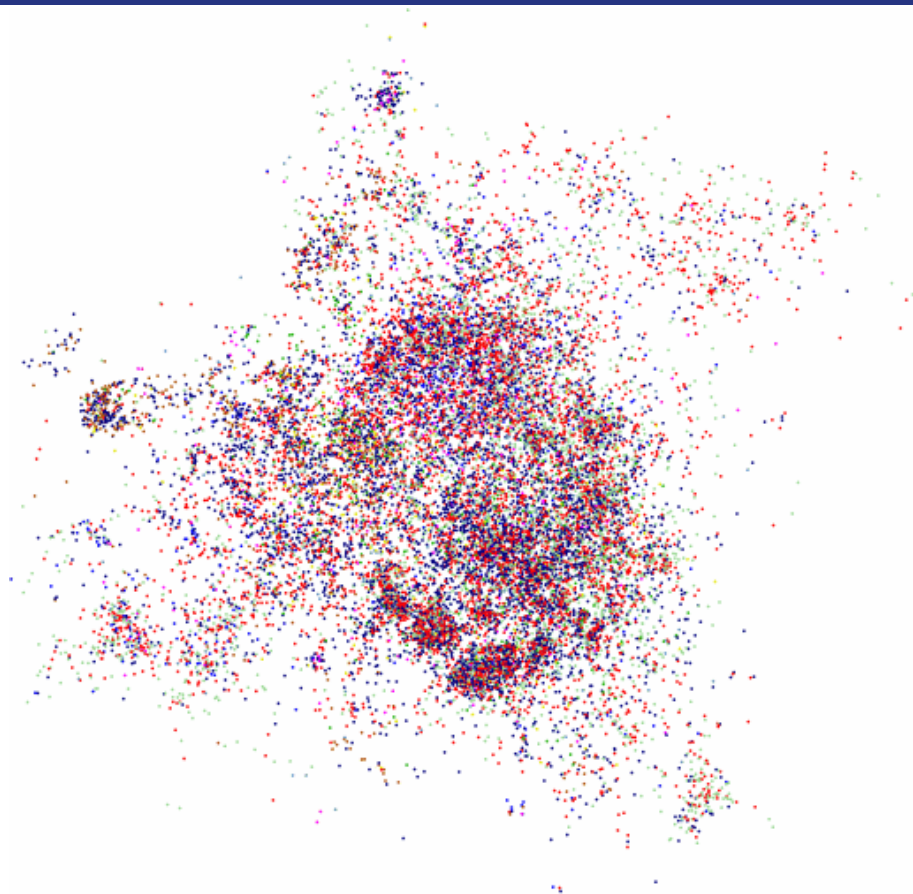


# Network Upgrade Game

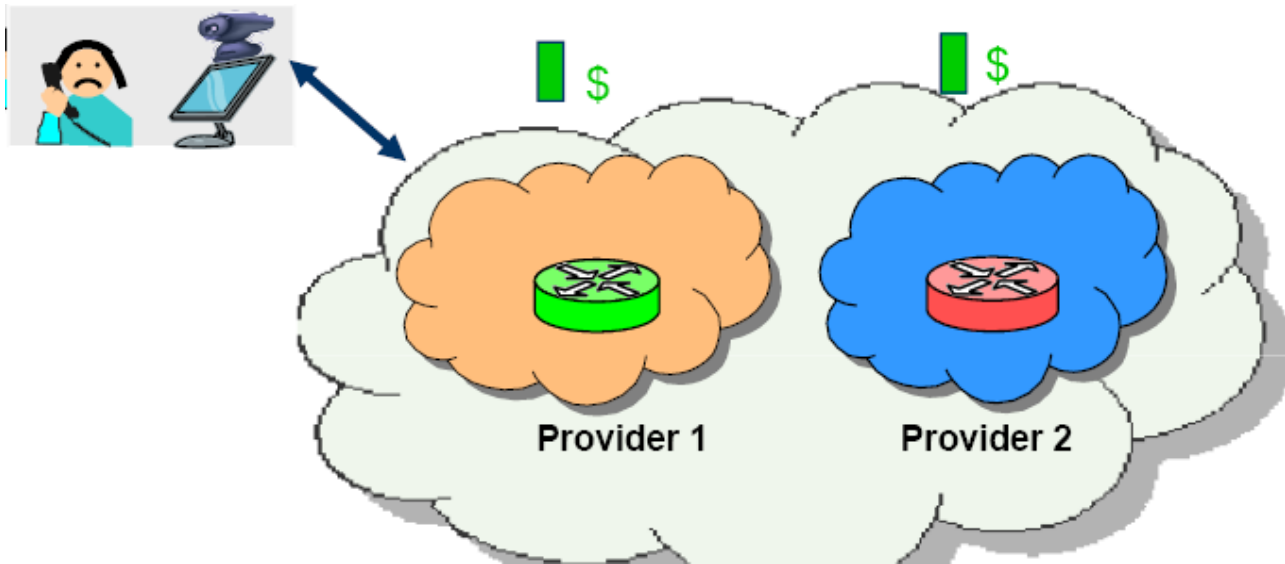


