

### Economics of the Internet: A Policy Perspective

Saswati Sarkar - A joint work with Mohammad Hassan Lotfi

Dept. of Electrical and Systems Engineering University of Pennsylvania swati@seas.upenn.edu & lotfm@seas.upenn.edu

September 23,2016

### Organization of the Talk



- ► Regulation on the Internet
- ► Introduction
- ► Model
- ► Sub-game Perfect Nash Equilibrium
- ► Numerical Results and Discussion

### Regulation on the Internet in the US



- ► The communication act of 1996:
  - ⇒ Separated telephone and Information Services (IS).
  - $\Rightarrow$  Relaxed regulation for IS's  $\rightarrow$  investment on the Internet.
- ▶ In 2007, controversy over the Comcast limitation for BitTorrent.
  - ⇒ "Net-Neutrality" rules.
- ▶ Policies that mandate ISPs to treat all data equally, regardless of the source, destination, and type of the data.

### Net-Neutrality in the US: Now



- ▶ In January 2014, a federal appeals court struck down parts of the FCC's rules for Net-Neutrality.
- ▶ Comcast and Netflix signed an agreement in February 2014.
- ► AT&T sponsered data plans .
- ► February 2015: Broadband Internet Access listed as a public utility.
  - ⇒ Both wired and wireless.
  - ⇒ Ground for more neutrality regulations.
- Will not be the end, several lawsuits expected!



### Net-Neutrality All Around the World



- ► Europe: In October 2015, the European parliament rejected legal amendments for strict net-neutrality rules.
  - ⇒ Allow for sponsored data plans and Internet fast lanes for specialized services.
- India: Controversy about Facebook's Internet.org.
- ▶ Iran: Examples of net-neutrality violations: cooperation of RighTel and Aparat.

## Organization of the Talk



- ► Regulation on the Internet
- ► Introduction
- ► Model
- ► Sub-game Perfect Nash Equilibrium
- ► Numerical Results and Discussion

### Our Work



- ▶ Intersection of engineering, economics, and public policy.
- ▶ Economic models for an Internet market, consists of:
  - Internet Serviced Providers (ISPs)
  - Content Providers (CPs)
  - ► End-Users (EUs)
- Problems considered:
  - ► Non-neutrality Adoption: (CISS'16)
    - How does the competition control the Internet market?
    - Social welfare analysis of the market.
    - ▶ Do we need regulation?
  - Different pricing frameworks in a non-neutral Internet: (TAC'16,WiOpt'15)
    - ▶ Which entity benefits more?
    - ▶ What is their effect on the market in the long-run?

### Our Work



- ▶ Intersection of engineering, economics, and public policy.
- ▶ Economic models for an Internet market, consists of:
  - ► Internet Serviced Providers (ISPs)
  - ► Content Providers (CPs)
  - ► End-Users (EUs)
- ▶ Problems considered:
  - Non-neutrality Adoption without regulation:
    - How does the competition control the Internet market?
    - Social welfare analysis of the market.
    - Do we need regulation?
  - ▶ Different pricing frameworks in a non-neutral Internet:
    - ► Which entity benefits more?
    - ▶ What is their effect on the market in the long-run?

### **Net-Neutrality Adoption**



- ▶ One of the main factors in determining the regulation is competition.
- ▶ The leverage of CPs is one distinction of the Internet market.
  - ► CPs can control the equilibrium via differentiation between ISPs.
  - ► ISPs are afraid of non-neutrality by CPs!
- We model the framework with:
  - Some ISPs neutral, some non-neutral.
  - ► Asymmetric competition between ISPs.
  - CPs can differentiate between ISPs and their EUs.
- ► Goals:
  - Provide an insight for the new equilibrium of the Internet market.
  - ▶ How is each entity affected?
  - Do we need regulation?

