

# Queueing Paradoxes

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## What is a paradox?

A statement or proposition that **seems** self-contradictory or absurd but in reality expresses a possible truth.

In economics, the Jevons paradox occurs when technological progress increases the efficiency with which a resource is used (reducing the amount necessary for any one use), but the rate of consumption of that resource rises because of increasing demand.

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**Example:** assume  $\lambda = 0.9$  and  $1/\mu = 1$

$\Rightarrow \rho = 0.9$

$\Rightarrow$  mean time in the system 10

$\Rightarrow$  mean socially added time 100 (for 1 unit of service!)

assume

$$R - \frac{C}{\mu} > 0 \quad \text{and} \quad R - \frac{C}{\mu(1-\rho)} < 0$$

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- the server works more, not less:  $p_e\rho$  goes up with  $\mu$



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  - both options come with the same amount of time



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- **Social optimization:** no roads at all, only buses (or only roads with huge capacity)

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**Equilibrium:**  $p_e \Lambda$  use the bus where  $p_e$  obeys

$$\frac{3}{p_e \Lambda} = \frac{1}{\mu - (1 - p_e) \Lambda}$$

$p_e$  decreases with  $\mu$  but  $3/(p_e \Lambda)$  increases in  $\mu$

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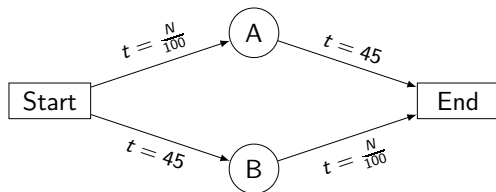
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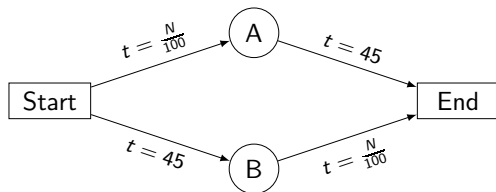
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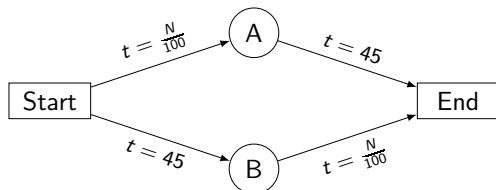
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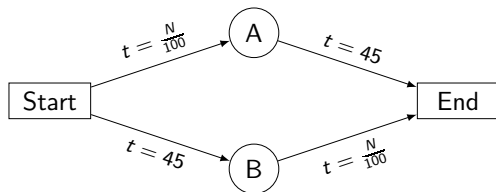
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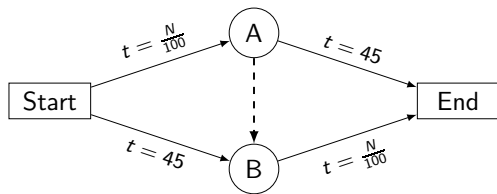
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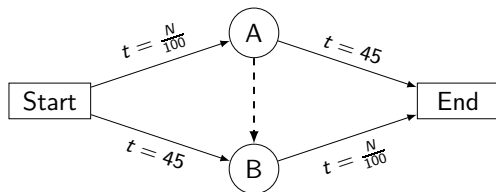
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For others, some win, some lose. The absolute changes coincide, **but** there are more losers than winners. This is more so when additional switches occur

# New network

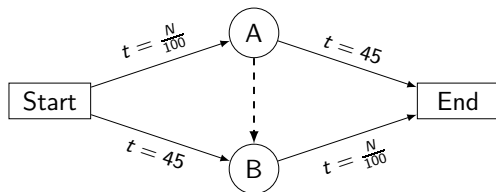


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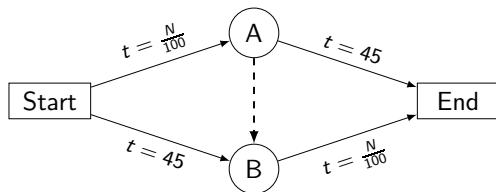
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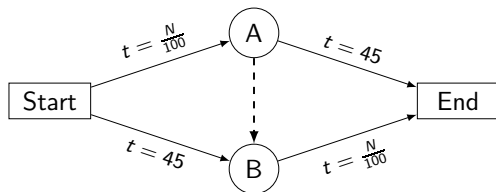
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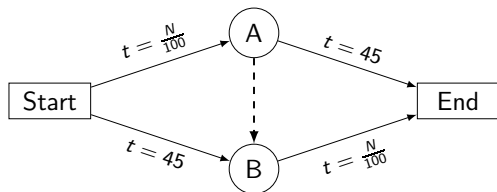
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Social cost in social optimality:

$$500 \times 45 + 3500 \times 67.5 = 258,750 < 260,000 < 320,000$$

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**Price of Anarchy (PoA):**

$$\frac{320,000}{258,750} \approx \frac{5}{4} < \frac{4}{3} \text{ (theoretical bound)}$$

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Anti-paradoxically, the error is not a function of  $n$  and equals (only) a quarter of a service time



**“Proof” 1:**

$$\frac{n + O(\sqrt{n})}{2n} \frac{n + O(\sqrt{n})}{2} + \frac{n - O(\sqrt{n})}{2n} \frac{n - O(\sqrt{n})}{2} = \frac{n}{2} + O(1/\sqrt{n})$$

**Proof 2:** Tag a customer

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**Proof 3:**

$$X \sim \text{Bin}(2n, 1/2)$$

Mean queueing time:

$$E\left(\frac{X}{2n} \frac{X - 1}{2} + \frac{2n - X}{2n} \frac{2n - X - 1}{2}\right) = \frac{n - 1}{2} + \frac{1}{4}$$

THANK YOU

## Some facts

- The equilibrium arrival rate:  $\lambda_e = \mu - \frac{C}{R}$
- The socially optimal arrival rate:  $\lambda_s = \mu - \sqrt{\frac{C\mu}{R}}$
- Either rate is not a function of the (high) potential rate
- 

$$\lambda_s < \lambda_e \Rightarrow \text{long queues}$$

- The consumer surplus is zero in equilibrium.  
It is  $(\sqrt{R\mu} - \sqrt{C})^2$  in social optimization
- No gain in equilibrium from extra service capacity.  
A gain under social optimization