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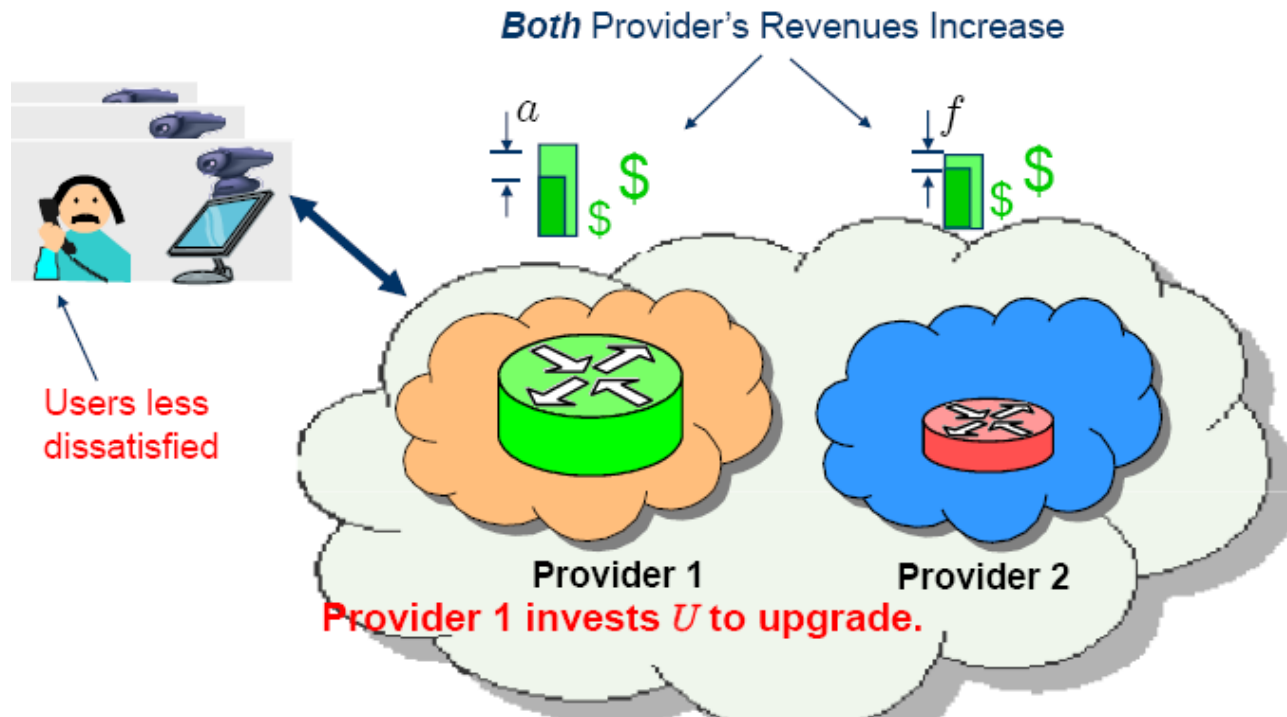
# Outline

