

# A Game Theoretic Model for Network Upgrade Decisions

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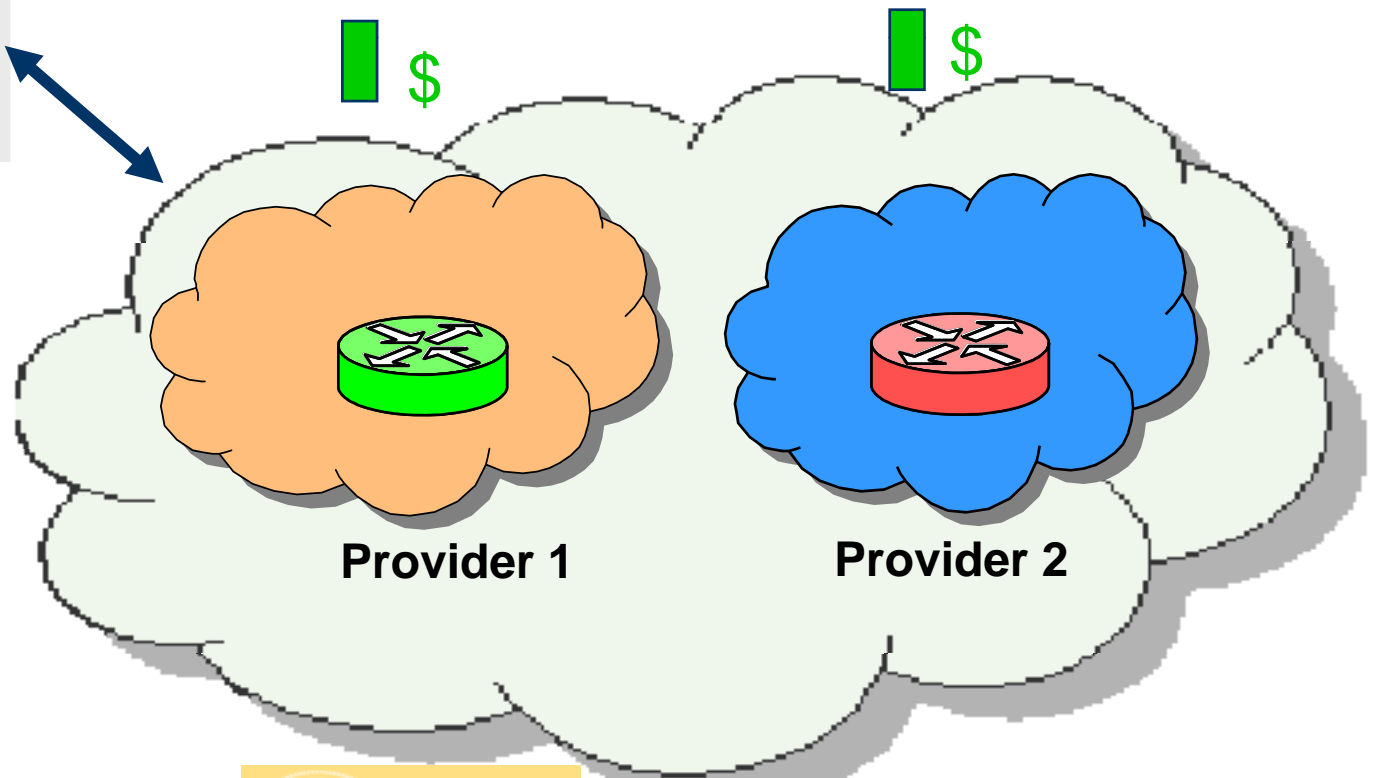
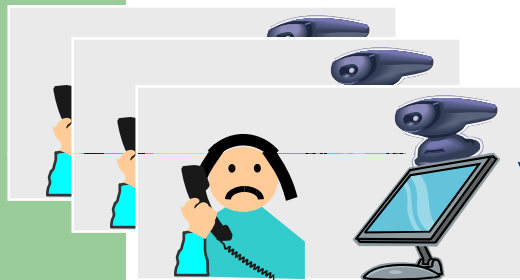
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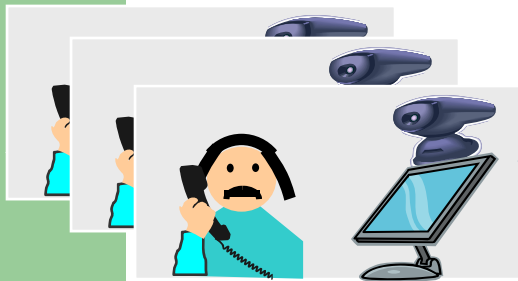
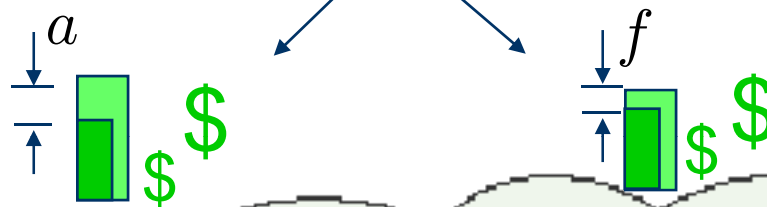
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# Starting Network

