

Closed formulae for revenue-maximizing mechanisms in 2-D sequencing mechanism design

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Revenue maximizing mechanism design

Selling product (goods/services) under incomplete information.

- ▶ Combinatorial optimization problem
- ▶ Agents 'own' parameters
- ▶ May misrepresent
- ▶ Mechanism = set of rules:
- ▶ Input: strategies of the agents
- ▶ Output: feasible solution + payments

Example

Single item auction

Myerson optimal single item auctions

Selling a single item to a group of agents [Myerson, 1981].

- ▶ Agents: private information on valuation
- ▶ Priors on the private information
- ▶ Mechanism outcome: allocation + payments

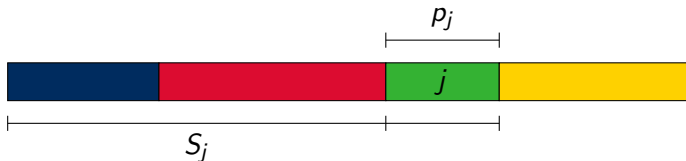
Optimal mechanism:

- ▶ Strategies: revealing information
- ▶ Truth telling w.l.o.g.
- ▶ 'Nice' properties

Focus of this talk

Properties of 1-D, 1.5-D and 2-D revenue optimal mechanisms for sequencing.

Sequencing jobs on a single processor



- ▶ Job: unit waiting cost, w_j ; processing requirement, p_j
- ▶ Jobs **must** be scheduled
- ▶ Payments, π_j , **reimburse** jobs for waiting cost ($= w_j S_j$)
- ▶ Minimize total payment

All data known:

- ▶ $\sum \pi_j = \sum w_j S_j$
- ▶ Priorities according to w_j/p_j (Smith's Rule [Smith 1956])

Mechanism design problem

- ▶ Type $t_j = (w_j, p_j) \in T_j$ is **private** to agent j (owns job j)
- ▶ Probability distribution $\varphi_j : T_j \rightarrow (0, 1]$ public knowledge
- ▶ Agents **may lie** to maximize utility, $u_j = \pi_j - w_j S_j$
- ▶ **Mechanism = schedule + payments**
- ▶ **Optimal mechanism**, minimizing total payment

Mechanism design: example

- ▶ Three jobs
- ▶ $p_j = 1$ for all j
- ▶ $w_1 = 5$, $w_2 = 2$ and $w_3 = 3$ or $w_3 = 1$

σ_1 :

$w_1 = 5$	$w_3 = 3$	$w_2 = 2$
-----------	-----------	-----------

 $\pi_2 = 4, \pi_3 = 3$

σ_2 :

$w_1 = 5$	$w_2 = 2$	$w_3 = 1$
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- ▶ $\pi_3(\sigma_2) - S_3(\sigma_2) < \pi_3(\sigma_1) - S_3(\sigma_1)$: Job 3 prefers σ_1

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 $\pi_2 = 2, \pi_3 = 4$

- ▶ $\pi_3(\sigma_2) - S_3(\sigma_2) < \pi_3(\sigma_1) - S_3(\sigma_1)$: Job 3 prefers σ_1
- ▶ Increasing $\pi_3(\sigma_2)$ reduces total payment

Model

- ▶ Agents with jobs: **types** $t_j = (w_j, p_j) \in T_j$; (partly) private
- ▶ Mechanism strategies: report type $t'_j \in T_j$
- ▶ Mechanism output: machine sequence (ES) + payments
- ▶ Truthful mechanisms
- ▶ Payments: **individual rational** (IR) & **incentive compatible** (BNIC)

$$\text{(IR)} \quad \pi_j(t_j) - w_j(t_j)ES_j(t_j) \geq 0$$

$$\text{(BNIC)} \quad \pi_j(t_j) - w_j(t_j)ES_j(t_j) \geq \pi_j(t'_j) - w_j(t_j)ES_j(t'_j)$$

Overview

Open Problem [Heydenreich et al. 2008]

“Identify (closed formulae for) optimal 2-D mechanisms.”

