

# About coordination mechanisms for selfish scheduling with multiple tasks

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# Outline

1. Problem
2. Properties of coordination mechanisms
3. Stability of classical mechanisms
4. Conclusion and future work

# A scheduling problem

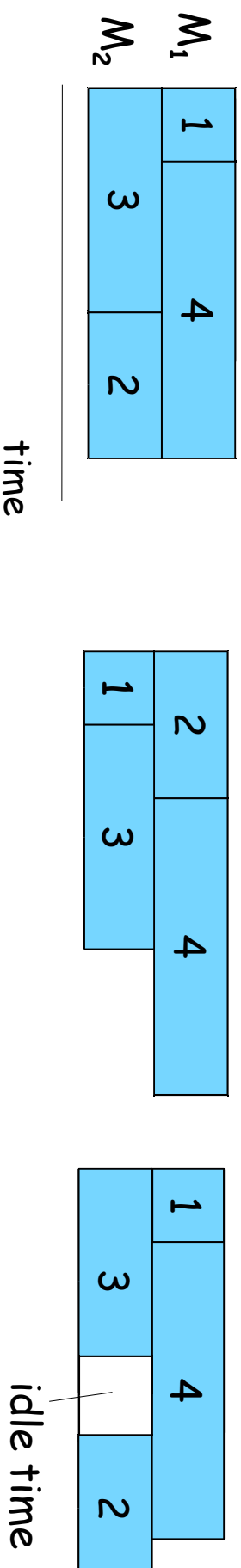
- Data :  $n$  machines  $M_1, \dots, M_m$  , a set of  $n$  tasks.

- An instance :



2 identical parallel machines  $M_1$  and  $M_2$ .

- Possible schedules :



- An objective function  $\sum C_j = 2+6+1+4 = 13$

$$\sum C_j = 1+5+3+6 = 15$$

- Example : Min. average completion time

# Context

- Algorithmic game theory (AGT).  
Shared resources: agents with conflicting interests interact.

Centralized protocols are not always possible.

Machine : processor, printer, link in a network ...



Scheduling problems have been studied in AGT.

- Each agent has one objective, and a set of possible strategies. We focus on (pure) Nash equilibrium: no agent can improve its objective function by unilaterally changing its strategy.

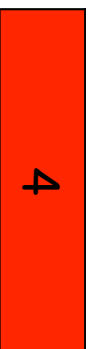
# Example

- 2 agents **A** et **B**

**A** has 2 tasks:

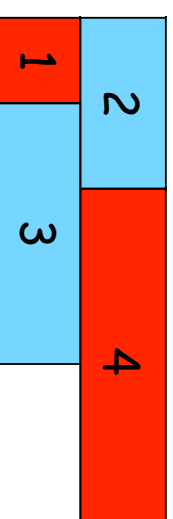
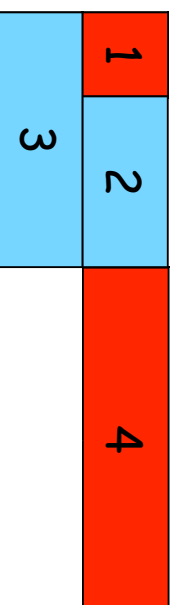
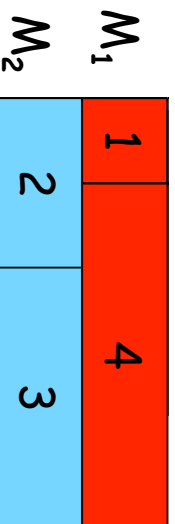


and **B** has 2 tasks:



Strategy : choose on which machine to schedule each task.

- The machines schedule the tasks by increasing order of lengths.
- Aim of the agents : Min average completion time



$C_1 = 6$ ,  $C_2 = 7$  time

$C_1 = 8$ ,  $C_2 = 6$

$C_1 = 7$ ,  $C_2 = 6$   
Nash equilibrium

# Price of anarchy

- Global objective function (social cost)
  - Example : Min. sum of completion times

- Price of anarchy = Social cost (Worst Nash equilibrium)

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Social cost (optimal solution)

 Measures the loss of efficiency due to the lack of cooperation between the selfish agents.

# Coordination mechanisms

- Introduced by **Christodoulou et al. in Icalp'04.**
- **Coordination mechanism** = set of **scheduling policies**, one for each machine.