## Organization of the Talk



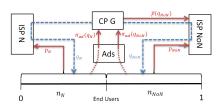
- ► Regulation on the Internet
- ► Introduction
- ► Model
- ► Sub-game Perfect Nash Equilibrium
- ► Numerical Results and Discussion

### Model



- ▶ Interactions between entities in the Internet market:
  - ► Internet Serviced Providers (ISPs)
    - ► 1 neutral offers:
      - ⇒ free (basic) quality
    - ► 1 non-neutral: offers:
      - ⇒ free quality
      - ⇒ premium quality
  - Content Providers (CPs)
    - ▶ 1 CP with high market power (e.g. Google)
  - End-Users (EUs)



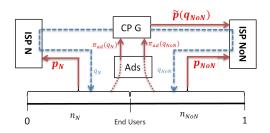


- ▶ EUs decide between ISPs based on:
  - innate preference for ISPs (inertia)
  - ► Internet access fees
  - quality
- The payoff:

$$u_{EU,j}(x) = v^* + \kappa_{ad}q_j - t_jx_j - p_j \quad j \in \{N, NoN\}$$

- ▶ *t<sub>j</sub>*: transport cost
- $t_j \uparrow \Rightarrow$  preference for ISP j  $\downarrow$
- ► Market power of ISP N:  $\frac{t_{NoN}}{t_N+t_{NoN}}$
- $\triangleright$   $n_N$ : fraction of EUs with neutral ISP.
- $ightharpoonup n_{NoN}$ : fraction of EUs with non-neutral ISP.

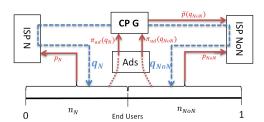




- ▶ Non-neutral decides on:
  - ► Internet access fee (p<sub>NoN</sub>)
  - side-payment  $(\tilde{p})$
- Neutral decides on:
  - ► Internet access fee (p<sub>N</sub>)
- ► Payoffs:

$$\pi_N(p_N) = (p_N - c)n_N$$
 $\pi_{NoN}(p_{NoN}, \tilde{p}) = (p_{NoN} - c)n_{NoN} + \tilde{p}q_{NoN}n_{NoN}$ 





- ▶ Decides on the qualities for EUs of neutral and non-neutral ISPs.
- Premium quality comes with a price.
- payoff:

$$\pi_{G}(q_{N}, q_{NoN}) = \begin{cases} \kappa_{ad} q_{N} n_{N} + \kappa_{ad} q_{NoN} n_{NoN} & \text{if } q_{NoN} = \tilde{q}_{f} \\ \kappa_{ad} q_{N} n_{N} + (\kappa_{ad} - \tilde{p}) q_{NoN} n_{NoN} & \text{if } q_{NoN} = \tilde{q}_{p} \end{cases}$$

### Highlights of Model and Assumptions



- Highlights of the model:
  - $\Rightarrow$  Take into account the initial stages of migration to a non-neutral regime (some ISPs neutral, some non-neutral)
  - ⇒ CPs can control the equilibrium outcome via quality choices.
  - ⇒ Competition between neutral and non-neutral ISPs.
  - ⇒ Asymmetric innate preferences (inertias) of EUs for ISPs.
- ▶ Modeled with a 4-stage sequential game:
  - $\Rightarrow$  Stage 1: ISPs decide on  $p_N$  and  $p_{NoN}$ .
  - $\Rightarrow$  Stage 2: ISP NoN decides on the side-payment,  $\tilde{p}$ .
  - $\Rightarrow$  Stage 3: CP decides on the qualities,  $q_N$  and  $q_{NoN}$ .
  - ⇒ Stage 4: EUs decide.

### Organization of the Talk



- ► Regulation on the Internet
- ► Introduction
- ► Model
- Sub-game Perfect Nash Equilibrium
- ► Numerical Results and Discussion



- We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. (candidate strategy a:) Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - (candidate strategy b:) Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - 3. (candidate strategy c:) Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{a}_a)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N
  - 4. (candidate strategy d:) Both ISPs active 3:
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on both ISPs.



- We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. (candidate strategy a:) Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 2. (candidate strategy b:) Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - 3. (candidate strategy c:) Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N
  - 4. (candidate strategy d:) Both ISPs active 3:
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on both ISPs.



