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Conclusions

Efficient Spectrum Allocation and Auction for Wireless Networks

XiangYang Li¹ xli@cs.iit.edu

¹Department of Computer Science Illinois Institute of Technology

April 6, 2009

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Organization of Talk I



Introduction

- Spectrum Scarcity
- 2 System Model
 - Bidding Model
 - Offline Model
 - Online Model

3 Instantaneous Requests

- Known Time Ratio
 - 0 < β < 1</p>
 - *β* > 1
 - $\beta \beta = 1$
- Other Known Info
- Experiments



Non-instantaneous Requests

Efficient Methods

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Conclusions

Organization of Talk II

- Non-instantaneous requests with $\beta = 1$
- Non-instantaneous requests with $\beta > 1$
- Upperbounds
 - β = 1
 - β > 1
- Experiments



The results presented here are collaborated with my student Ping Xu at IIT.

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Conclusions

Widespread of Wireless Devices: Need Spectrum



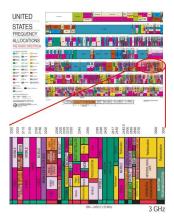
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Conclusion

Traditionally: Fixed Spectrum Allocation



- Fixed spectrum allocation traditionally;
- ISM band: industrial, scientific and medical (ISM) radio bands.
 - WLAN: Bluetooth, 802.11
 - Cordless phones
 - RFID

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Pros and Cons of Fixed Allocation

Pros: easy to manage

Cons: White Space (spectral, temporal, and spatial)
 Even in more congested areas, there is still ample space ¹

- Dallas 40 percent
- Boston 38 percent
- Seattle 52 percent
- San Francisco 37 percent.

¹from www.tvtechnology.com

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More Spectrum By Technology Changes

The planned switchover to digital television may free up large areas between **54MHz** and **698MHz**.

 "Battle Heats Up for TV Spectrum White Space Use" – WIMAX.com

On November 4, 2008 the FCC: unlicensed and free use of TV white space frequencies for all.

Exact amount depends on

- Broadcast TV channels going on and off the air
- Wireless microphone users registering for protected status
- Ochanges in White Space rules and regulations

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Conclusions

New Spectrum Usage Technologies

To improve spectrum usage:

- Dynamic Spectrum Allocation: allocated when needed
- Opportunistic Spectrum Usage: use it when no interference
 - Software defined radio,
 - Cognitive Radio (Licensed Band Cognitive Radio and Unlicensed Band Cognitive Radio)

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New Spectrum Usage Technologies

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- Dynamic Spectrum Allocation: allocated when needed
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Challenges of opportunistic spectrum usage:

How to deal with selfish behavior?

Need combine game theory with wireless communication modeling

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Conclusions

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- Market Driven Approach: short-term lease, users bid for spectrum usage.

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Market Driven Approach

Construct an allocation/auction to assign spectrum

- Auctioneer: central authority represents primary users
- Bidders: secondary users, selfish but rational
- We need determine winners and payments with objectives
 - Maximize the social efficiency total valuation of winners, or
 - Maximize the revenue total payment collected from bidders.

System Model

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Conclusions

Models, models, and models, ©

What is our network model, the bidding model and more....

System Model

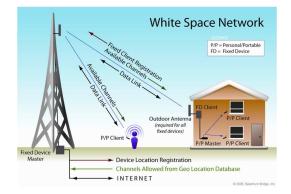
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Conclusions

Bidding and Network Model

Primary user $\ensuremath{\mathcal{U}}$ who holds the right of some spectrum channels



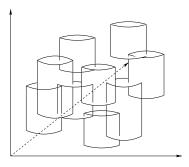
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Conclusions

Time-Space model for Single Channel



- secondary users $\mathcal{V} = \{v_1, v_2, \cdots, v_n\}$ who wants to lease the right of some spectrum channels
 - arrived at time a_i
 - in some geometry region
 D(v_i, r_i)
 - for some time period T_i
 - for some frequencies *F_i*
 - with bid b_i ,

In summary, a bidding by a user

 v_i can be written as follows

$$B_i = [b_i, a_i, F_i, D(v_i, r_i), T_i]$$

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Objective of Spectrum Allocation/Auction

Find an allocation of spectrum to users, which must be

- conflict free in geometry region, time period and frequencies
- maximize the social efficiency $\sum_{i=1}^{m} x_i b_i$, where b_i is the true valuation if the mechanism is truthful.

This problem is obviously NP-hard.

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Conclusions

When should we make decisions?

The decisions could be

- offline: make decisions after know all requests;
- online: make decisions when requests arrived.

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Conclusion

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Conclusions

Next:

Offline allocation model: knows everything.

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Conclusions

Problem Formulation of Offline Model

For notational convenience, we use CRT to denote a version of problem, where

- Channel requirement
 - S(single-minded), F(flexible-minded), Y(single channel)
- Region requirement
 - O(overlap), U(unit disks), G(general regions)
- Time requirement
 - I(time interval), D(time duration), M(time interval or duration)

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Conclusions

Example of An Offline Spectrum Allocation Problem

For example, problem SUI represents

- Channel requirement: Single-minded all or nothing
- Region requirement: Unit Disks
- Time requirement: Interval of a time period.

System Model

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- Problem YOI ⇒ maximum weighted independent set problem in interval graphs.
- Problem YOD \Rightarrow knapsack problem.
- Problem YGI with e_i − s_i ≥ T/2 for each secondary user i ⇒ maximum weighted independent set problem of a disk graph
- Problem YUD ⇒ multi-knapsack problem is a special case
- problem SOI with e_i − s_i ≥ T/2 for each secondary user i ⇒ set packing problem.

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Hardness of Offline Allocation

Thus, offline spectrum allocation is NP-hard.