Model	Comments	Solution method
0-D	Optimization problem	Priorities: w_j/p_j
1-D	Only w_j private	Priorities: \bar{w}_j/p_j
1.5-D	Reported $p_j \geq$ true p_j	LP-compactification
2-D		Priorities: $\bar{w}_j/\mathbb{E}(p_j w_j)$

Lemma

Priorities result in ‘nice’ properties

1-Dimensional

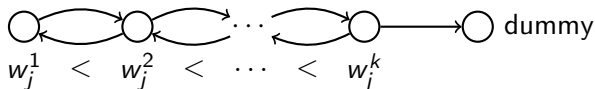
- ▶ Agents with jobs: p_j known, w_j private
- ▶ Strategies: report w'_j
- ▶ Mechanism output: sequences (ES) + payments
- ▶ Truthful mechanisms: Bayes-Nash incentive compatible payments
- ▶ [Heydenreich et al., WINE 2008; Duives et al. 2015]

Type graph

Given output sequences (ES), construct a **type graph** for each agent:

- ▶ Complete di-graph
- ▶ Node for each type + dummy
- ▶ Length of arc (w_j, w'_j): gain by reporting type w'_j if really w_j

$$l(w_j, w'_j) = w_j(ES_j(w'_j) - ES_j(w_j))$$



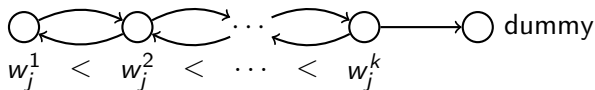
Lemma

Bayes-Nash implementable \Leftrightarrow *no negative cycles* \Leftrightarrow *monotonicity*.

Lemma

Given ES , the minimal BNIC payment for agent j reporting w_j is $-Dist(w_j, dummy)$.

Optimal 1-D mechanism



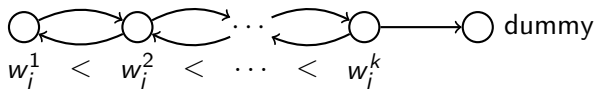
Lemma

Shortest path from w_j^i to the dummy traverses $(w_j^i, \dots, w_j^k, \text{dummy})$.

Lemma

$$\text{Dist}(w_j^i, \text{dummy}) = -w_j^i ES_j(w_j) + \sum_{h>i} ES_j(w_j^h)(w_j^{h-1} - w_j^h).$$

Optimal 1-D mechanism



Lemma

Optimal mechanism minimizes

$$\begin{aligned} \sum_j \sum_i ES_j(w_j^i) & \left(\varphi_j(w_j^i) w_j^i + (w_j^{i-1} - w_j^i) \sum_{h<i} \varphi_j(w_j^h) \right) \\ & = \sum_{(w_1, \dots, w_n)} \prod_j \varphi_j(w_j) \sum_j \bar{w}_j ES_j(w_j) , \end{aligned}$$

where $\bar{w}_j^i = w_j^i + (w_j^{i-1} - w_j^i) \frac{\sum_{h<i} \varphi_j(w_j^h)}{\varphi_j(w_j^i)}$

Optimal 1-D mechanism

$$\min_{(w_1, \dots, w_n)} \sum_j \prod \varphi_j(w_j) \sum_j \bar{w}_j ES_j(w_j)$$

Many sequencing optimization problems \rightarrow priority: \bar{w}_j/p_j .

Corollary

Optimal mechanism can be implemented as dominant strategies.

Corollary

Optimal mechanism is deterministic.

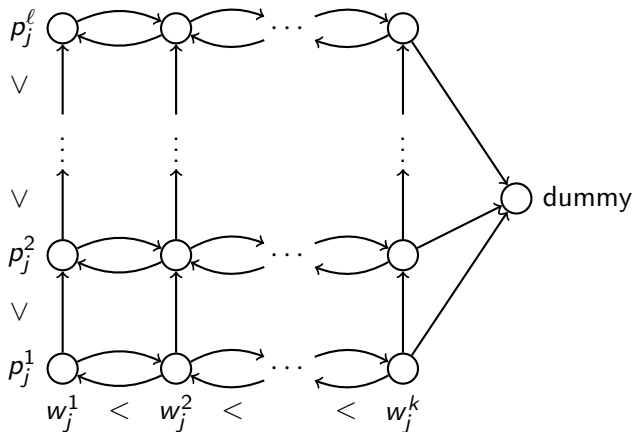
Corollary

Optimal mechanism is IIA.

1.5-Dimensional

- ▶ Agents with jobs: $t_j = (w_j, p_j)$ private
- ▶ Strategies: report t'_j with $p_j(t'_j) \geq p_j$
- ▶ Mechanism output: sequences (ES) + payments
- ▶ Truthful mechanisms: Bayes-Nash incentive compatible payments
- ▶ [H. & Uetz, IPCO 2013]

Type graph



Lemma

No 'dominating' shortest path.

Optimal 1.5-D mechanism

Theorem (H. & Uetz, IPCO 2013)

Polynomial size LP formulation for (BNIC) 1.5-D problem.