Each policy :

- Gives **the order of the tasks** on the machine, and may introduce **idle times**.
- **Is local** : it depends on the tasks scheduled on the machine only.
- Does not distinguish the tasks of the different agents. Each task is identified by its length and its identification number.

- **Classical policies :**
  - **SPT (LPT)**: tasks are scheduled in increasing order of their lengths (resp. in decreasing order of their lengths).
  - **Random** : tasks are scheduled in a random order.
- Example of a coordination mechanism :

$M_{\text{SPT}}$	1	2	3
$M_{\text{LPT}}$	4		

- **Christod** [ICALP'04], introduced the coordination mechanisms when 1 agent = 1 task.
- **Immorlica et al.** [TCS 09] : study of the convergence and the price of anarchy of the schedules induced by the classical policies.



# Our problem

- $m$  machines shared between 2 agents A et B having each one a set of tasks.
- Aim of each agent : Minimize the sum of the completion times of its tasks.
- Does there exist a coordination mechanism which always induce Nash equilibria ?
- What is the stability of the solutions obtained with the classical policies SPT, LPT, and Random ?

# Stability of a schedule

◇-approximate Nash equilibrium : no agent can improve its objective (its sum of completion times) by a ratio larger than ◇ by changing its strategy (by moving its tasks).

$M_1$	1	4
$M_2$	2	3

Agent A:  $\sum C_j = 7$ ; could obtain 6

-> improvement ratio =  $7/6$  .

Agent B :  $\sum C_j = 6$ ; could obtain 5

-> improvement ratio =  $6/5$  .

=>  $6/5$ -approximate Nash equilibrium.

# Outline

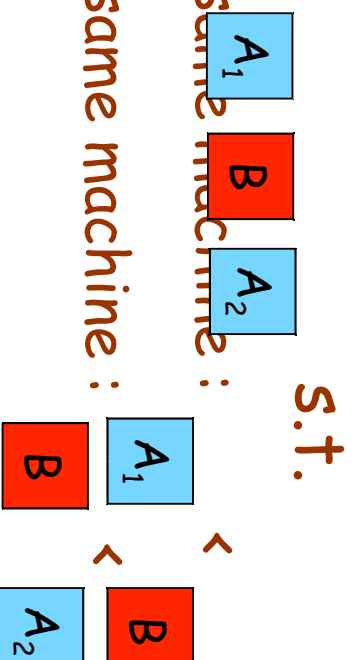
1. Problem
2. Properties of coordination mechanisms
  - Stability
  - Price of anarchy
1. Stability of classical mechanisms
2. Conclusion and future work

# Stability

- **Property** : If all the machines use **the same deterministic policy** which **doesn't use idle times**, then there does not always exist a Nash equilibrium.

- **Proof**: (m=2) Let 3 tasks

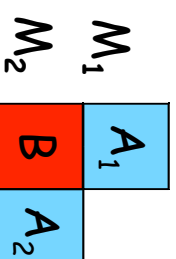
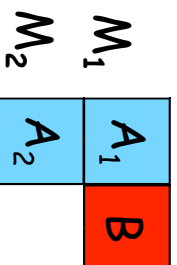
- If  $A_1$  and  $B$  are alone on a **same machine** :
- If  $B$  and  $A_2$  are alone on a **same machine** :



There is no Nash equilibrium.

Agent  $A$  wants :

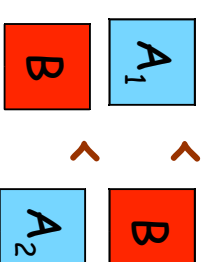
Agent  $B$  wants :



# Price of anarchy

- **Property** : If all the machines have the **same deterministic policy**, then the price of anarchy is at least 2.

- **Proof**:  $m=2$ , 3 tasks of length 1 s.t.



Idle times :

- If there are 2 tasks of length 1 on the same machine :
- If there is 

$i_1$	T	$i_2$	T
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 of length 1 alone on a machine :



- We distinguish 4 cases:

- Case 1:

i1	$A_1$	i2	$B_1$
i3	$A_2$		

$$C_j = i1 + i2 + 2$$

If  $B_1$  goes on  $M_2$  :  $C_j = i1 + 1$

=> This is not a Nash equilibrium.