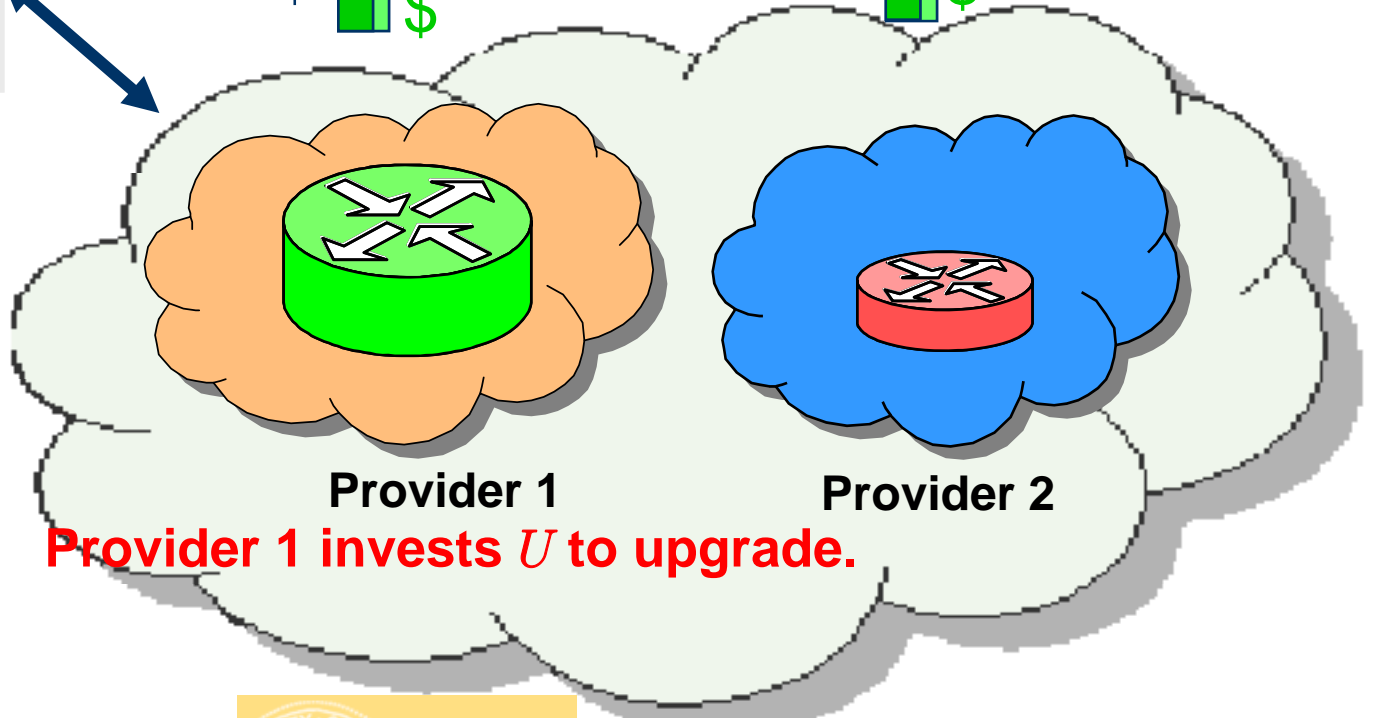


# Network After One Upgrade

Both Provider's Revenues Increase



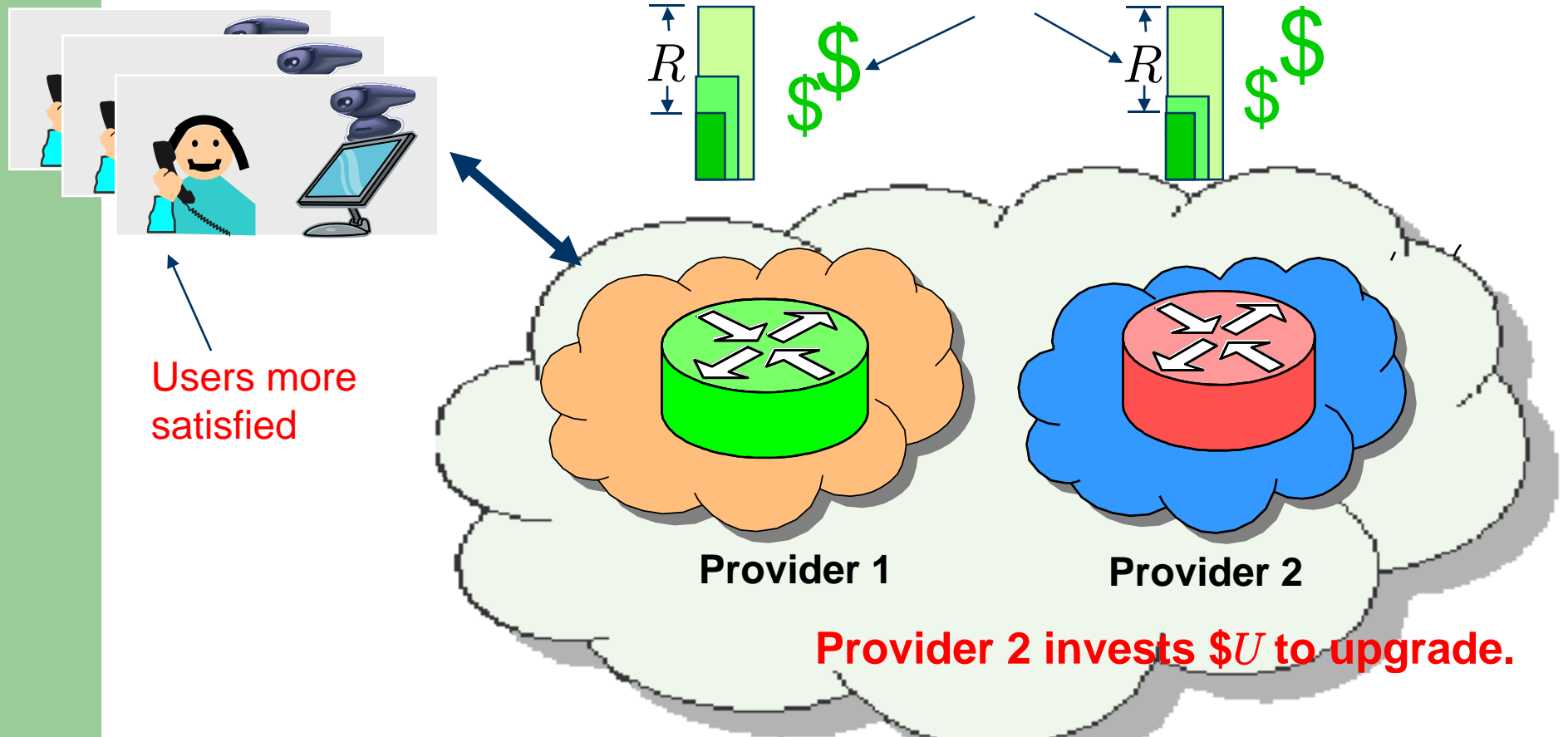
Users less dissatisfied



Provider 1  
Provider 2  
Provider 1 invests  $U$  to upgrade.

# Network After Both Upgrade

Both Provider's Revenues Increase



Users more satisfied

Provider 2 invests \$U to upgrade.

# Outline

- Two Providers
- N providers
- Upgrade costs that decline

# Multi-Stage Game



- Payoffs  $n$  periods in future discounted by  $\delta^n$ .
- In each period, players simultaneously decide whether to upgrade.
- A player sees what the other player did in previous periods.
- A strategy  $\underline{s}_i$  is a plan of action for each period  $k$  as a function of the history  $h_k$ .

## Per-Period Revenue Matrix:

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

$$f < a < R$$

- The provider incurs a one time cost of  $U$  when upgrading.
- Upgrading is irreversible.

## Solution Concepts

- An ordinary Subgame Perfect Nash Equilibrium (SPE) is
  - a strategy profile
    - (assignment of strategies to all players)
  - such that in any subgame,
  - no player can improve her payoff by unilaterally deviating from the strategy profile.

