earliest departure and latest arrival **time**,
 - $c_i \in \mathbb{R}^+$: travel **cost** to finish the trip,
 - $q_i \in \mathbb{N}$: extra **seats available** on the trip.

System Overview

Output:

- Allocation/Scheduling:
 - **driver**: drives and takes riders
 - **rider**: shares with drivers
 - **unmatched**: goes with the original travel preference
- Payments:
 - driver: receives money
 - rider: pays money
 - unmatched: no payment

The Goal of the System

Properties of the output:

- Minimize the total travel costs (**efficiency**)
- Incentivize participation and against manipulations
 - commuters never receive negative utility (**individual rationality**)
 - truthfully reporting their trip information is a dominant strategy (**truthfulness**)
- Deficit control (**budget balance**)
 - The system owner should not lose too much money

One Solution: Applying VCG Mechanism

One classical solution: **VCG**

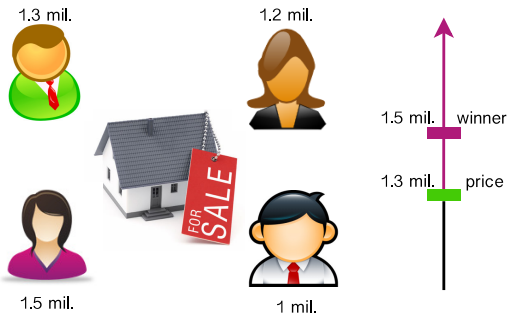
One Solution: Applying VCG Mechanism

Vickrey Auction (*Second Price Auction*)



One Solution: Applying VCG Mechanism

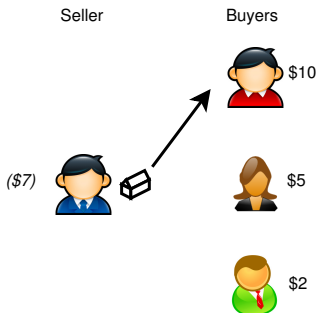
Vickrey Auction (*Second Price Auction*)



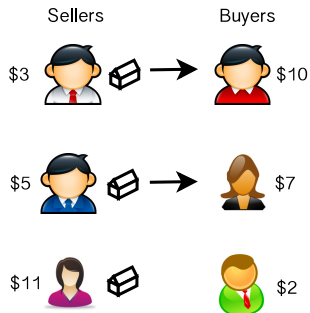
- *Allocation*: the agent with the highest valuation wins
- *Payment*: the **harm** of others caused by the agent
- Properties: **Efficient, Individually Rational, and Truthful.**

One Solution: Applying VCG Mechanism

One-sided Auction

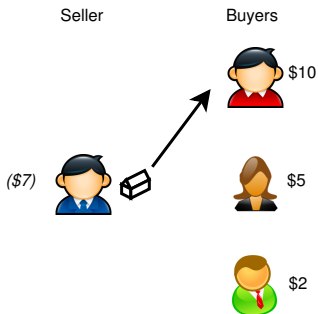


Double Auction

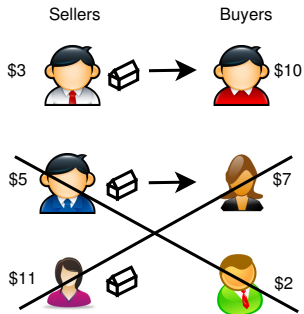


One Solution: Applying VCG Mechanism

One-sided Auction



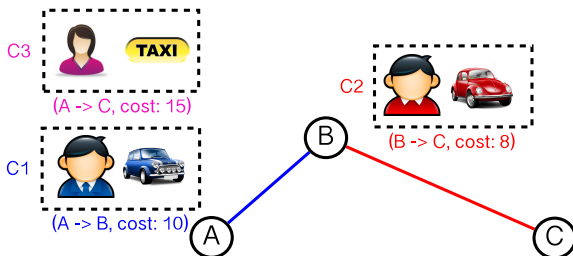
Double Auction



One Solution: Applying VCG Mechanism

Vickrey-Clarke-Groves (VCG) auction

- **Efficient** (costs minimizing)
- **Individually rational** (agents never lose money)
- **Truthful** (truthfully reporting is the best)
- High deficit (Quiz: how much does each driver receive in the following example?)



One Solution: Applying VCG Mechanism

Vickrey-Clarke-Groves (VCG) auction

- **Efficient** (costs minimizing)
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- High deficit (Quiz: how much does each driver receive in the following example?)

Question

How to control deficit?

Our Solutions (Overview)

We propose...

Fixed-price Mechanisms :

- Flexible deficit control (outperforms VCG)
- Truthful and individually rational
- Very inefficient

VCG with Reserve Prices :

- Flexible deficit control (outperforms VCG)
- Partially truthful and individually rational
- Flexible efficiency control

Balanced Trade Reduction :

- Flexible deficit control (outperforms VCG)
- Truthful and individually rational
- Flexible efficiency control

Outline

- 1 The Model
- 2 Fixed-price Mechanisms
 - $x^{fixed}(p^0, p^1)$
- 3 VCG with Reserve Prices
- 4 Balanced Trade Reduction

$x^{fixed}(p^0, p^1)$

Fixed Payments $x^{fixed}(p^0, p^1)$

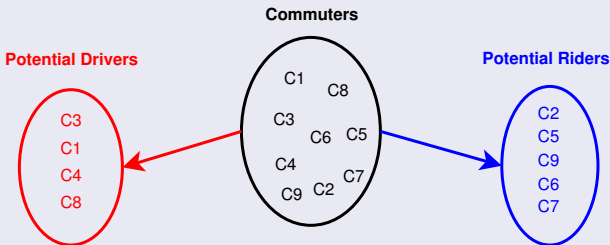
Given predefined values $p^0 \geq 0$ (for riders) and $p^1 \leq 0$ (for drivers), fixed payments are defined