When users required for some subsets of spectrums, no algorithm can achieve ratio $o(\sqrt{m})$ for social efficiency. *m* is the total number of channels.

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Conclusions

Our Results: Offline Spectrum Allocation

When we can make decisions offline, we have, for

- problem YOM: 1/2 approximation algorithm
- problem YUI: PTAS
- problem YUD: 1/9 approximation algorithm
- problem YUM: 1/10 approximation algorithm
- problem SUI: $\Theta(\sqrt{m})$ approximation algorithm
- Problem SUD: open
- Problem SUM: solved if SUD solved

System Model

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Conclusions

Our Results: Offline Spectrum Auction

What happen if users are selfish?

Based on these methods, we designed truthful mechanisms:

- Incentive Compatibility: bidding truthfully is a best choice, regardless of what others do
- Individual Rationality: bidding truthfully has non-negative profit

Here we assume that agents only manipulate bid values.

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Offline is almost solved (not completely, ©);

What will happen if the requests come online and decisions have to be made soon?

⇒ Online Spectrum Allocation and Auction, ☺

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Online Spectrum Allocation Problem

Challenges:

what we will get in future?

- should we admit current request(s)?
- what if no spare channels, but we have a bid too good to give up?
- How much should every user be charged?

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Conclusions

Measure Performance of Online Algorithms

Definition (Competitive Ratio)

$$arrho(\mathcal{A}) = \min_{\mathcal{I}} rac{\mathcal{A}(\mathcal{I})}{\mathsf{OPT}(\mathcal{I})}, ext{ where }$$

- I is any possible sequence of requests arrival,
- A(I) is the profit produced by online algorithm A on I,
- OPT(I) is the profit produced by optimum offline algorithm OPT on I when I is known in advance by OPT.

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Conclusions

Nothing is Known About Requests

Theorem

If we know **nothing** about future requests, we **cannot** guarantee any competitive ratio of any online spectrum allocation method.

Adversary model:

$$e_1 = (2, 0, 2)$$

$$\mathbf{e} = (M, 1, \Delta)$$

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Something Must Be Known about Spectrum Requests

In this talk, we assume that one of the following is known

- *time-ratio* Δ : the maximum time requirement by any job is Δ time slots while the minimum one is 1 time slot, $t_i \in [1, \Delta]$.
- bid-ratio B: B is defined as the ratio of maximum bid value to the minimum one, *i.e.*, D = max_{i,j} b_i/b_j.
- *bid density ratio D*: The density d_i of each request e_i is defined as $\frac{b_i}{t_i}$. *D* is defined as the ratio of maximum density to minimum one among all jobs, *i.e.*, $D = \max_{i,j} d_i/d_j$.

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Conclusions

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Preemption or Non-preemption?

If non-preemption, will such known info (time-ratio, bid-ratio, or bid density ratio) be enough for good competitive ratio?

- Known time-ratio Δ,
 - $\mathbf{e}_1 = (b_1 = 1, s_1 = 1, t_1 = 2), \mathbf{e}_2 = (b_2 = \infty, s_2 = 2, t_2 = \Delta)$

• bid-ratio B

• bid density ratio D

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Conclusions

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Preemption or Non-preemption?

If non-preemption, will such known info (time-ratio, bid-ratio, or bid density ratio) be enough for good competitive ratio?

• X known time-ratio Δ , $\mathbf{e}_1 = (b_1 = 1, s_1 = 1, t_1 = 2), \mathbf{e}_2 = (b_2 = \infty, s_2 = 2, t_2 = \Delta)$

bid-ratio B

 $\mathbf{e}_1 = (b_1 = 1, s_1 = 1, t_1 = \infty), \\ \mathbf{e}_2 = (b_2 = B, s_2 = 2, t_2 = 1), \cdots \\ \mathbf{e}_n = (b_n = B, s_n = n, t_n = 1)$

• bid density ratio D

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Preemption or Non-preemption?

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- ♦ Known time-ratio △,
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- 🗡 bid-ratio B
- Solution bid density ratio D

 $\mathbf{e}_1 = (b_1 = 2, s_1 = 1, t_1 = 2), \\ \mathbf{e}_2 = (b_2 = D\Delta, s_2 = 2, t_2 = \Delta)$

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Conclusions

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★ bid density ratio D
 e₁ = (b₁ = 2, s₁ = 1, t₁ = 2),
 e₂ = (b₂ = DΔ, s₂ = 2, t₂ = Δ)

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Conclusions

Thus, without preemption, the competitive ratio of any online method could be arbitrarily bad (even know some other info).

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Conclusions

Need good online method?

To get bounded worst case competitive ratio, we need

- Preemption, and
- some other additional info about time-ratio, bid-ratio, or bid-density ratio

Is Preemption Free?

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Need good online method?

To get bounded worst case competitive ratio, we need

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- Is Preemption Free?
 - √ Free: admit the best current choice (simple, ⓒ)
 - Not-Free: need pay penalty for preempting a spectrum usage.

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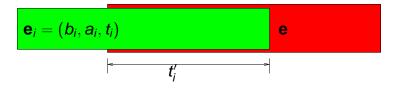
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Introduction System Model Instantaneous Requests Non-instantaneous Requests Conclus

How much should we compensate?



First assume that the preempted spectrum usage is compensated with

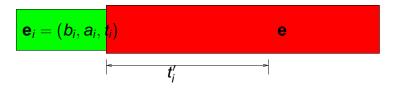
$$\gamma(b_i, t_i, t_i') = \beta \frac{t_i'}{t_i} b_i$$

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for a constant $\beta > 0$. Here

- t'_i is the unserved timeslots of user i
- t_i is the requested timeslots of user i
- *b_i* is the bid by *i*

How much should we compensate?