- SPE Condition:

$$p|h_k(s_i^*, s_{-i}^*) \geq p|h_k(s_i, s_{-i}^*)$$

- For all  $i$  ,  $h_k$



# SPE by Iterated Strict dominance

- Strategy  $s_i$  is *dominated* if

$$p(s_i, s_{-i}) < p(s_j, s_{-i})$$

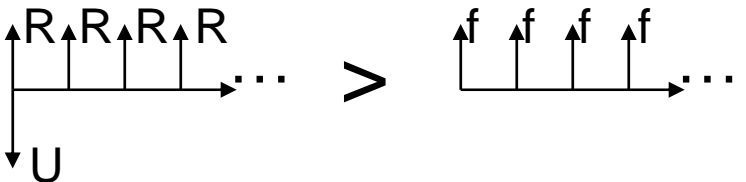
For some  $j$  and all  $s_{-i}$

Idea of Iterated Strict Dominance:

- Make  $G'$  by removing dominated strategies from original game  $G$ .
- Repeat...
- If after this process only one strategy profile remains, we say it is an ***SPE by iterated strict dominance***.
  - Players can deduce what opponents will do, without “guessing.”

# Theorem 1

Suppose  $U < \frac{R - f}{1 - \delta}$

Equivalently: 

Then an SPE is:

- **Upgrade Immediately** – Both providers choose to upgrade in the current period

If Also

$$U < \frac{a}{1 - \delta}$$

Then

- **Upgrade Immediately** is a unique SPE by iterated strict dominance

The following are also SPE:

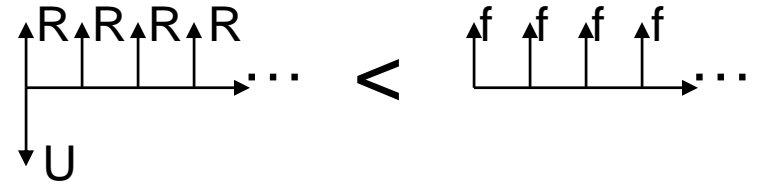
$$U \geq a + \delta \frac{R}{1 - \delta}$$

- **No First Upgrade** – No provider willing to upgrade first
- **Delayed Upgrade** – Each provider waits until period  $n$  to upgrade
- **Mixed Upgrade** – Each provider upgrades with probability  $\alpha$  in each period.

