



# Selecting Compliant Users for Opt-in Microtolling

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## Micro-tolling

In the U.S., traffic congestion costs were estimated at **\$305 billion** during 2018 [Citylab 2018].



**Q:** Can **selfish drivers** be incentivized to **act socially**?

**A:** Yes! By imposing tolls [1].

**Q:** Does the **system optimum** require that **all drivers** respond to tolls?

**A:** No! Influencing a specific subset of the drivers (~50%) is usually sufficient [2].

**Our Question:**

What if **the subset** of influenced drivers is **limited in size**?

## Motivation

Tolling is unpopular! [3]

**Our solution:** Optional participation in a tolling scheme.

## Opt-in Microtolling

Some drivers are charged tolls and others are not.

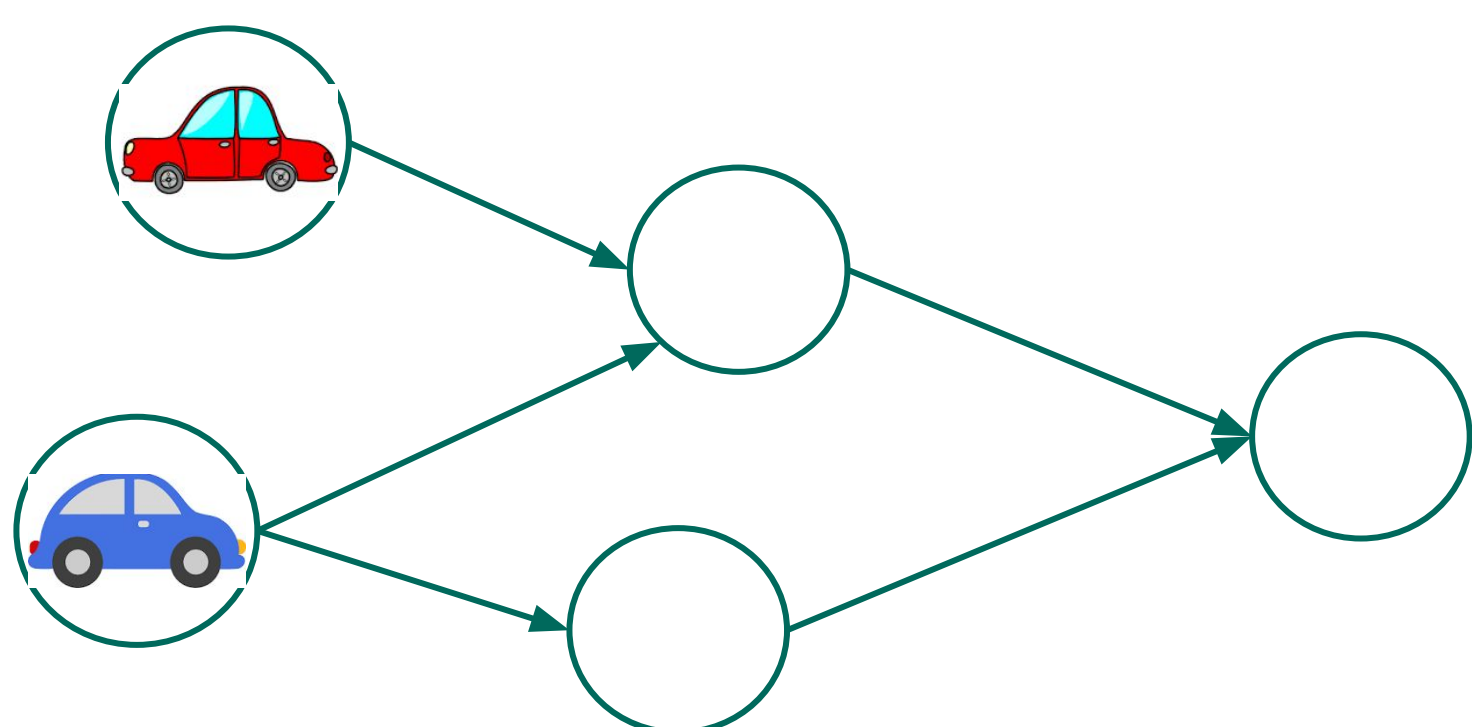
- Charged tolls = compliant agents
- Not charged tolls = non-compliant agents

All drivers can take any link in the road network.