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Conclusion

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Efficient Methods and Upper bounds

Assume that we know the time-ratio Δ only

- 0 ≤ β < 1</p>
- β > 1
- β = 1

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Conclusions

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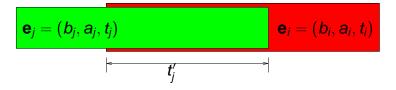
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Non-instantaneous Requests

Conclusions

 $0 \le \beta < 1$: Simple Greedy



Greedy Algorithm $\mathcal{G}_{<1}$

- Select the request e_i which has the largest bid among all coming requests that arrive at time t.
- If channel is empty, satisfy e_i; Otherwise, satisfy e_i by preempting current request.

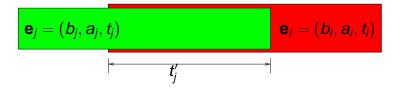
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Instantaneous Requests

Conclusions

It is Competitive



- At each time a_j, algorithm G_{<1} makes at least (1 β)b_j profit.
- On the other hand, the optimal algorithm makes at most b_j at each time a_j since b_j is the largest bid at that time.
- Therefore, $\mathcal{G}_{<1}$ is (1β) -competitive.

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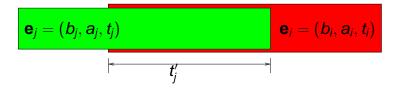
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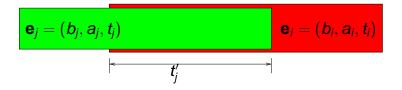
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Instantaneous Requests

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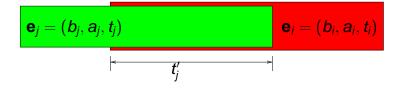
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Efficient Methods and Upper bounds

Assume that we know the time-ratio Δ only

- 0 ≤ β < 1</p>
- $\beta > 1$
- β = 1





Greedy Algorithm $\mathcal{G}_{>1}$

- 1: If the channel is empty, **e**_i will be satisfied anyway.
- 2: If channel is being used by a request **e**_{*j*}, **e**_{*i*} preempts **e**_{*j*} only if

$$b_i \geq 2\gamma(b_j, t_j, t_j')$$

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Conclusions

Competitive Ratio of $\mathcal{G}_{>1}$ when $\beta > 1$

Theorem

Algorithm $\mathcal{G}_{>1}$ is $\frac{1}{4\beta}\Delta^{-1}$ -competitive.

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Conclusions

When $\beta > 1$, what is the upper bound on competitive ratio of any deterministic method?

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Performance Upper Bound

Theorem

There is no online algorithm with competitive ratio more than $\frac{2\beta}{(\beta-1)^2}\Delta^{-1}$ when $\beta > 1$.

Recall that our algorithm $\mathcal{G}_{>1}$ has competitive ratio

$$\frac{1}{4\beta}\Delta^{-1}$$
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Conclusions

Performance Upper Bound ($\beta > 1$)

$$\bm{e}=(\bm{1},\bm{0},\bm{\Delta})$$



Figure: Requests arrive at/before time 1

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$$\mathbf{e}_1 = (\beta \frac{\Delta - 1}{\Delta} - 1, 1, 1).$$

Central Authority has to accept **e** and reject \mathbf{e}_1

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Conclusions

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Performance Upper Bound ($\beta > 1$)

$$\bm{e}=(1,0,\Delta)$$

Figure: Requests arrive at/before time 2

 $\mathbf{e}_2 = (\beta \frac{\Delta - 2}{\Delta} - 1, 2, 1).$ Central Authority has to reject \mathbf{e}_2 .

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Performance Upper Bound ($\beta > 1$)

$$\bm{e}=(\bm{1},\bm{0},\bm{\Delta})$$



Figure: Requests arrive at/before time i

$$\mathbf{e}_i = (\beta \frac{\Delta-i}{\Delta} - 1, i, 1).$$

Central Authority has to reject \mathbf{e}_i .

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Conclusions

Performance Upper Bound ($\beta > 1$)

$$\mathbf{e} = (\mathbf{1}, \mathbf{0}, \Delta)$$



Figure: Requests arrive at/before time *i*

Any online algorithm makes at most 1 profit, while the optimal offline algorithm makes $\sum_{i=0}^{\frac{\beta-1}{\beta}\Delta} \beta \frac{\Delta-i}{\Delta} - 1 = \frac{(\beta-1)^2}{2\beta}\Delta - \frac{\beta-1}{2}$. The competitive ratio is no more than $\frac{2\beta}{(\beta-1)^2}\Delta^{-1}$.

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Conclusion

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Efficient Methods and Upper bounds

Assume that we know the time-ratio Δ only

- 0 ≤ β < 1</p>
- β > 1
- $\beta = 1$

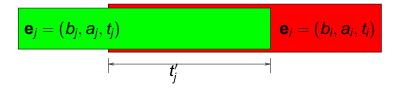
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Conclusio

What to preempt?



Two possible preemption scenarios:

- the bid of new request is much larger;
- even the new request is later preempted after only one time slot, the profit made is not small, compared with its bid and bids of preempted requests.

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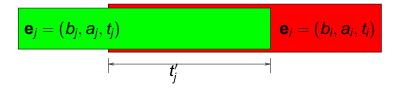
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Efficient Online Spectrum Allocation with $\beta = 1$

Greedy Algorithm $\mathcal{G}_{\mathcal{T}}$ With Constant c > 1

- 1: If the channel is empty, \mathbf{e}_i will be satisfied anyway.
- If the channel is being used by other request **e**_j, **e**_i preempts **e**_j if and only if

 $egin{aligned} & \mathbf{Strong} \ \mathbf{Preemption:} \quad b_i \geq m{c} \cdot m{b}_j \ \mathrm{or} \ & \mathbf{Weak} \ \mathbf{Preemption:} \quad & rac{b_i}{t_i} + \left(b_j - \gamma(b_j, t_j, t_j')
ight) > \Delta^{-rac{1}{2}} b_j \end{aligned}$

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Conclusions

Performance Analysis

Theorem

Algorithm
$$\mathcal{G}_{\mathcal{T}}$$
 is $\frac{c-1}{2c(c+2)}\Delta^{-\frac{1}{2}}$ -competitive.