# Theorem 1 Continued

Suppose:  $U > \frac{R - f}{1 - \delta}$

Equivalently:



If Also

Then an SPE is:

$$U < \frac{a}{1 - \delta}$$

- **Never upgrade** – Do not upgrade no matter what

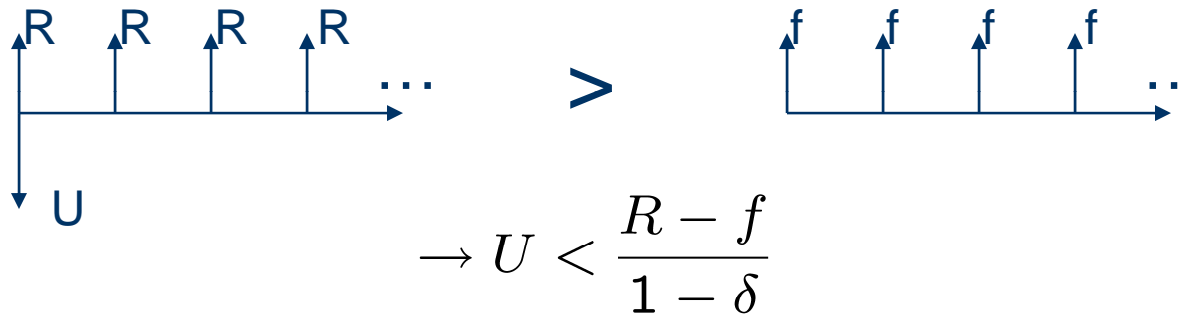
$$U > \frac{a}{1 - \delta}$$

- **Asymmetric Freeride** – One player upgrades the other freerides
- **Mixed Freeride** – Players upgrade with probability  $\alpha$ , until one upgrades. Then other one freerides

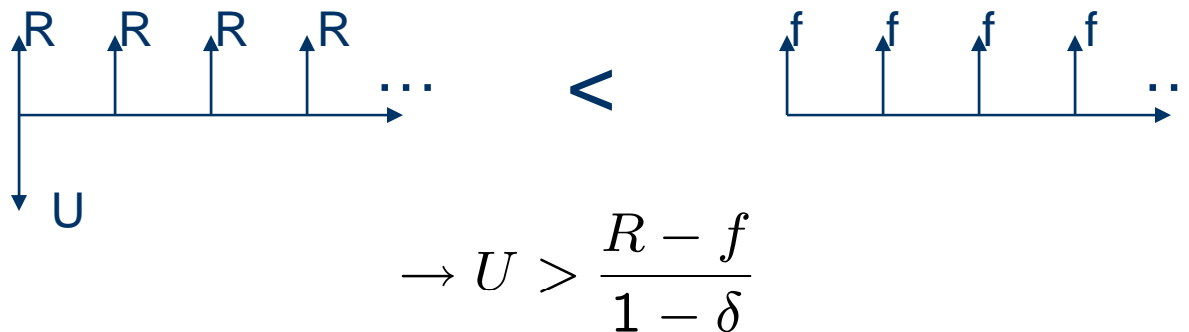
# Theorem 1

- Two Groupings of Cases:

Group 1:



Group 2:



## “Upgrade Immediately”

- Both providers Upgrade in current period.
- SPE if

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

- “Proof”



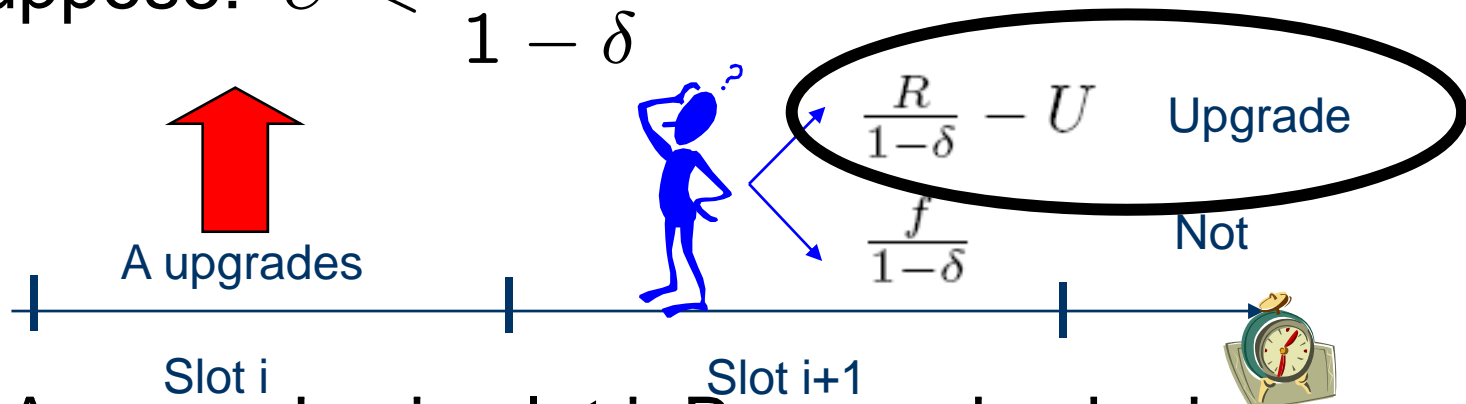
$$\begin{array}{l} \nearrow \frac{R}{1-\delta} - U \\ \searrow \frac{f}{1-\delta} \end{array}$$