- **Two ISPs**
- **N-ISPs**
- **Declining Upgrade Cost Model**

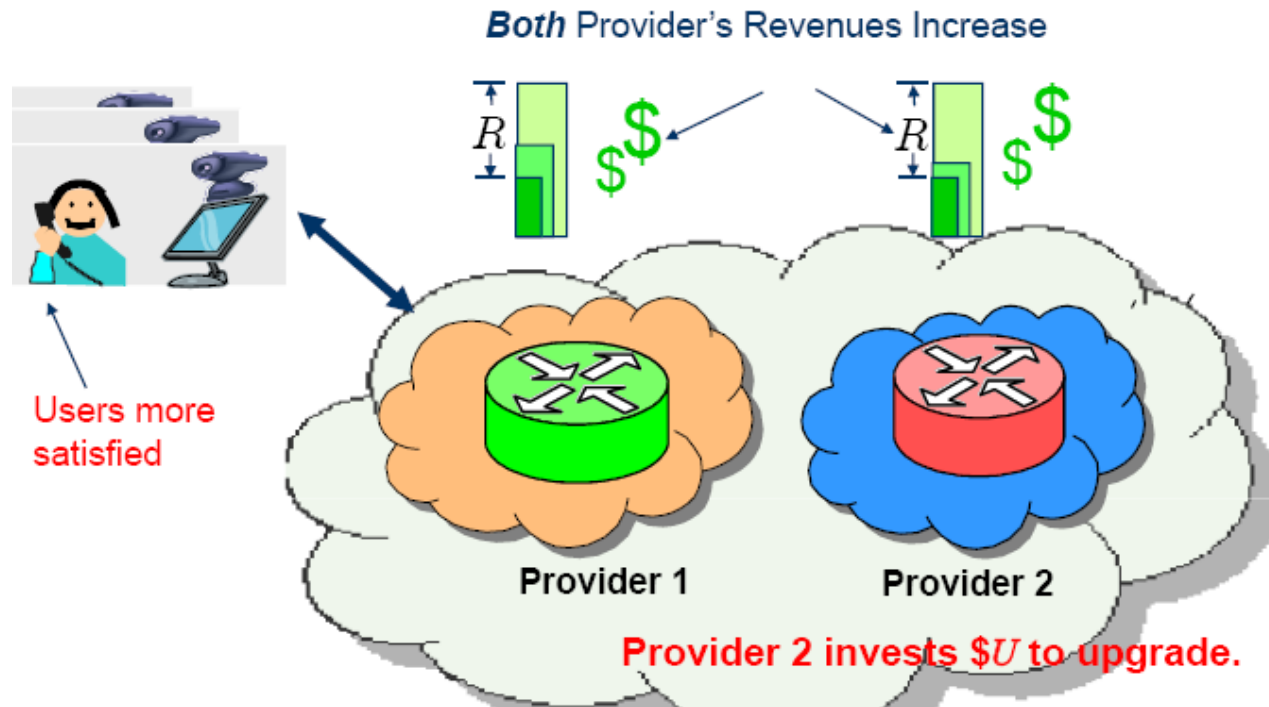
# Motivation



# Network after one upgrade



# Network after both upgrade



# Contribution

- Formulate this upgrade decision process as a repeated game.
- Obtain several sub-game perfect equilibria(SPE) under different conditions.
- Analyze the effect of declining upgrading cost in a continuous model.