When $c = 1 + \sqrt{3}$, competitive ratio is maximized at

$$\frac{\sqrt{3}}{12+8\sqrt{3}}\Delta^{-\frac{1}{2}}.$$

When $\beta = 1$, what is the upper bound on competitive ratio of any deterministic method?

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Conclusions

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Performance Upper Bound: First Try

Theorem

There is no online algorithm with competitive ratio more than $2\Delta^{-\frac{1}{3}}$.

We will prove by adversary model.

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Conclusions

Performance Upper Bound ($\beta = 1$): First Try

$$\mathbf{e} = (\mathbf{1}, \mathbf{0}, \Delta)$$



Figure: Requests arrive at/before time 0

$$\mathbf{e}_1 = (2\Delta^{-\frac{1}{3}}, 0, 1).$$

Central Authority has to accept **e** and reject \mathbf{e}_1

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Conclusions

Performance Upper Bound ($\beta = 1$): First Try

$$\mathbf{e} = (\mathbf{1}, \mathbf{0}, \Delta)$$



Figure: Requests arrive at/before time 1

$$\mathbf{e}_2 = (2\Delta^{-\frac{1}{3}} - \frac{1}{\Delta}, 1, 1).$$

Central Authority has to reject \mathbf{e}_2 .

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Performance Upper Bound ($\beta = 1$): First Try

$$\bm{e}=(\bm{1},\bm{0},\bm{\Delta})$$



Figure: Requests arrive at/before time 2

 $\mathbf{e}_3 = (2\Delta^{-\frac{1}{3}} - \frac{2}{\Delta}, 2, 1).$ Central Authority has to reject \mathbf{e}_3 .

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Conclusions

Performance Upper Bound ($\beta = 1$): First Try

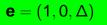




Figure: Requests arrive at/before time i - 1

 $\mathbf{e}_i = (2\Delta^{-\frac{1}{3}} - \frac{i-1}{\Delta}, i-1, 1).$ Central Authority has to reject \mathbf{e}_i .

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Conclusions

Performance Upper Bound ($\beta = 1$): First Try

$$\mathbf{e} = (\mathbf{1}, \mathbf{0}, \Delta)$$





Figure: Requests arrive at/before time i - 1

Any online algorithm makes at most 1 profit, while the optimal offline algorithm makes $\sum_{i=0}^{2\Delta^{\frac{2}{3}}} (2\Delta^{-\frac{1}{3}} - \frac{i}{\Delta}) = 2\Delta^{\frac{1}{3}} + \Delta^{-\frac{1}{3}}$. The competitive ratio is no more than $2\Delta^{-\frac{1}{3}}$.

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Performance Upper Bound ($\beta = 1$): Second Try

Theorem

There is no online algorithm with competitive ratio more than $\frac{1}{\rho}$ for constant ρ with $\frac{1}{2}\Delta^{\frac{1}{3}} \leq \rho < \frac{\sqrt{2}}{2}\Delta^{\frac{1}{2}}$.

Thus, the best competitive ratio, for eta= 1, is

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Recall that, our algorithm achieved

$$\frac{\sqrt{3}}{12+8\sqrt{3}}\Delta^{-\frac{1}{2}}.$$

We will prove by adversary model

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Conclusions

Performance Upper Bound ($\beta = 1$): Second Try

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Conclusions

Performance Upper Bound ($\beta = 1$): Second Try

$$\mathbf{e} = (\mathbf{1}, \mathbf{0}, \Delta)$$



Figure: Requests arrive at/before time k - 1

Similarly, all online algorithm will reject $\mathbf{e}_i = (2\Delta^{-\frac{1}{3}} - \frac{i-1}{\Delta}, i-1, 1)$ for $i = 1, \dots, k$. Here *k* is the smallest integer such that $\sum_{i=1}^{k} b_i = S_k > 1$.

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Conclusions

Performance Upper Bound ($\beta = 1$): Second Try

$$\bm{e}=(\bm{1},\bm{0},\bm{\Delta})$$



Figure: Requests arrive at/before time k

Central authority has to reject
$$\mathbf{e}_{k+1}$$
 while $b_{k+1} + \frac{k}{\Delta} < \frac{1}{\rho}(S_k + b_{k+1})$.
 $b_{k+1} = \frac{1}{\Delta} + \frac{\sqrt{\Delta^2 - 2\rho^2 \Delta}}{\rho \Delta}$ is a feasible value.

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Conclusions

Performance Upper Bound ($\beta = 1$): Second Try

 $\mathbf{e} = (\mathbf{1}, \mathbf{0}, \Delta)$

$$\mathbf{e}_1$$
 \mathbf{e}_2 \mathbf{e}_3 \cdots \mathbf{e}_k \mathbf{e}_{k+1} \cdots \mathbf{e}_p

Figure: Requests arrive at/before time p-1

Central authority has to reject \mathbf{e}_{ρ} while $b_{\rho} + \frac{p-1}{\Delta} < \frac{1}{\rho}(S_{k} + \sum_{i=k+1}^{p-1} b_{i}).$ It can be proved by induction that $b_{i} \ge b_{k+1} = \frac{1}{\Delta} + \frac{\sqrt{\Delta^{2} - 2\rho^{2}\Delta}}{\rho\Delta}$ for all $i \ge k+1$.