- We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. (candidate strategy a:) Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 2. (candidate strategy b:) Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 3. (candidate strategy c:) Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N
  - 4. (candidate strategy d:) Both ISPs active 3:
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on both ISPs.



- We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. (candidate strategy a:) Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 2. (candidate strategy b:) Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 3. (candidate strategy c:) Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N.
  - 4. (candidate strategy d:) Both ISPs active 3:  $\Rightarrow$  CP offers with free quality ( $\tilde{q}_{\epsilon}$ ) on both ISPs



- We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. (candidate strategy a:) Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 2. (candidate strategy b:) Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - 3. (candidate strategy c:) Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N.
  - 4. (candidate strategy d:) Both ISPs active 3:
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on both ISPs.

# SPNE: EUs not locked-in with ISPs (real competition, Penn

#### Unique SPNE Exists.

- We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - 2. Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - 3. Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N.
  - 4. Both ISPs active 3:
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on both ISPs.

### SPNE: EUs locked-in with ISPs



#### Unique SPNE Exists.

- We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - 2. Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 3. Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N.
  - 4. Both ISPs active 3:
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on both ISPs.

### SPNE: Benchmark Case



- ▶ Both ISPs neutral.
- Unique SPNE Exists.
- ► We show that if an SPNE exists, it is of the form of one of the four possible SPNE strategies:
  - 1. Neutral ISP is driven out of the market:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP does not offer on ISP N.
  - 2. Both ISPs active 1:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - ⇒ CP does not offer on ISP N.
  - 3. Both ISPs active 2:
    - $\Rightarrow$  CP offers with premium quality  $(\tilde{q}_p)$  on ISP NoN.
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on ISP N.
  - 4. Both ISPs active 3:
    - $\Rightarrow$  CP offers with free quality  $(\tilde{q}_f)$  on both ISPs.

## Organization of the Talk



- ► Regulation on the Internet
- ► Introduction
- ► Model
- ► Sub-game Perfect Nash Equilibrium
- ▶ Numerical Results and Discussion

### Equilibrium Outcome



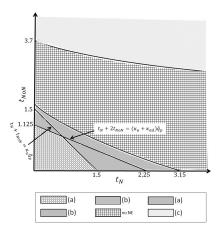
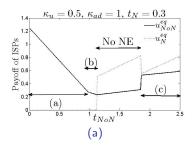


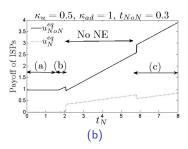
Figure: Equilibrium Outcome with  $\kappa_u = 1$  and  $\kappa_{ad} = 0.5$ 

▶ The SPNE is unique (if it exists) for each parameter set.

# Payoff of ISPs with respect to $t_N$ and $t_{NoN}$

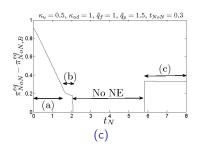


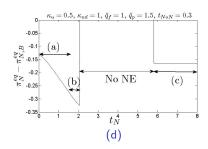




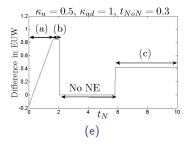
### Comparing the Payoffs of ISPs with Benchmark Case

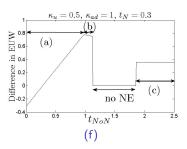




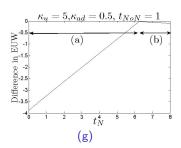


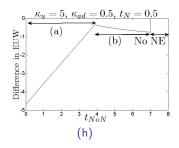
### Comparing the Welfare of EUs (EUW) with Benchmark (non-sensitive users Penn











## Summary of the Key Results - part I



- ▶ CP receives the same payoff in neutral and non-neutral regimes.
- Neutral ISP receives a lower payoff in a non-neutral regime.
- Non-neutral ISP receives a higher payoff (for most parameters).
  - ⇒ By switching to non-neutrality, ISP losses payoff if:
    - **EUs** not sensitive to the quality of the content (small  $\kappa_u$ )
    - ▶ The CP is not sensitive to the quality users receive (small  $\kappa_{ad}$ )
    - ▶ Not enough differentiation with free quality (small  $\tilde{q}_p$ )

## Summary of the Key Results - part II



- Non-neutral regime yields a higher welfare for EUs than a neutral one if:
  - ⇒ the market power of the ISP NoN is small,
  - ⇒ the sensitivity of EUs (respectively, the CP) to the quality is low (respectively, high), OR,
  - $\Rightarrow$  a combinations of these factors.