Stick

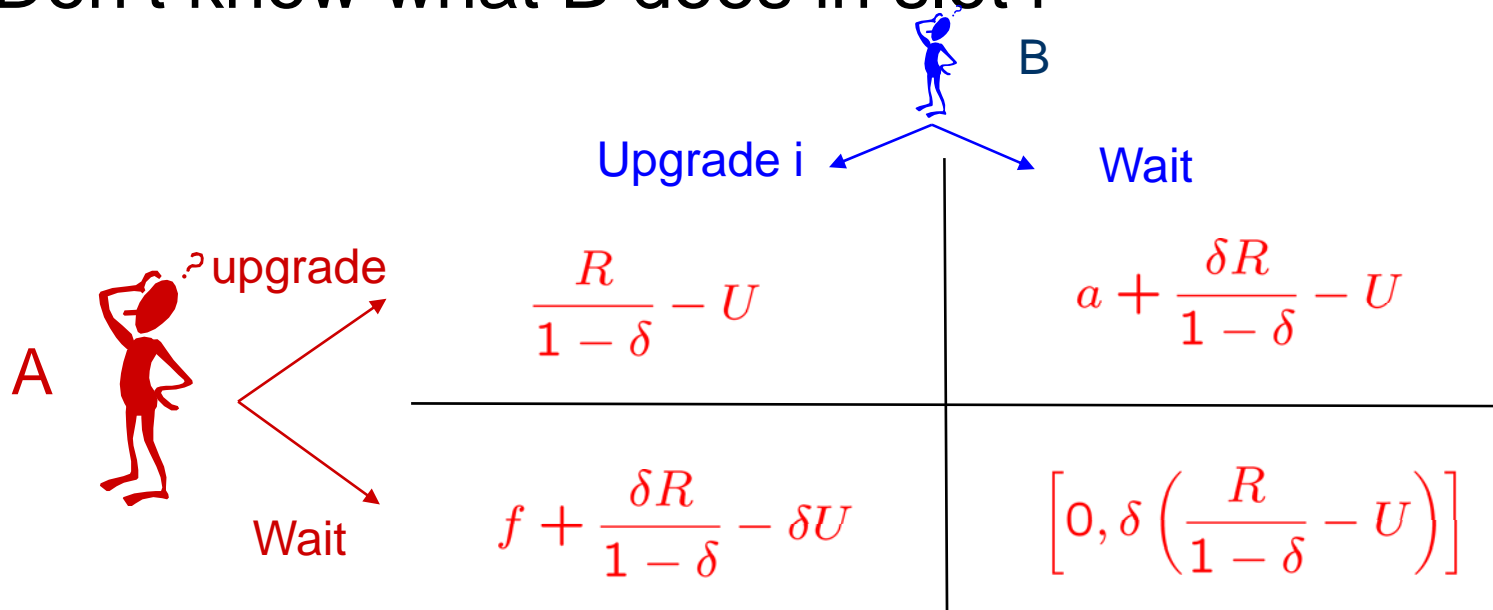
Deviate

# Upgrade Immediately (Cond. For Uniqueness)

Suppose:  $U < \frac{R - f}{1 - \delta}$



- If A upgrades in slot i, B upgrades by i+1
- Don't know what B does in slot i



## Upgrade Immediately (Uniqueness)

- Upgrade is better for both conditional payoff functions if

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

# Delayed Upgrade

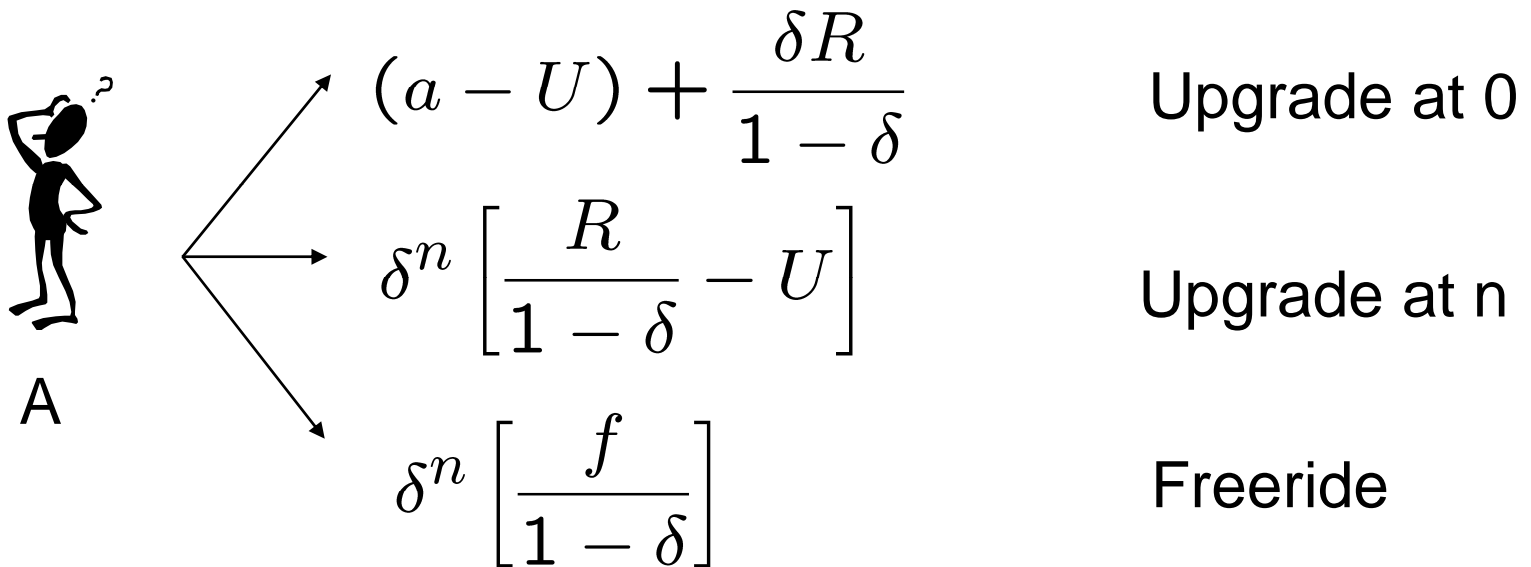
- Each provider expects the other to upgrade in period  $n$ .
- Strategy
  - Upgrade in period  $n$ .
  - But, If opponent upgrades in period  $i < n$ , upgrade in  $i+1$ .
- $n = \infty$  corresponds to “no first upgrade.”
- Conditions:

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



## Delayed Upgrade Proof

- Suppose player B plays “upgrade in period n”



- Upgrade at n best if:

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

## “Mixed Upgrade”

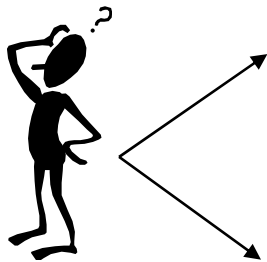
- Subgame starting with no-one upgraded:
  - Each upgrades with probability  $\alpha$ .
- Subgame starting with one-upgraded:
  - The not-upgraded upgrades immediately.
- SPE if

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

# Mixed Upgrade

- Suppose B follows mixed upgrade and that

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



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

Upgrade

$$J = (1 - \alpha)\delta J + \alpha \left( f + \delta \frac{R}{1 - \delta} - \delta U \right)$$

Wait

# Mixed Upgrade

- Difference

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


- Sufficient condition for existence of a zero

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


# Theorem 1 proof

- Two Groupings of Cases:

Group 1:


$$\rightarrow U < \frac{R - f}{1 - \delta}$$

Group 2:


$$\rightarrow U > \frac{R - f}{1 - \delta}$$

# Asymmetric Free-ride

- Player A upgrades slot 1.
- Player B never upgrades.

- SPE if

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

## Other Cases for

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

- “Mixed Freeride”

- Condition:  $U < \frac{a}{1 - \delta}$
- Each upgrades with probability  $\alpha$ ; if one upgrades first the other freerides.
- Proof: Similar to “Mixed Upgrade.”

- “Never Upgrade”

- Condition:  $U \geq \frac{a}{1 - \delta}$
- No one upgrades, even if the other one were to.
- Proof: easy.