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Conclusions

Performance Upper Bound: Second Try

 $\mathbf{e} = (\mathbf{1}, \mathbf{0}, \Delta)$



Figure: Requests arrive at/before time p-1

Any online algorithm makes at most 1 profit, while the optimal *offline* algorithm makes at least

$$(\Delta - k)b_{k+1} \ge (\Delta - k)(\frac{1}{\Delta} + \frac{\sqrt{\Delta^2 - 2\rho^2 \Delta}}{\rho \Delta}).$$

This profit is always larger than ρ when $\frac{1}{2}\Delta^{\frac{1}{3}} \le \rho < \frac{\sqrt{2}}{2}\Delta^{\frac{1}{2}}.$

If we know some other information instead?

- Know the bid ratio B only: design asymptotically optimum method;

If we know some other information instead?

- Know the bid ratio B only: design asymptotically optimum method;
- Know the bid density ratio D only: design asymptotically optimum method;

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Conclusions

With other known info: Bid Ratio B

When $\beta = 1$,

- O Designed a method with competitive ratio $\frac{1}{1+B}$.
- 2 Showed that no method guarantees competitive ratio $> \frac{1}{R}$.

When $\beta > 1$, no method can guarantee any ratio.

With other known info: Bid Ratio B

When $\beta = 1$,

Designed a method with competitive ratio 1+B.

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Conclusions

With other known info: Bid Density Ratio D

When $\beta = 1$,

- O Designed a method with competitive ratio $\frac{1}{1+D}$.
- 2 Showed that no method guarantees competitive ratio $> \frac{2}{D}$.

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Conclusions

With other known info: Bid Density Ratio D

When $\beta > 1$,

- O Designed a method with competitive ratio $\frac{1}{2(\beta+D)}$.
- Showed that no method guarantees competitive ratio $> \frac{2\beta}{(\beta-1)D}$.

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Conclusions

More General Penalty Function

We also study the case when the penalty function

$$\gamma(b_i, t_i, t_i') = (\alpha + \beta \frac{t_i'}{t_i})b_i$$

We designed asymptotically optimum methods for

$$1 \alpha + \beta < 1$$

$$2 \ \alpha + \beta = 1$$

$$a + \beta > 1$$

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Conclusions

Experiments Setup

In our experiment, we generate random requests with random bid, time or density requirements.

- uniformly pick $t_i \in [1, \Delta]$
- **2** bid $b_i \in [1, 10000]$.

For algorithm $\mathcal{G}_{\mathcal{B}}$,

• bid randomly in [1, B], and time $t_i \in [1, 1000]$.

For algorithm $\mathcal{G}_{\mathcal{D}}$,

• bid randomly in $[1, \lfloor \sqrt{D} \rfloor]$ and time $t_i \in [1, \lfloor \sqrt{D} \rfloor]$.

System Model

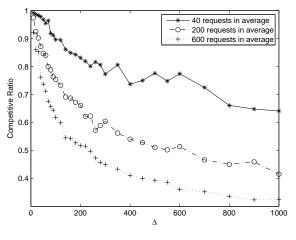
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Conclusions

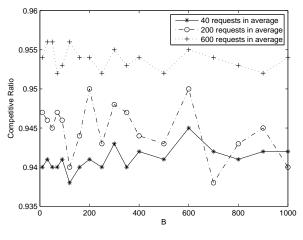
The Achieved Competitive Ratio $\mathcal{G}_{\mathcal{T}}$



(a) Algorithm $\mathcal{G}_{\mathcal{T}}$,

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The Achieved Competitive Ratio $\mathcal{G}_{\mathcal{B}}$



(b) Algorithm $\mathcal{G}_{\mathcal{B}}$

System Model

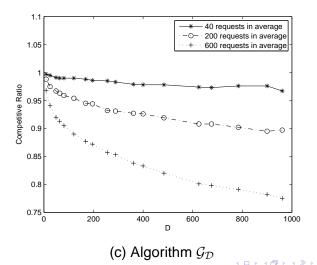
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The Achieved Competitive Ratio $\mathcal{G}_{\mathcal{D}}$



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Conclusions

Non-instantaneous Requests

So far, we assumed that

- Each request arrived at time a_i, asked for t_i timeslots starting from a_i.
- The request thus must be immediately processed.

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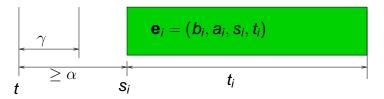
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Non-instantaneous Requests

In rest of talk, we assume that

- Each request arrived at time *a_i*, asked for *t_i* timeslots starting from *s_i* with *s_i* ≥ *a_i* + *α*.
- The request should be processed within γ .

We call it (β, α, γ) problem.



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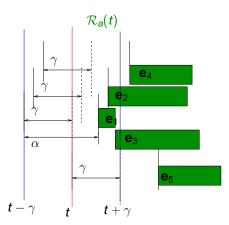
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Conclusions

What do we know at time t?

All requests $\mathcal{R}_a(t)$



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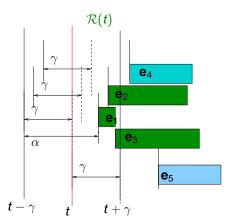
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Conclusions

What do we know at time *t*?

All requests $\mathcal{R}(t) \subseteq \mathcal{R}_{a}(t)$



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Conclusions

Candidate Requests Set

Definition (Strong Candidate Requests Set)

A strong candidate requests set at time t, denoted as $C_1(t)$, is a subset of requests from $\mathcal{R}(t)$ that has the largest total bids if $C_1(t)$ is allowed to run without preemption, from time $t - \gamma + \alpha$ to timeslots at most $t + \alpha + \Delta$.