# Two ISPs model

- In every time period, an ISP makes a decision according to its strategy.
- Discount factor is  $\delta$ .
- Game model for single period:

	Upgrade	Not Upgrade
Upgrade	R,R	a,f
Not Upgrade	f,a	0,0

# SPE and Conditions

- **Upgrade Immediately:** Both ISP choose to upgrade in the current period. This is SPE if

$$U \leq \frac{R - f}{1 - \delta}$$

- **Delayed Upgrade:** If another ISP upgrade before period  $n$ , it upgrade in the next period. Else it waits until the period  $n$  to upgrade. This is SPE if

$$\frac{a}{1 - \delta^n} + \frac{(\delta - \delta^n)R}{(1 - \delta)(1 - \delta^n)} \leq U \leq \frac{R - f}{1 - \delta}$$

- **Never Upgrade:** Using this strategy, the ISPs will never upgrade. It is SPE if:

$$U > \frac{a}{1 - \delta} \quad \text{and} \quad U > \frac{R - f}{1 - \delta}$$

## SPE and Conditions cont.

- **No First Upgrade:** Both do not upgrade until the other upgrades in the previous period. It's SPE if:

$$a + \frac{\delta R}{1 - \delta} \leq U \leq \frac{R - f}{1 - \delta}$$

- **Asymmetric Free-ride:** One upgrades immediately and the other never upgrade. This is SPE if

$$\frac{R - f}{1 - \delta} \leq U \leq \frac{a}{1 - \delta}$$

## SPE and Conditions cont.

- **Mixed Free-ride:** If no one has upgraded, both upgrade with probability  $\alpha$  . If one has upgraded, the other remains not-upgraded. It's SPE if:

$$\frac{R-f}{1-\delta} \leq U \leq \frac{a}{1-\delta}$$

- **Mixed Upgrade:** If no one has upgraded, both upgrade with probability  $\alpha$  . If one has upgraded, the other also upgrades. It's SPE if:

$$a + \frac{\delta R}{1-\delta} \leq U \leq \frac{R-f}{1-\delta}$$

# Proof

- **Upgrade Immediately:** Both ISP choose to upgrade in the current period. This is SPE if

$$U \leq \frac{R - f}{1 - \delta}$$

- Proof: Let ISP B upgrade immediately.

Action of A

Payoff of A

Upgrade at 0

$$-U + \frac{R}{1 - \delta}$$

Never upgrade

$$\frac{f}{1 - \delta}$$

Upgrade at n

In between

# Proof

- **Delayed Upgrade:** If another ISP upgrade before period  $n$ , it upgrade in the next period. Else it waits until the period  $n$  to upgrade. This is SPE if

$$\frac{a}{1-\delta^n} + \frac{(\delta - \delta^n)R}{(1-\delta)(1-\delta^n)} \leq U \leq \frac{R-f}{1-\delta}$$

- **Proof:** Let ISP B use delayed upgrade:

Action of A

Payoff of A

Upgrade at 0

$$a - U + \frac{\delta R}{1-\delta}$$

Never upgrade

$$\frac{\delta^n f}{1-\delta}$$

Upgrade at  $n$

$$\delta^n \left( \frac{R}{1-\delta} - U \right)$$

Before or after  $n$

Less or in between

# Proof

- **Mixed Free-ride:** If no one has upgraded, both upgrade with probability  $\alpha$ . If one has upgraded, the other remains not-upgraded. It's SPE if:

$$\frac{R-f}{1-\delta} \leq U \leq \frac{a}{1-\delta}$$

- **Proof:** Let ISP B use Mixed Free-ride. When no one has upgraded, the expected payoff of A for upgrading is

$$J_0(\alpha) = \alpha \frac{R}{1-\delta} + (1-\alpha) \frac{a}{1-\delta} - U$$

- The expected payoff  $J$  of A for not upgrading is

$$J_1(\alpha) = \alpha \frac{f}{1-\delta} + (1-\alpha)\delta J_1(\alpha)$$

$$J_0(0) - J_1(0) = \frac{a}{1-\delta} - U \geq 0 \quad J_0(1) - J_1(1) = \frac{R-f}{1-\delta} - U \leq 0$$

- There exist  $0 < \alpha^* < 1$  such that  $J_0(\alpha) = J_1(\alpha)$  and A is indifferent between two choices.