- Case 2:

i1	$B_1$	i2	$A_2$
i3	$A_1$		

$$C_j = i1 + i2 + i3 + 3$$

Exchange  $A_1$   $A_2$  :  $C_j = i1 + i3 + 2$

=> This is not a Nash equilibrium.

- Case 3:

i1	$A_1$	i2	$A_2$
i3	$B_1$		

$$C_j = 2 * i1 + i2 + 3$$

Nash equilibrium only if  $i1 + i3 + 2 = 2 * i1 + i2 + 3$ ,

i.e. if  $i3 = 1 + i1 + i2$

If  $i3 = 1$  then price of anarchy is 2.

- Case 4: the 3 tasks are together

By contradiction. If the price of anarchy is  $< 2$   $i3 < 1$ .  
With other properties, we can deduce that there is an instance without Nash equilibrium.

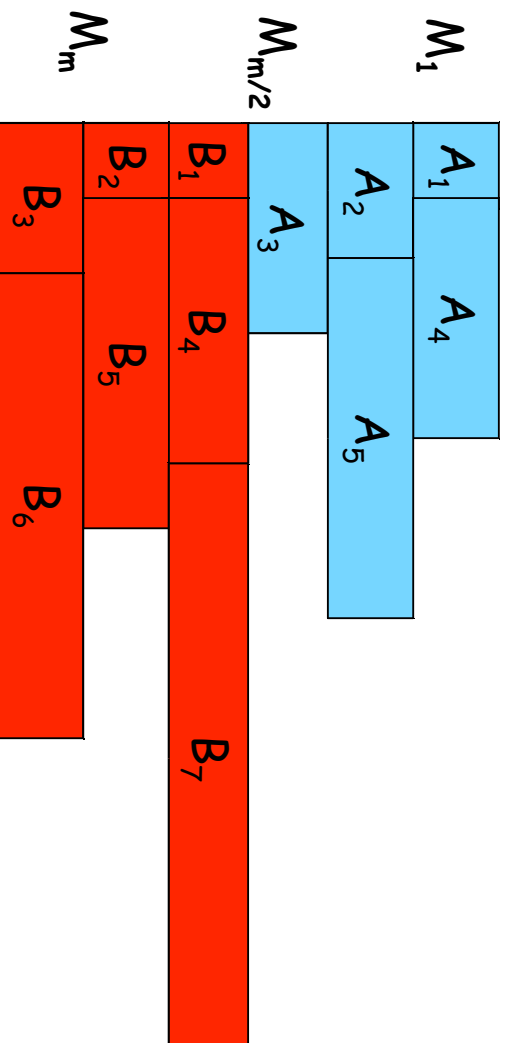
=> With identical deterministic policies, the price of anarchy is 2.

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  - LPT and Random
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# The SPT policy

- Property : If all the machines use the SPT policy, then there exist always a 3-approximate Nash equilibrium.
- Proof : (m is even)



Sum of the completion times on a set of  $m/2$  machines  $\leq 2 \times$  Sum of the completion times of the same tasks on  $m$  machines.



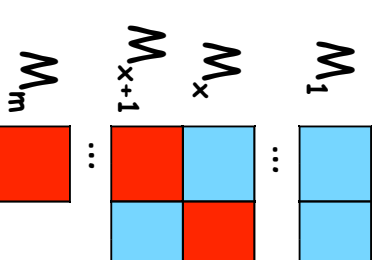
# The SPT policy : lower bound

- **Property** : If all the machines use the **SPT policy**, then there does **not** always exist  **$(3/2 - \epsilon)$ -approximate Nash equilibrium**, for all  $\epsilon$ .
- **Proof**:  $2m-1$  tasks of length 1 s.t.



Let  $S$  be the most stable schedule.

- At most 2 tasks per machine in  $S$ .
- Each agent can, by moving its tasks, make them start at time 0.

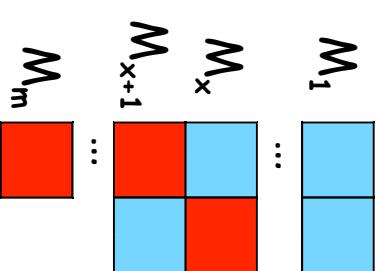


Let  $x$  be the number of tasks of  $A$  in 1<sup>st</sup> position in  $S$ .

- $C_j = x + 2(m-x)$ .

$A$  could gain a factor by moving.

$$\frac{x + 2(m - x)}{m} = 2 - \frac{x}{m}$$



- $B$  could gain a factor  $1 + \frac{x}{m-1}$  by moving.