For set $C_1(t)$, let $\mathcal{P}(C_1(t), t')$ denote the profit made from $C_1(t)$ if these requests are admitted and then possibly being preempted at a time-slot t'.

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Conclusions

Candidate Requests Set

Definition (Weak Candidate Requests Set)

A weak candidate requests set at time t, denoted as $C_2(t)$, is a subset of requests from $\mathcal{R}(t)$ that has the largest total bids if $C_2(t)$ is allowed to run during time interval $[t - \gamma + \alpha, t + \alpha]$ (thus, these requests may be preempted by some requests started on time-slot $t + \alpha + 1$).

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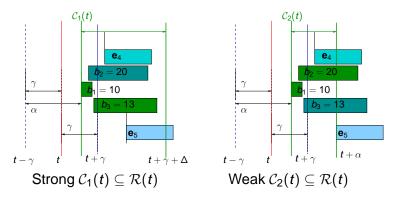
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Conclusions

Candidate Requests Sets

candidate requests sets $C_1(t), C_2(t) \subseteq \mathcal{R}(t)$



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Conclusions

Efficient Methods

for β = 1 for β > 1

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Conclusions

Efficient Methods

for β = 1 for β > 1

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Conclusions

Efficient Methods for $\beta = 1$

Input: A constant parameter $c_1 > 1$, an adjustable control parameter $c_2 > 0$, $C_1(t)$, and $C_2(t)$.

Current candidate requests set C from time t' < t. Here $C = C_1(t')$ if $C_1(t')$ strongly preempted others, or $C = C_2(t')$ if $C_2(t')$ strongly preempted others.

Output: new current candidate requests set C.

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Efficient Methods for $\beta = 1$

- 1: if $C = C_2(t')$ then
- 2: if $t t' \ge \gamma$ then
- 3: $\mathcal{C} = \emptyset;$

4: **else**

- 5: Accept earliest request $\mathbf{e}_i \in C_2(t)$
- 6: if $C = C_1(t')$ or \emptyset then

7: if
$$\mathcal{C}_1(t) \geq c_1 \cdot \mathcal{C}_1(t')$$
 then

- 8: $C = C_1(t)$; Accept earliest request $\mathbf{e}_i \in C_1(t)$
- 9: else if $\mathcal{C}_2(t) + \mathcal{P}(\mathcal{C}_1(t'), t) \geq c_2 \cdot \mathcal{C}_1(t)$ then
- 10: $C = C_2(t)$; Accept earliest request $\mathbf{e}_i \in C_2(t)$
- 11: **else**
- 12: Accept request $\mathbf{e}_i \in C_1(t')$ such that $s_i = t \gamma + \alpha$.

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Conclusions

Competitive Ratio when $\beta = 1$

Theorem

Algorithm \mathcal{G} is $\Theta(\sqrt{\gamma+1}\Delta^{-\frac{1}{2}})$ -competitive when $\gamma = O(\Delta)$.

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Conclusions

Efficient Methods

for β = 1 for β > 1

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Conclusions

Efficient Online Method \mathcal{H} when $\beta > 1$

Input: A constant parameter $c > 1 + \beta$, γ , α , Δ , $\mathcal{R}_a(t)$, $\mathcal{R}(t)$, $\mathcal{C}_1(t)$. Previous *current candidate requests set* $\mathcal{C} = \mathcal{C}_1(t')$ where t' < t. Here $\mathcal{C}_1(t')$ may be empty.

Output: whether requests submitted at time $t - \gamma$ will be admitted and new *current candidate requests* set C.

1: if
$$\mathcal{C}_1(t) \geq c \cdot \mathcal{C}_1(t')$$
 then

$$2: \quad \mathcal{C} = \mathcal{C}_1(t);$$

3: Accept request $\mathbf{e}_i \in C_1(t)$ such that $a_i = t - \gamma$.

4: else

5: Accept request $\mathbf{e}_i \in C_1(t')$ such that $a_i = t - \gamma$.

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Conclusions

Competitive Ratio

Theorem

Algorithm
$$\mathcal{H}$$
 is $\frac{(c-\beta-1)}{c^2} \frac{\gamma+1}{\Delta+\gamma+1}$ competitive.

When $\gamma = a\Delta - 1$, it is easy to show that

Theorem

Method \mathcal{H} has a competitive ratio at least, by choosing $c = 2(1 + \beta)$, $\frac{a}{4(1 + a)(1 + \beta)}$.

Upper bounds

What is the best we can do?



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Conclusions

Performance Upper Bound ($\beta = 1$): First Try

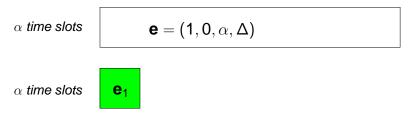


Figure: Requests arrive at/before time 0

$$\mathbf{e}_1 = (\sqrt[3]{2(\gamma + 1)}\Delta^{-\frac{1}{3}}, \mathbf{0}, \alpha, 1).$$

Central Authority has to accept \mathbf{e} and reject \mathbf{e}_1 .

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Conclusions

Performance Upper Bound ($\beta = 1$): First Try

$$\alpha \text{ time slots} \qquad \mathbf{e} = (\mathbf{1}, \mathbf{0}, \alpha, \Delta)$$

$$\alpha \text{ time slots} \qquad \mathbf{e}_1 \quad \gamma \text{ time slots} \quad \mathbf{e}_2$$

Figure: Requests arrive at/before time $\gamma + 1$

$$\mathbf{e}_2 = (\sqrt[3]{2(\gamma+1)}\Delta^{-\frac{1}{3}} - \frac{\gamma+1}{\Delta}, \gamma+1, \gamma+1+\alpha, 1).$$

Central Authority has to reject \mathbf{e}_2 .