# Outline

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# N-ISPs

## ■ Define

- ◆  $f(j)$ : free-rider benefit if  $j$  ISPs upgraded
  - $f(0) = 0$
- ◆  $a(j)$ : early-adopter benefit if  $j$  ISPs upgraded
  - $a(N) = R$

## ■ Unique SPE: every ISP upgrading in the first period, if:

$$U \leq \frac{R - f(N - 1)}{1 - \delta}$$

- ◆ if stick to upgrade:  $\frac{R}{1 - \delta} - U$

>

- ◆ if never upgrade:  $\frac{f(N - 1)}{1 - \delta}$

# Upgrade Immediately (Strict Dominance)

- Claim: upgrade is a better decision in any situation, if
  - ◆ prove by induction
- Initial: suppose all but 2 ISPs have upgraded, say A & B.

$$U < \min_{j=0, \dots, N-1} \left[ \frac{a(j+1) - f(j)}{1 - \delta} \right]$$

A \ B	<i>upgrade</i>	<i>freeride</i>
<i>upgrade</i>	$\frac{a(N)}{1 - \delta} - U$	$\frac{a(N-1)}{1 - \delta} - U$
<i>freeride</i>	$\frac{f(N-1)}{1 - \delta}$	$\frac{f(N-2)}{1 - \delta}$

- ◆ Upgrade Incentive: \_\_\_\_\_
- ◆ Dominant: \_\_\_\_\_

$$\frac{a(N)}{1 - \delta} - U \geq \frac{f(N-1)}{1 - \delta}, \quad \frac{a(N-1)}{1 - \delta} - U \geq \frac{f(N-2)}{1 - \delta}$$

$$U < \min\left(\frac{a(N) - f(N-1)}{1 - \delta}, \frac{a(N-1) - f(N-2)}{1 - \delta}\right)$$

# Upgrade Immediately (Strict Dominance)

- Assume all but (i) ISPs upgrade, and the claim is correct.
- Now, suppose all but (i+1) ISPs upgrade,

- ◆ if  $k \in \{0, \dots, i\}$  upgrade in current period,

$$\begin{cases} a(N-i+k) + \delta \frac{R}{1-\delta} - U, & \text{A upgrades now} \\ f(N-i+k-1) + \delta \frac{R}{1-\delta} - \delta U, & \text{A waits} \end{cases} \quad \text{--- } \delta \frac{R}{1-\delta} \text{ is a upbound}$$

- ◆ Upgrade Incentive:  $U < \frac{a(N-i+k) - f(N-i+k-1)}{1-\delta}, k \in 0, \dots, i$

- So, induction argument shows Every One Upgrade is a SPE iff:

$$U < \min_{j=0, \dots, N-1} \left[ \frac{a(j+1) - f(j)}{1-\delta} \right] \quad \text{upgrade is better than free-rider!}$$

# Outline

- Two ISPs
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# Declining Upgrade Cost Model

- Continuous Time Model, 2 ISPs here.

A \ B	upgrade	free ride
upgrade	R, R	a, f
free ride	f, a	0, 0

- Revenues discount factor:  $e^{-\delta t}$

- ◆ if both/one upgrade at time 0, the total revenue, is:

$$\int_0^{+\infty} e^{-\delta t} R = \frac{R}{\delta}, \int_0^{+\infty} e^{-\delta t} a = \frac{a}{\delta}, \int_0^{+\infty} e^{-\delta t} f = \frac{f}{\delta}$$