### Does the Market Need to be Regulated?



- ► It depends!
- Neutral ISPs are likely to forced out of the market.
  - ⇒ Regulator should provide incentives for the neutral ISPs (monetary subsidies or tax deductions).
- ▶ If non-neutral ISP losses profit by switching to non-neutrality:
  - ⇒ Non-neutrality is unlikely to emerge.
  - $\Rightarrow$  No need for a government intervention.



### Section 2.1:

## Uncertain Price Competition in a Duopoly Internet Market

- Mohammad Hassan Lotfi and Saswati Sarkar, "Uncertain price competition in a duopoly: Impact of heterogeneous availability of the commodity under sale", 50th Annual Allerton Conference, IEEE, 2012.
- Mohammad Hassan Lotfi and Saswati Sarkar, "Uncertain Price Competition in a Duopoly with Heterogeneous Availability", Revised and Submitted to IEEE Transaction on Automatic Control

#### Introduction



#### Previous works:

- Uncertainty in competition when the availability level is either zero or one.
- Sellers control the amount of units they produce- i.e. supply function auctions.
- ▶ In our work: Two ISPs, each selects the price based on:
  - ⇒ number of units of resources available for sponsoring
  - $\Rightarrow$  statistics of the availability process for her competitor  $\rightarrow$  uncertainty in competition
  - $\Rightarrow$  statistics of the demand of CPs  $\rightarrow$  uncertainty in demand

### Introduction



- Previous works:
  - Uncertainty in competition when the availability level is either zero or one.
  - Sellers control the amount of units they produce- i.e. supply function auctions.
- ▶ In our work: Two ISPs, each selects the price based on:
  - ⇒ number of units of resources available for sponsoring
  - $\Rightarrow$  statistics of the availability process for her competitor  $\rightarrow$  uncertainty in competition
  - $\Rightarrow$  statistics of the demand of CPs  $\rightarrow$  uncertainty in demand



- ► Mixed strategy of each ISP is a vector of probability distributions each element representing an availability level.
  - $\Rightarrow$  For instance: ISP offers 3 units, strategy= $(\Phi_1(.), \Phi_2(.), \Phi_3(.))$ .
- ► An integer number of CPs.
- ► CPs shop around for the lowest available prices.
- ► ISPs maximize the payff:
  - Payoff = Price per Resource × Expected Number of Resources Sponsored
- ▶ Classic theorems for existence and uniqueness of NE cannot be used.



- ► Mixed strategy of each ISP is a vector of probability distributions each element representing an availability level.
  - $\Rightarrow$  For instance: ISP offers 3 units, strategy= $(\Phi_1(.), \Phi_2(.), \Phi_3(.))$ .
- ► An integer number of CPs.
- ► CPs shop around for the lowest available prices.
- ► ISPs maximize the payff:
  - Payoff = Price per Resource × Expected Number of Resources Sponsored
- Classic theorems for existence and uniqueness of NE cannot be used.



#### Theorem (Limited Necessary Conditions)

If demand is greater than the maximum possible number of available unit, then every NE satisfies a set of properties:

- ► ISPs select price using probability distributions whose support sets are mutually disjoint, contiguous and in decreasing order of the number of availability.
  - ⇒ The higher the availability level, the lower the price per unit.
  - ⇒ Algorithm to explicitly compute such strategies.

Theorem (General Necessary Conditions for a Symmetric Market)

The necessary properties are necessary conditions for a symmetric NE in a symmetric market, regardless of the demand.



#### Theorem (Limited Necessary Conditions)

If demand is greater than the maximum possible number of available unit, then every NE satisfies a set of properties:

- ► ISPs select price using probability distributions whose support sets are mutually disjoint, contiguous and in decreasing order of the number of availability.
  - ⇒ The higher the availability level, the lower the price per unit.
  - ⇒ Algorithm to explicitly compute such strategies.