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Conclusions

Performance Upper Bound ($\beta = 1$): First Try

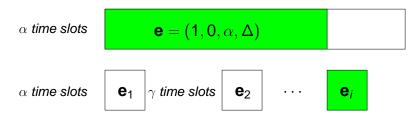


Figure: Requests arrive at/before time $(i - 1)(\gamma + 1)$

 $\mathbf{e}_i = (\sqrt[3]{2(\gamma+1)}\Delta^{-\frac{1}{3}} - \frac{(i-1)(\gamma+1)}{\Delta}, (i-1)\gamma+1, (i-1)(\gamma+1)+\alpha, 1).$ Central Authority has to reject \mathbf{e}_i .

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Performance Upper Bound ($\beta = 1$): First Try

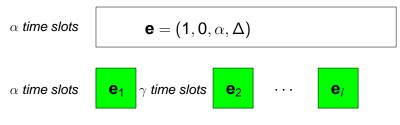


Figure: Requests arrive at/before time $(i - 1)(\gamma + 1)$

Any online algorithm makes at most 1 profit, while the optimal offline algorithm makes $\sum_{i=1}^{n} b_i \ge \frac{\Delta^{\frac{1}{3}}}{\sqrt[3]{2(\gamma+1)}}$ profit $(b_n > 0)$. The competitive ratio is no more than $\sqrt[3]{2(\gamma+1)}\Delta^{-\frac{1}{3}}$.

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Conclusions

Performance Upper Bound ($\beta = 1$): Second Try

 α time slots

$$\mathbf{e} = (\mathbf{1}, \mathbf{0}, \alpha, \Delta)$$

 α time slots

Figure: Requests arrive at/before time $(k - 1)(\gamma + 1)$

Similarly, all online algorithm will reject $\mathbf{e}_{i} = (\sqrt[3]{2(\gamma+1)}\Delta^{-\frac{1}{3}} - \frac{(i-1)(\gamma+1)}{\Delta}, (i-1)\gamma+1, (i-1)(\gamma+1)+\alpha, 1)$ for $i = 1, \dots, k$. Here k is the smallest integer such that $\sum_{i=1}^{k} b_{i} = S_{k} > 1$.

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Conclusions

Performance Upper Bound ($\beta = 1$): Second Try

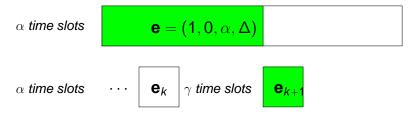


Figure: Requests arrive at/before time $k(\gamma + 1)$

Central authority has to reject
$$\mathbf{e}_{k+1}$$
 while
 $b_{k+1} + \frac{k(\gamma+1)}{\Delta} < \frac{1}{c}(S_k + b_{k+1}).$
 $b_{k+1} = \frac{1}{\Delta} + \frac{\sqrt{\Delta^2 - 2(\gamma+1)c^2\Delta}}{c\Delta}$ is a feasible value.

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Performance Upper Bound ($\beta = 1$): Second Try

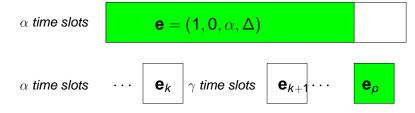


Figure: Requests arrive at/before time $(p - 1)(\gamma + 1)$

Central authority has to reject
$$\mathbf{e}_p$$
 while
 $b_p + \frac{(p-1)(\gamma+1)}{\Delta} < \frac{1}{c}(S_k + \sum_{i=k+1}^{p-1} b_i).$
It can be proved by induction that
 $b_i \ge b_{k+1} = \frac{1}{\Delta} + \frac{\sqrt{\Delta^2 - 2(\gamma+1)c^2\Delta}}{c\Delta}$ for all $i \ge k+1.$

Introduction System Model Instantaneous Requests Non-instantaneous Requests Conclusions

Performance Upper Bound ($\beta = 1$): Second Try

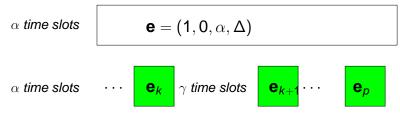


Figure: Requests arrive at/before time $(p - 1)(\gamma + 1)$

Any online algorithm makes at most 1 profit, while the optimal *offline* algorithm makes at least

$$(\Delta - k)b_{k+1} \ge (\Delta - k)(\frac{1}{\Delta} + \frac{\sqrt{\Delta^2 - 2(\gamma+1)c^2\Delta}}{c\Delta}).$$

This profit is always larger than c when
 $\sqrt{2(\gamma+1)}\Delta^{-\frac{1}{2}} < \frac{1}{c} \le \sqrt[3]{2(\gamma+1)}\Delta^{-\frac{1}{3}}.$

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System Mode

Upper bounds

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Conclusions

What is the best we can do?

• for
$$\beta = 1$$

2 for $\beta > 1$

System Model

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Conclusions

Performance Upper Bound ($\beta > 1$)

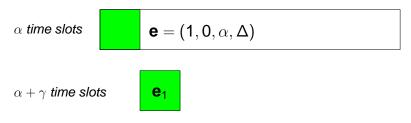


Figure: Requests arrive at/before time $\gamma + 1$

$$\mathbf{e}_1 = (\beta - 1 - \frac{\beta(\gamma+1)}{\Delta}, \gamma + 1, \gamma + 1 + \alpha, 1).$$

Central Authority has to accept \mathbf{e} and reject \mathbf{e}_1 .

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Conclusions

Performance Upper Bound ($\beta > 1$)

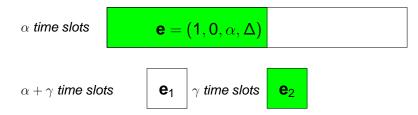


Figure: Requests arrive at/before time $2(\gamma + 1)$

$$\mathbf{e}_2 = (\beta - 1 - \frac{2\beta(\gamma+1)}{\Delta}, 2(\gamma+1), 2(\gamma+1) + \alpha, 1).$$

Central Authority has to reject \mathbf{e}_2 .