- Cost decline at factor:  $e^{-\gamma t}$

- ◆ Includes: declining upgrade costs and discounting factor,  $\gamma > \delta$
- ◆ The upgrade cost at time  $t'$  is:

$$e^{-\gamma t'} U$$

# Two Critical Time

- $t_f^*$ : the time upgrade is a better decision than free-ride,

$$t_f^* = \arg \max_{t \in \mathbb{R}^+} \left[ e^{-\delta t} \frac{(R-f)}{\delta} - Ue^{-\gamma t} \right] = \left[ \frac{1}{\gamma - \delta} \log \left( \frac{\gamma U}{R-f} \right) \right]$$

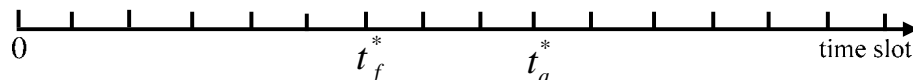
- $t_a^*$ : the time the first to upgrade is a better decision

$$t_a^* = \arg \max_{t \in \mathbb{R}^+} \left[ e^{-\delta t} \frac{a}{\delta} - Ue^{-\gamma t} \right] = \left[ \frac{1}{\gamma - \delta} \log \left( \frac{\gamma U}{a} \right) \right]$$

- Claim: both ISPs have upgraded after time  $t_f^*$ , proof as follows.

# Theorem

## ■ Theorem 3:



- ◆ Suppose  $t_a^* \geq t_f^*$ , the only SPE is two ISPs both upgrade at  $t_f^*$

- ◆ Proof:  $R - f \geq a$

- Step 1: A upgrade at time before  $t_f^*$ , B will upgrade at time  $t_f^*$

$$\arg \max_{t \geq t'} \left[ \underbrace{e^{-\delta t} \frac{R}{\delta}}_{\text{upgrade revenue}} + \underbrace{(e^{-\delta t'} - e^{-\delta t}) \frac{f}{\delta}}_{\text{free rider revenue}} - \underbrace{Ue^{-\gamma t}}_{\text{cost}} \right] = \arg \max_{t \geq t'} \left[ e^{-\delta t} \frac{R-f}{\delta} - Ue^{-\gamma t} \right] = t_f^*$$

- Step 2: A upgrade after time  $t_f^*$ , B follows immediately

$$\arg \max_{t \geq t'} \left[ e^{-\delta t} \frac{R}{\delta} + (e^{-\delta t'} - e^{-\delta t}) \frac{f}{\delta} - Ue^{-\gamma t} \right] = \arg \max_{t \geq t'} \left[ e^{-\delta t} \frac{R-f}{\delta} - Ue^{-\gamma t} \right] = t'$$

decrease function if  $t \geq t_f^*$

## Theorem 3 (cont.)

- Step 3:
  - if A consider upgrade before time  $t_f^*$ , derive his payoff as he can induce B's behavior:

$$\arg \max_{t \leq t_f^*} \left[ e^{-\delta t} \frac{R}{\delta} + (e^{-\delta t} - e^{-\delta t_f^*}) \frac{a}{\delta} - Ue^{-\gamma t} \right] = \arg \max_{t \leq t_f^*} \left[ e^{-\delta t} \frac{a}{\delta} - Ue^{-\gamma t} \right] = \min(t_a^*, t_f^*) = t_f^*$$

- if A consider upgrade after time  $t_f^*$ , maximize his payoff as he can induce B's behavior:

$$\arg \max_{t \geq t_f^*} \left[ e^{-\delta t} \frac{R}{\delta} - Ue^{-\gamma t} \right] = \min \left[ t_f^*, \frac{1}{\gamma - \delta} \log \left( \frac{\gamma U}{R} \right) \right] = t_f^*$$