# Outline

- Two Providers
- **N providers**
- Upgrade costs that decline



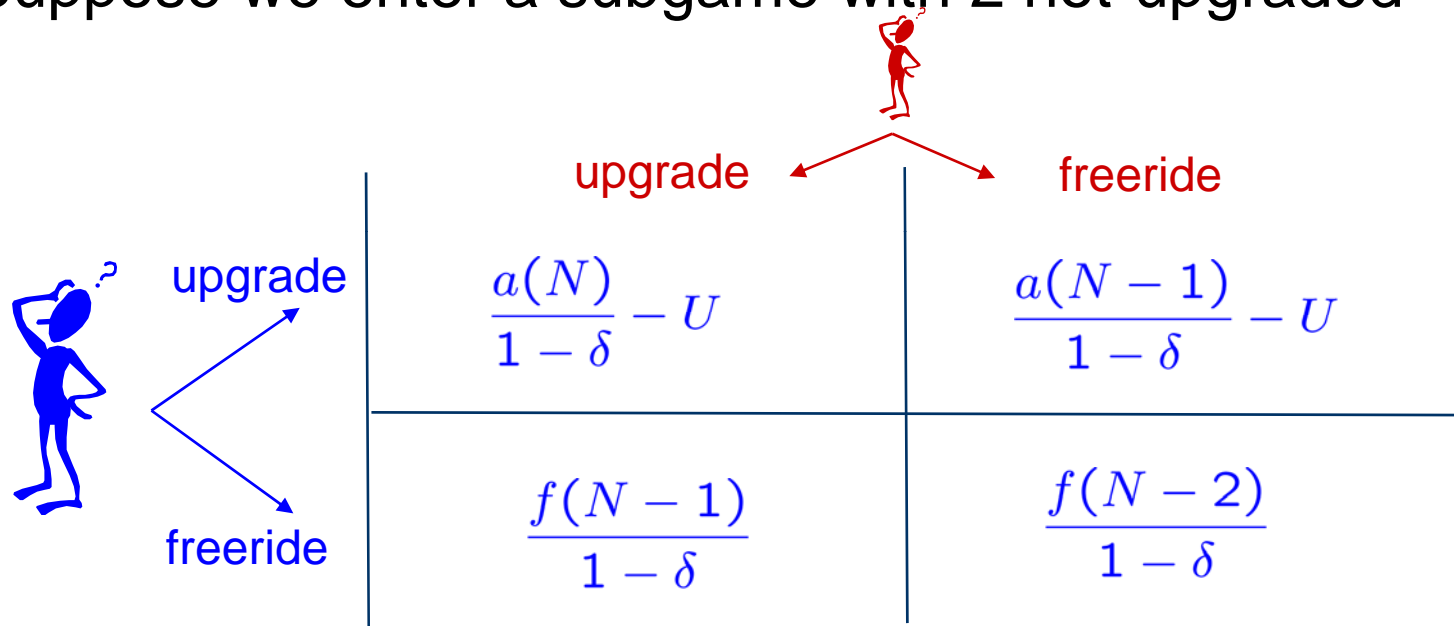
# N-Providers in Tandem

- Let
  - $f(j)$  = free-rider benefit if  $j$  providers upgrade.
    - $f(0) == 0$
  - $a(j)$  = early adopter benefit if  $j$  providers upgrade.
    - $a(N) == R$
- All Upgrade a SPE if:

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

# Upgrade Immediately (Dominance)

- Suppose we enter a subgame with 2 not-upgraded



- Upgrading Dominant if:

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

## Upgrade Immediately (Dominance)

- Induction argument shows that everyone upgrading is unique SPE by iterated deletion of dominated strategies if:

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

# Outline

- Two Providers
- N providers
- Upgrade costs that decline

# Declining Upgrade Cost Model

- Continuous Time
- Future Revenues are discounted at rate  $\delta$ 
  - Example if both providers upgrade at time 0, the P.V. of each's revenues is:

$$\int_0^{\infty} e^{-\delta t} R = \frac{R}{\delta}$$

- Upgrade costs decline at rate  $\gamma$ 
  - $\gamma$  includes declining costs + discounting so  $\gamma > \delta$ .
  - P.V. of upgrade cost at time  $t'$  is:

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

## Critical Times

- Time when upgrading looks better than freeriding:

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

- Time when being a first adopter looks attractive:

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

## Theorem 3

Suppose  $t_a^* \geq t_f^*$

- Then the only SPE is:
  - Both providers upgrade at time  $t_f^*$
- Proof outline:
  - Step 1: A upgrades before  $t_f^*$ 
    - B upgrades at  $t_f^*$  (dominant)
  - Step 2: A upgrades after  $t_f^*$  and B not yet upgraded
    - B Upgrades immediately after A (dominant).
  - Step 3: Because A can induce B to upgrade at  $t_f^*$ , A best option is to upgrade at  $t_f^*$

## Theorem 3 Proof – Step 1

- Suppose A upgrades at time  $t' < t_f^*$
- B's best response in ensuing subgame:

$$\begin{aligned}
 t &= \arg \max_{t \geq t'} \left[ \overset{\text{Rev. after upgrade}}{e^{-\delta t} \frac{R}{\delta}} - \overset{\text{Freeride revenue before upgrade}}{(e^{-\delta t'} - e^{-\delta t}) \frac{f}{\delta}} - \overset{\text{Upgrade cost}}{U e^{-\gamma t}} \right] \\
 &= \arg \max_{t \geq \tau} \left[ e^{-\delta t} \frac{R - f}{\delta} - U e^{-\gamma t} \right] \\
 &= t_f^*
 \end{aligned}$$



## Theorem 3 Proof – Step 2

- Suppose A upgrades at time  $t' > t_f^*$
- B's best response in ensuing subgame:

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

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

$$= t'$$

## Theorem 3 Proof – Step 3

- Suppose A considers upgrading before  $t_f^*$ .
- Considering induced behavior on B, A's best response is:

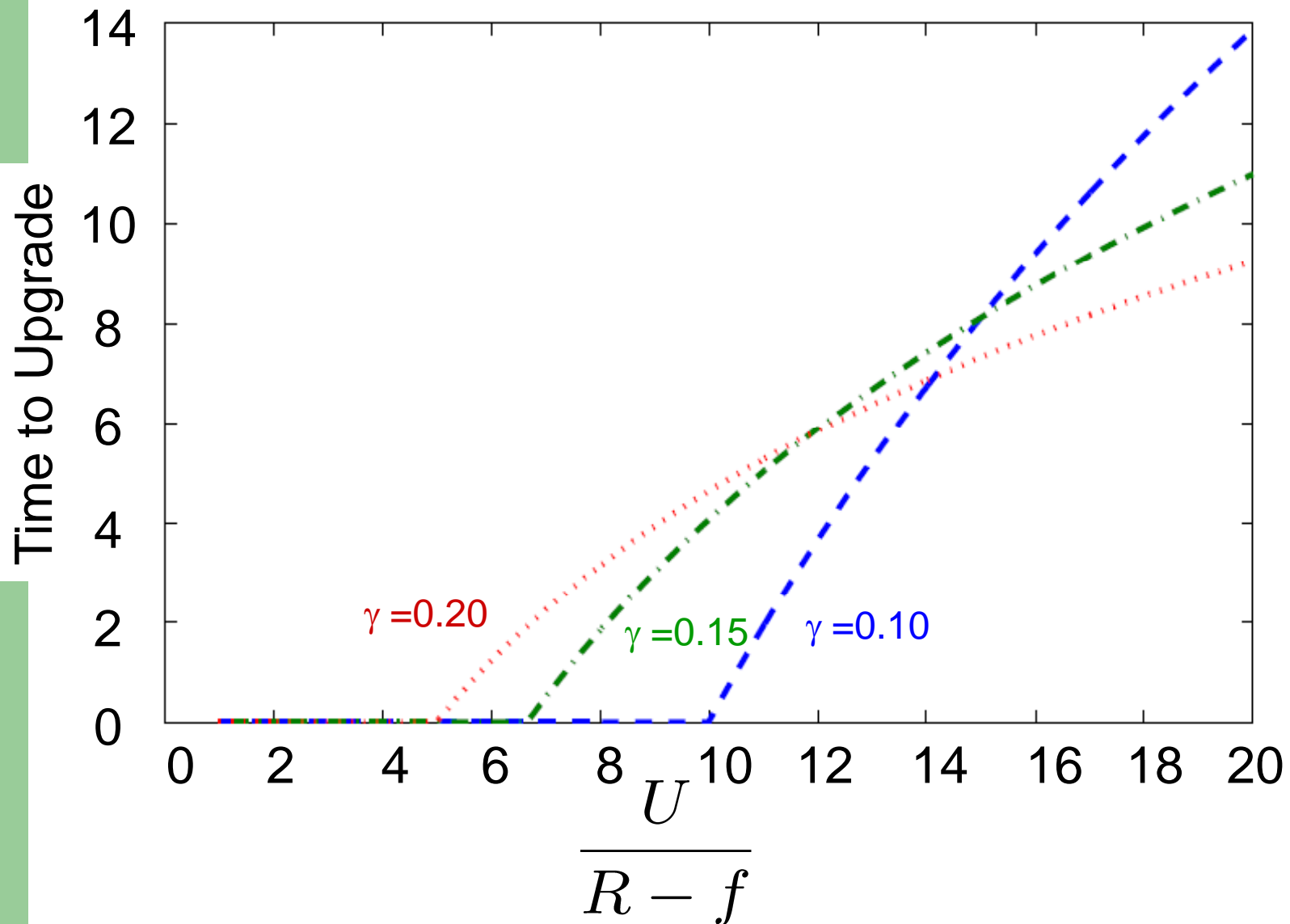
$$\begin{aligned} & \arg \max_{t \leq t_f^*} \left[ e^{-\delta t} \frac{R}{\delta} + (e^{-\delta t} - e^{-\delta t_f^*}) \frac{a}{\delta} - U e^{-\gamma t} \right] \\ &= \arg \max_{t \leq t_f^*} \left[ e^{-\delta t} \frac{a}{\delta} - U e^{-\gamma t} \right] \\ &= \min(t_a^*, t_f^*) = t_f^* \end{aligned}$$

- Similarly, can show that A upgrading after  $t_f^*$  gives lower payoff.

## Theorem 4

- Suppose  $t_a^* < t_f^*$
- It is a SPE for
  - One provider to upgrade at time  $t_a^*$
  - The other provider to upgrade at time  $t_f^*$
- Proof:
  - Similar as Theorem 3's proof.

# Time to Upgrade, $\delta = 0.05$



# Conclusions

- Discrete Time Model
  - Strong conditions required to have unique SPE.
    - Otherwise many strange SPE possible.
  - Freeriding effect may prevent upgrades even when it is socially optimal to do so.
- Continuous Time with Declining Costs
  - *Unique* SPE if  $\tau_f^* \leq \tau_a^*$
  - Asymmetric SPE otherwise.
  - Freeriding delays upgrades.
  - More rapidly declining upgrade costs may *increase* the time until networks upgrade.