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Conclusions

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Performance Upper Bound ($\beta > 1$)

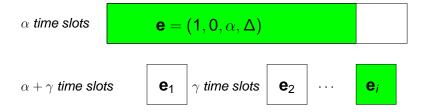


Figure: Requests arrive at/before time $i(\gamma + 1)$

$$\mathbf{e}_i = (\beta - 1 - \frac{i\beta(\gamma+1)}{\Delta}, i(\gamma+1), i(\gamma+1) + \alpha, 1).$$

Central Authority has to reject \mathbf{e}_i .

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Conclusions

Performance Upper Bound ($\beta > 1$)

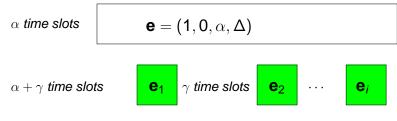


Figure: Requests arrive at/before time $i(\gamma + 1)$

Any online algorithm makes at most 1 profit, while the optimal offline algorithm makes $\sum_{i=1}^{n} b_i \ge \frac{(\beta-1)^2}{2\beta(\gamma+1)}\Delta$ ($b_n > 0$). The competitive ratio is no more than $\frac{2\beta(\gamma+1)}{(\beta-1)^2}\Delta^{-1}$.

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Conclusions

Simulation Studies

- Competitive Ratios
- 2 Efficiency ratio
- Spectrum utilization
- Compared with Simple Greedy Methods

Competitive ratios

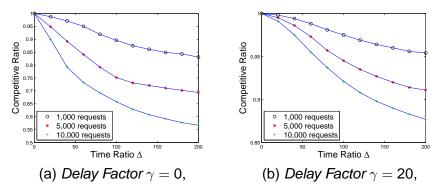


Figure: The competitive ratios of method \mathcal{G} in various cases.

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Competitive ratios

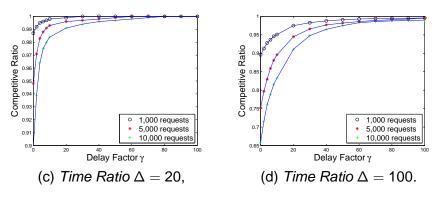


Figure: The competitive ratios of method G in various cases.

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Conclusions

Efficiency Ratios

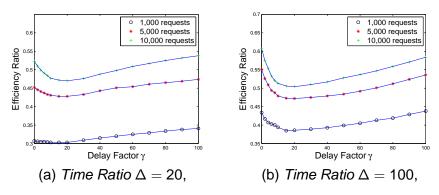


Figure: The efficiency ratios of our mechanism in various cases.

Efficiency Ratios

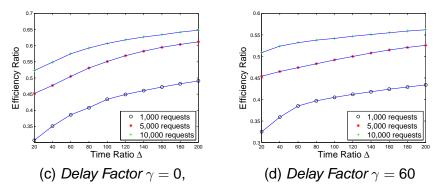


Figure: The efficiency ratios of our mechanism in various cases.

Spectrum Utilization

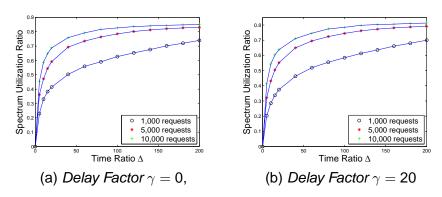


Figure: The spectrum utilization ratios of method \mathcal{G} in various cases.

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Conclusions

Compared with other methods

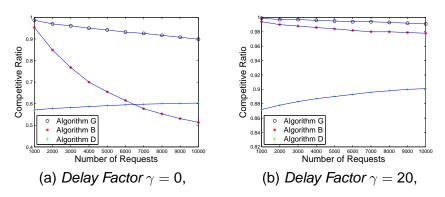


Figure: Compare algorithm \mathcal{G} with two simple greedy algorithms.

Compared with other methods

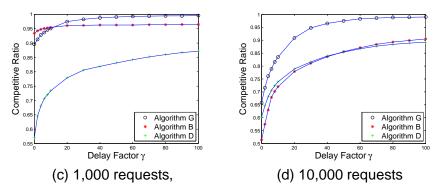


Figure: Compare algorithm \mathcal{G} with two simple greedy algorithms.

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Summary

Instantaneous Requests Non

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In this talk, we studied online spectrum allocation for wireless networks.

- Instaneous Requests
 - **①** Designed efficient methods for $\beta < 1$, $\beta = 1$ and $\beta > 1$
 - Present upper bounds for each of these cases.
 - General penality function and conflict among nodes
 - Designed truthful auction mechanisms (only manipulate bid b)

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Summary

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Conclusions

In this talk, we studied online spectrum allocation for wireless networks.

- Instaneous Requests
- Requests in advance
 - **①** Designed efficient methods for $\beta < 1$, $\beta = 1$ and $\beta > 1$
 - 2 Find that α not affects performance ($\alpha > \gamma$)
 - Present upper bounds for each of these cases.
 - General penality function and conflict among nodes
 - Solution Designed auction mechanisms (only manipulate bid *b*), when each users will bid $b'_i \ge b_i$

System Model

Future Work

Instantaneous Requests

Non-instantaneous Requests

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Conclusions

- Design allocation methods when we know probability distributions of requests (bid value, arrival time, and duration)
- Design truthful online mechanisms (worst case and expected truthful)
- Multiple channels for allocation (partial results done)
- More general penality functions (partial results done)

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Conclusions



Thanks for your attention.

Questions and Comments?