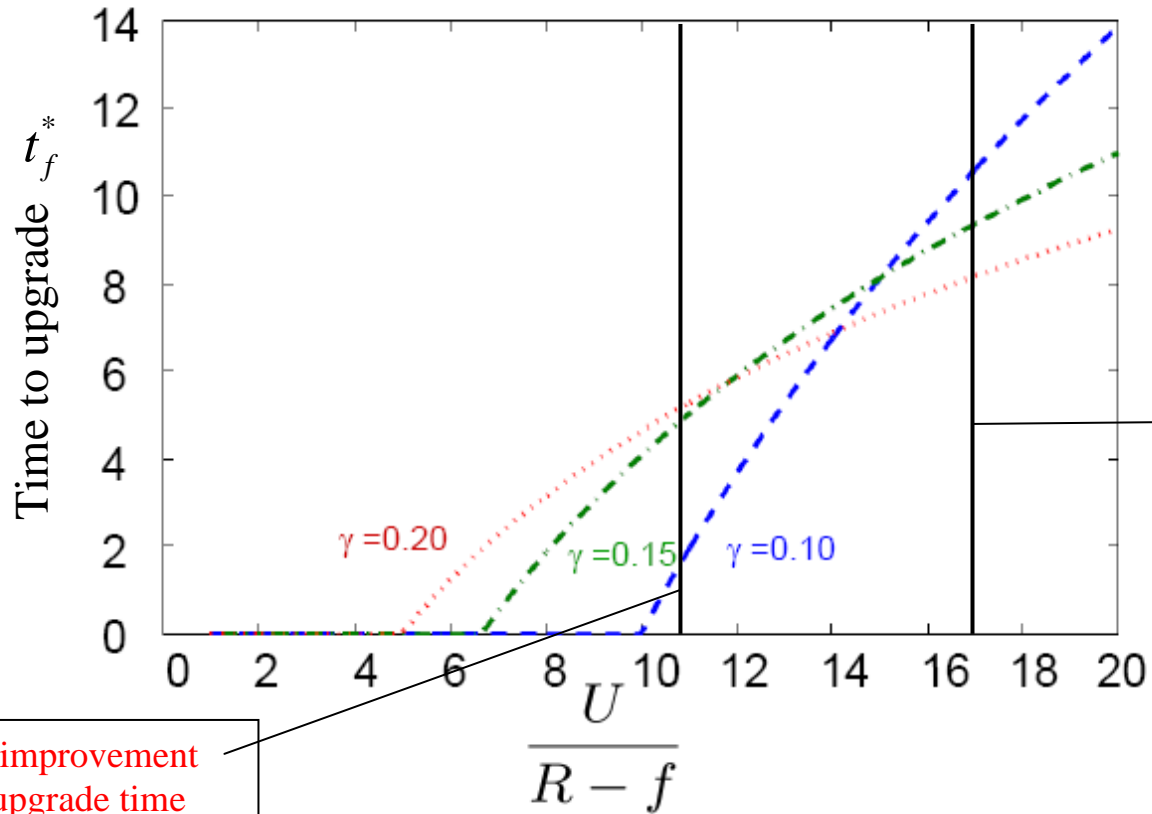
- So, upgrade at time  $t_f^*$  is always a best decision when  $t_a^* \geq t_f^*$

# Theorem

## ■ Theorem 4:

- ◆ Suppose  $t_a^* < t_f^*$ , the only SPE is:
  - one ISPs upgrade at  $t_a^*$
  - the other one upgrade at  $t_f^*$
- ◆ Similar proof with Theorem 3.
- ◆ Intuition: compete for the time  $t_a^*$ , if fail wait to upgrade until time  $t_f^*$

# Time to Upgrade $t_f^*$



# Summary

## ■ Discrete Time Model:

- ◆ Obtain several sub-game perfect equilibrium(SPE) under different conditions.
- ◆ Discuss the free riding effect to the upgrading decisions

## ■ Continuous Time Model:

- ◆ Cost declining model, discuss the effect of technique improvement to the upgrade decision.
- ◆ Technique improvement may delay the upgrading time

■ Thank you!

■ Questions?