- Allocation independent
- Allocation dependent
 - location dependent (e.g. shortest path)
 - detour dependent
 - sharing dependent
 - ...

$$x^{fixed}(p^0, p^1)$$

Dictatorship Mechanism

Serial Dictatorship Mechanism with fixed payments

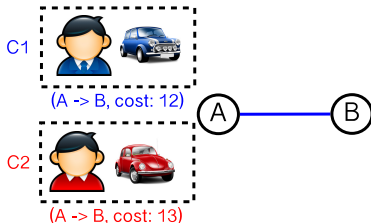


Properties

- truthful and individually rational
- better deficit control than VCG
- very inefficient

$$x^{fixed}(p^0, p^1)$$

Problems of Non-dictatorship Mechanisms



Case I:

- $\text{fixedPay} = 10$
- both prefer driving
- potential problem for deterministic mechanisms

Case II:

- $\text{fixedPay} = 1$
- both prefer riding
- potential problem for all mechanisms

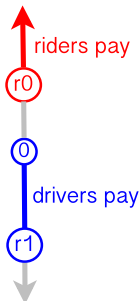
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- 1 The Model
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 - $\mathcal{M}^{VCG}(r^0, r^1)$
- 4 Balanced Trade Reduction

$\mathcal{M}^{VCG}(r^0, r^1)$

VCG with Two-Sided Reserve Prices $\mathcal{M}^{VCG}(r^0, r^1)$

Predefined reserve prices $r^0 \geq 0$ (for riders) and $r^1 \leq 0$ (for drivers),

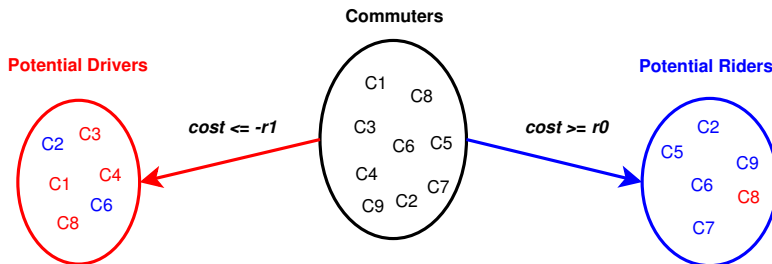


Note: r_0 and r_1 can be allocation dependent.

$\mathcal{M}^{VCG}(r^0, r^1)$

VCG with Two-Sided Reserve Prices $\mathcal{M}^{VCG}(r^0, r^1)$

Predefined reserve prices $r^0 \geq 0$ (for riders) and $r^1 \leq 0$ (for drivers),



Properties: $\mathcal{M}^{VCG}(r^0, r^1)$ is **truthful** iff $r^0 \geq -r^1$.

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- 4 **Balanced Trade Reduction**
 - McAfee's Trade Reduction
 - **Balanced Trade Reduction**

McAfee's Trade Reduction (1992)

- McAfee's reduction: increase VCG payments via reducing efficiency



VCG payments:

- Riders: 90
- Drivers: -91

Deficit: 4

McAfee's payments:

- Riders: 91
- Drivers: -90

No deficit!

McAfee's Reduction is NOT Truthful in Ridesharing

McAfee's trade reduction is **NOT truthful** in ridesharing because:

- a commuter who can be allocated as either driver or rider might manipulate/switch!

Balanced Trade Reduction (BTR)

VCG payment for a buyer

$$v_i^b - x_i^{vcg} \geq v_i^s - \hat{x}_i^{vcg}$$

McAfee's payment for a buyer

$$v_i^b - (x_i^{vcg} + \delta_1) \not\geq v_i^s - (\hat{x}_i^{vcg} + \delta_2)$$

Balanced Trade Reduction payment for a buyer

$$v_i^b - (x_i^{vcg} + \delta) \geq v_i^s - (\hat{x}_i^{vcg} + \delta)$$

Balanced Trade Reduction (BTR)

VCG payment for a buyer

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Balanced Trade Reduction payment for a buyer

$$v_i^b - (x_i^{vcg} + \delta) \geq v_i^s - (\hat{x}_i^{vcg} + \delta)$$

Properties of BTR:

- Truthful, Individually Rational, almost Efficient, but has Deficit.

What is NEW?

- The **first comprehensive ridesharing model** studied from a pure game-theoretic point of view.
- **Auction-based** ridesharing system incentivizing participation.
- Flexible **deficit control** rather than completely remove deficit (investment opportunity).

Future Work

- The problem of finding optimal schedules is computationally hard (optimal in range).
- Allow agents to submit trips dynamically over time (online mechanism design).
- Collaboration with existing public/private transports (Uber are banned in many countries!).
- Trips with uncertain commitment.

References

- Dengji Zhao, Sarvapali Ramchurn, Enrico Gerding, Nick Jennings: **Balanced Trade Reduction for Dual-Role Exchange Markets**. In the Proceedings of the Twenty-Ninth AAAI Conference on Artificial Intelligence (AAAI-15)
- Dengji Zhao, Dongmo Zhang, Enrico Gerding, Yuko Sakurai, Makoto Yokoo: **Incentives in Ridesharing with Deficit Control**. In the Proceedings of the 13th International Conference on Autonomous Agents and Multiagent Systems (AAMAS-14)
- N. Nisan, T. Roughgarden, Eva Tardos, and V. V. Vazirani: **Algorithmic Game Theory**. Cambridge University Press, 2007.