- $S$  is a  $\max(2 - \frac{x}{m}, 1 + \frac{x}{m-1})$ -approximate Nash equilibrium.

- There is no  $\frac{3}{2}$ -approximate Nash equilibrium with

$\diamond < \min \max(2 - \frac{x}{m}, 1 + \frac{x}{m-1})$ .

$$2 - \frac{x}{m} \quad 1 + \frac{x}{m-1} \quad \frac{3}{2} \quad (x \in \{1, \dots, m\})$$

# The LPT and Random policies

- **Property** : If the machines use the policy **LPT** or **Random**, then there does **not** always exist an  $\epsilon$ -approximate Nash equilibrium, for all  $\epsilon$ .

- Proof for LPT:

$$M_1 \quad \begin{array}{|c|} \hline \vdots \\ \hline \end{array}$$

$$M_i \quad \begin{array}{|c|} \hline L_i \\ \hline \end{array} \begin{array}{|c|} \hline L_i \\ \hline \end{array} \dots \begin{array}{|c|} \hline L_i \\ \hline \end{array}$$

$n_i = (\epsilon m)^{2^{m-i+1}-1}$  tasks of length  $L_i = (\epsilon m)^{2^{m+1}-2^{m-i+2}}$

$$M_m \quad \begin{array}{|c|} \hline L_m \\ \hline \end{array} \begin{array}{|c|} \hline L_m \\ \hline \end{array} \dots \begin{array}{|c|} \hline L_m \\ \hline \end{array} \begin{array}{|c|} \hline L_m - \epsilon \\ \hline \end{array}$$

( $\epsilon m$ ) tasks of length  $L_m$

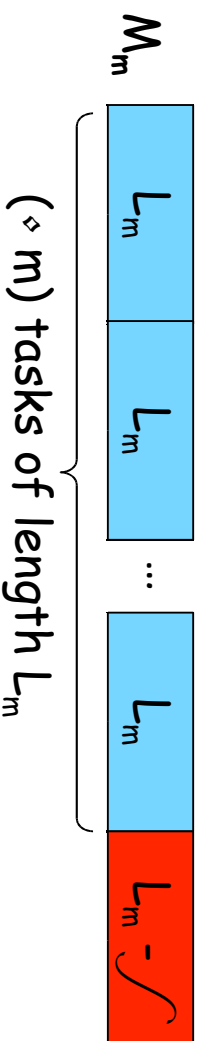
1- In  $S$ , agent **B** decreases its completion time with a factor larger than  $\epsilon$  by going on another machine.

2- In any other schedule, agent  $A$  decreases its sum of completion times by a factor  $> \diamond$  by moving its tasks.

$$M_1 \parallel \dots \parallel$$

$$M_i \parallel \begin{array}{|c|} \hline L_i \\ \hline \end{array} \parallel \dots \parallel \begin{array}{|c|} \hline L_i \\ \hline \end{array}$$

$$n_i = (\diamond m)^{\wedge(2^{m-i+1}-1)} \text{ tasks of length } L_i = (\diamond m)^{\wedge(2^{m+1}-2^{m-i+2})}$$



- Sum of the completion times of  $A$  in  $S$  :

$$\sum C_j(S) < m (\diamond m)^{\wedge(2^{m+1}-2)}$$

- Sum of the completion times of the tasks of length  $L_i$  with a longest task  $> L_{i+1}$   $n_i = (\diamond m)^{\wedge(2^{m+1}-1)} > \diamond \sum C_j(S)$

$\square$  There is no  $\diamond$ -approximate Nash equilibrium in this game.

# Conclusion

- Machines with **deterministic identical policies**
  - **without idle times** : instances without Nash equilibrium
  - with idle times : price of anarchy at least 2 (social cost = sum of completion times).
- **Classical policies** :
  - LPT, Random induce schedules as instable as wanted
  - SPT induces  $\diamond$ -approximate Nash equilibria with  $\diamond$  between  $3/2$  et 3.

# Future work

- Tight bound for **SPT**
- **Complexity** for an agent to compute its best response (for a given coordination mechanism) ?  
**Convergence time** to obtain a Nash equilibria?
- Does there exist a **coordination mechanism which induces Nash equilibria** for this problem?  
For example : one machine uses SPT, and another one LPT?