#### Theorem (General Necessary Conditions for a Symmetric Market)

The necessary properties are necessary conditions for a symmetric NE in a symmetric market, regardless of the demand.



#### Theorem (General Sufficiency Conditions)

Every strategy that satisfies the necessary properties is an NE regardless of the demand.

- ► Necessary and Sufficient:
  - ⇒ Symmetric
  - ⇒ Asymmetric & demand>maximum availability
- ► Only Sufficient:
  - ⇒ Asymmetric & demand≤maximum availability
- ► Unique NE: symmetric setting
- ► Multiple Nash equilibria: asymmetric setting



#### Theorem (General Sufficiency Conditions)

Every strategy that satisfies the necessary properties is an NE regardless of the demand.

- Necessary and Sufficient:
  - ⇒ Symmetric
  - ⇒ Asymmetric & demand>maximum availability
- ► Only Sufficient:
  - ⇒ Asymmetric & demand≤maximum availability
- ► Unique NE: symmetric setting
- ► Multiple Nash equilibria: asymmetric setting



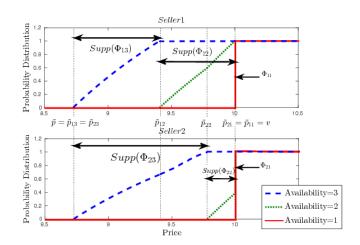
#### Theorem (General Sufficiency Conditions)

Every strategy that satisfies the necessary properties is an NE regardless of the demand.

- Necessary and Sufficient:
  - ⇒ Symmetric
  - ⇒ Asymmetric & demand>maximum availability
- ► Only Sufficient:
  - ⇒ Asymmetric & demand≤maximum availability
- ▶ Unique NE: symmetric setting
- ▶ Multiple Nash equilibria: asymmetric setting

# Results: An Example for an Asymmetric Market





# Generalizations and Applications



- Proposed a heuristic set of strategies for sellers in a symmetric oligopoly, satisfying mentioned properties.
- Numerical results reveal that the strategy is a fairly good approximation of NE.
- Model can be also used in microgrid networks, primary/secondary markets.

### References I





M. H. Lotfi, S. Sarkar, "Uncertain Price Competition in a Duopoly with Heterogeneous Availability, IEEE Transaction on Automatic Control (TAC)", April 2016.



M. H. Lotfi, S. Sarkar, K. Sundaresan, M. A. Khojastepour, "The Economics of Quality Sponsored Data in Wireless Networks", Under Review, IEEE Transaction on Networking (TON), 2016.



M. H. Lotfi, G. Kesidis, and S. Sarkar, and Saswati Sarkar, "Does Non-neutrality Profitable for Stake-holders of the Market - Part I", To be submitted to TON.



M. H. Lotfi, G. Kesidis, and S. Sarkar, "Does Non-neutrality Profitable for Stake-holders of the Market - Part II", To be submitted to TON.



M. H. Lotfi, S. Sarkar, G. Kesidis, "Migration to a Non-Neutral Internet: Economics Modelling and Analysis of Impact", CISS, Princeton, NJ, March 2016.



M. H. Lotfi, K. Sundaresan, M. A. Khojastepour, S. Ranjarajan, "The Economics of Quality Sponsored Data in Wireless Networks", Wiopt, Mumbai, India, May 2015.



M. H. Lotfi, G. Kesidis, S. Sarkar, "Market-Based Power Allocation for a Differentially Priced FDMA System", ISIT, Honululu, HI, 2014.

## References II





Mohammad Hassan Lotfi, George Kesidis, and Saswati Sarkar, "Network Non-Neutrality on the Internet: Content Provision Under a Subscription Revenue Model", NetEcon , 2014.



M. H. Lotfi, S. Sarkar, "Uncertain Price Competition in a Duopoly: Impact of Heterogeneous Availability of the Commodity under Sale", Allerton, 2012.



# Thanks!