Rational agents would need to be incentivized up front to join system:

- **Not the focus of this paper.**

## It matters who is compliant!



- Red car has a single path to destination.
- Blue car has two paths to choose from.
- If the red car is compliant it has no effect.

What **limited subset of agents** should we incentivize to comply to achieve the largest improvement in social welfare?

## Determining the Compliant Subset

1. Estimate the benefit of making a particular agent compliant instead of non-compliant.
2. Greedily select the agent's with the highest predicted benefit if compliant.

## Determining "benefit of compliance"

The benefit of agent **a** being compliant:

$$h^*(a) = m_l - m_g + (l_l - l_g) v_a$$

Where:

- $m_l$  is the marginal impact of **a** if non-compliant.
- $m_g$  is the marginal impact of **a** if compliant.
- $l_l$  is the latency suffered by **a** if non-compliant.
- $l_g$  is the latency suffered by **a** if compliant.
- $v_a$  is agent **a**'s value of time.

## Marginal impact is unknown in practice.

We approximate  $h^*$  with the **difference in marginal cost path** heuristic:

$$DMCP(a) = \tau_l - \tau_g + (l_l - l_g) v_a$$

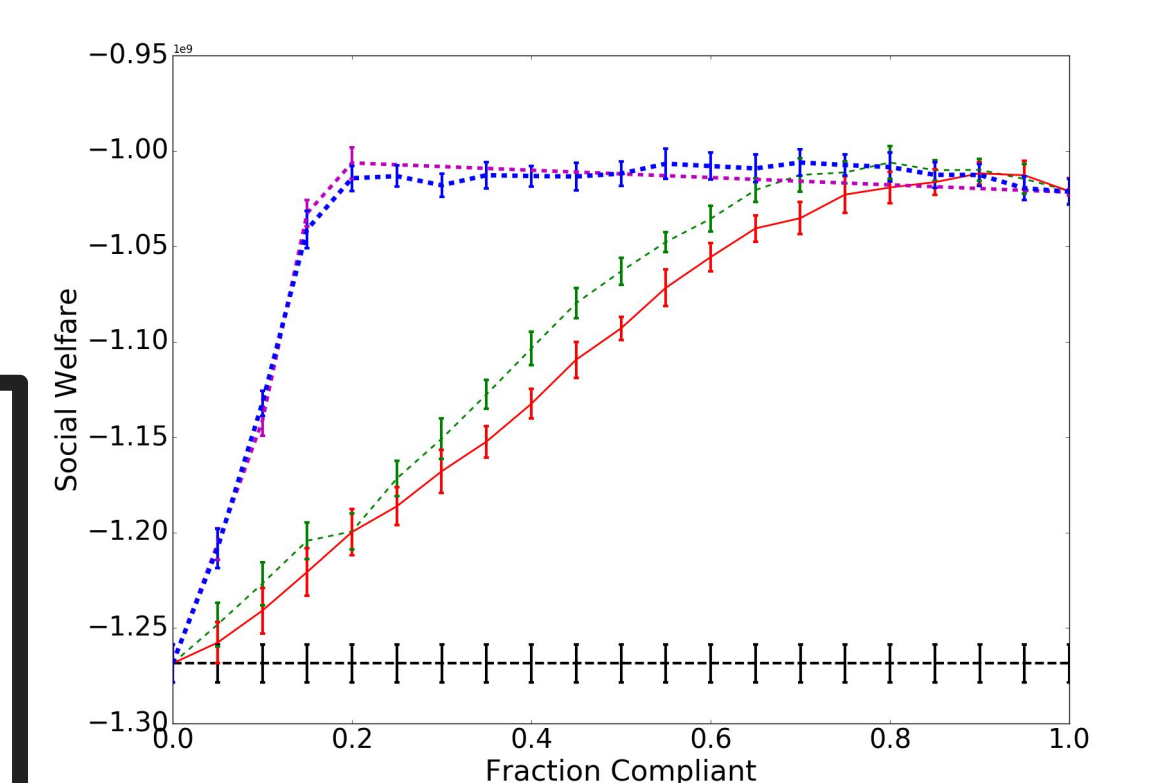
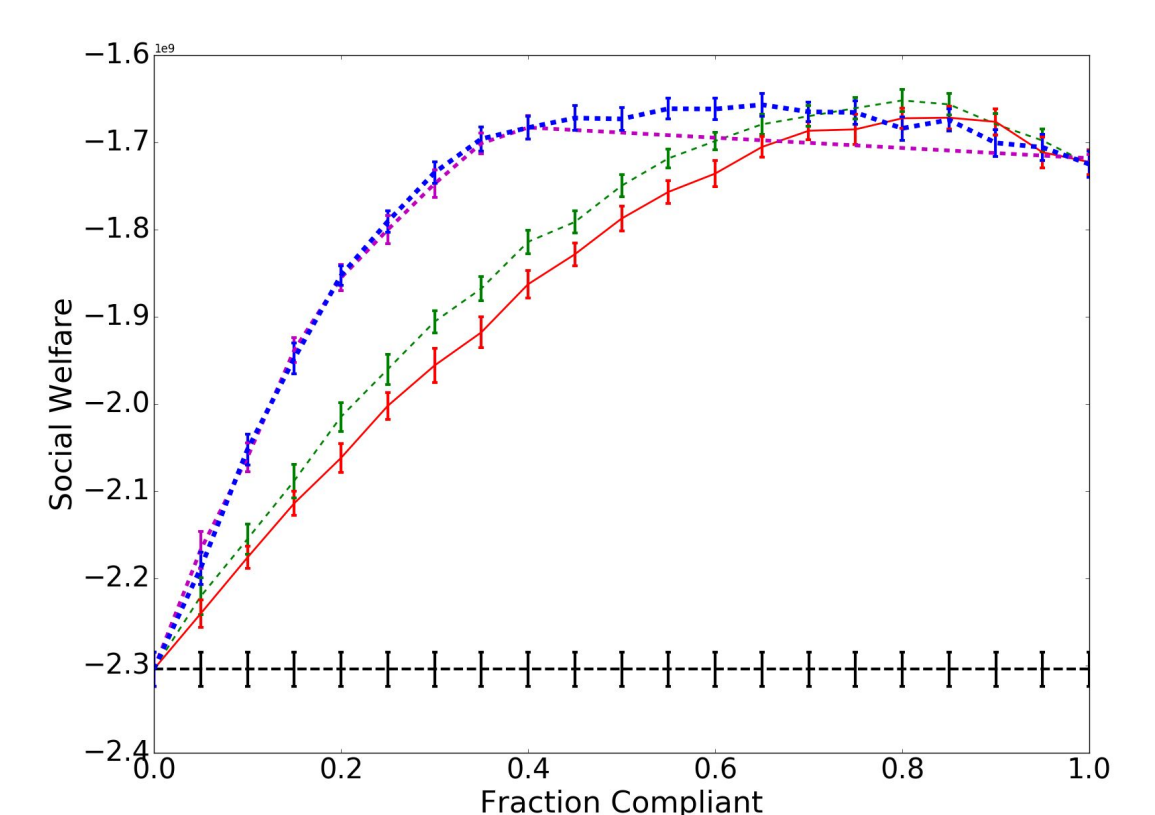
Where:

- $\tau_l$  is the approximated marginal cost toll paid by **a** if non-compliant.
- $\tau_g$  is the approximated marginal cost toll paid by **a** if compliant.

## Experimental Results:

1. Use  $\Delta$ -Tolling to approximate marginal-cost toll [4] for DMCP.
2. Evaluate on three traffic scenarios (two shown).
3. Compare to other agent selection mechanisms.
  - a. TE: Use negative of agent's value of time to approximate  $h^*$ .
  - b. RANDOM: Random assignment.

DMCP and DMCP+TE achieve near optimal performance with **less than 50%** of agents compliant!



— No Tolls    — RANDOM    — TE    — DMCP+TE    — DMCP

- [1] *The Economics of Welfare*. A. Pigou. Macmillan and Co. 1920.
- [2] *Traffic Optimization For a Mixture of Self-interested and Compliant Agents*. Sharon et al. 2018.
- [3] *New York City's congestion pricing experience and implications for road pricing acceptance in the United States*. B. Schaller. 2010.
- [4] *Network-wide Adaptive Tolling for Connected and Automated vehicles*. Sharon et al. 2017.