Results in **randomized outcome**, i.e. a lottery over sequences for each vector of types.

Lemma

Optimal randomized mechanism $>$ optimal deterministic mechanism.

Lemma

Optimal deterministic mechanism $>$ optimal deterministic IIA mechanism.

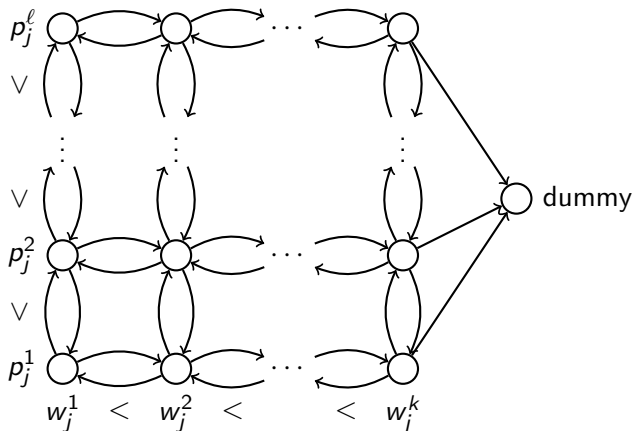
Corollary

Optimal mechanism does not have priorities.

2-Dimensional

- ▶ Agents with jobs: $t_j = (w_j, p_j)$ private
- ▶ Strategies: report any t'_j
- ▶ Mechanism output: sequences (ES) + payments
- ▶ Truthful mechanisms: Bayes-Nash incentive compatible payments

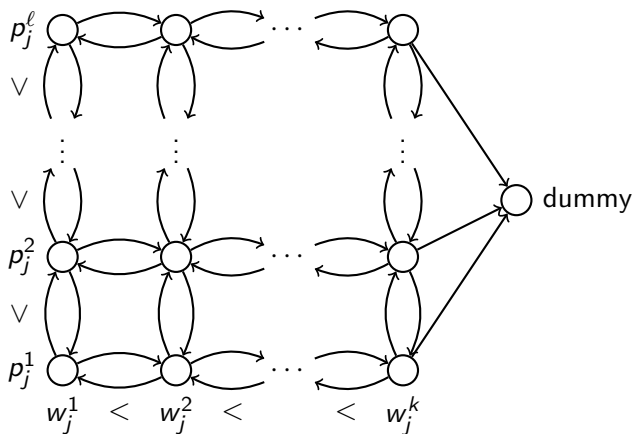
Type graph



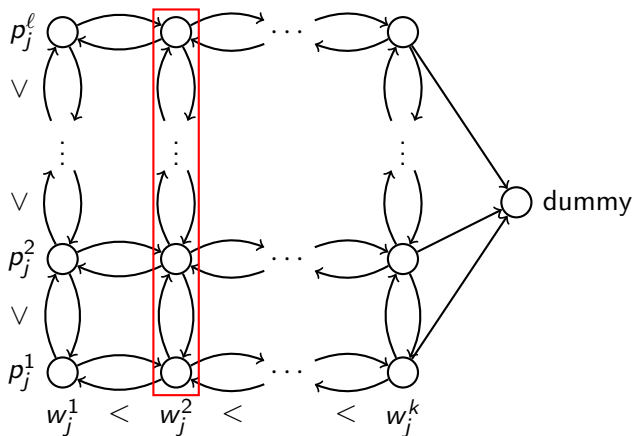
Lemma

$ES_j(w_j, p_j) = ES_j(w_j, p'_j)$ for all j, w_j, p_j, p'_j .

Proof

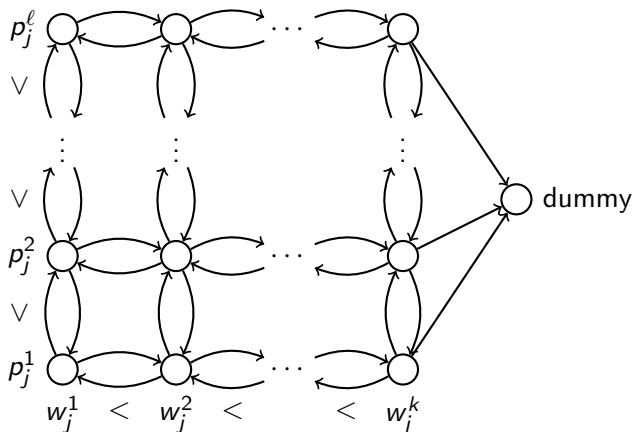


Proof



Equal utility for all types with equal w_j .

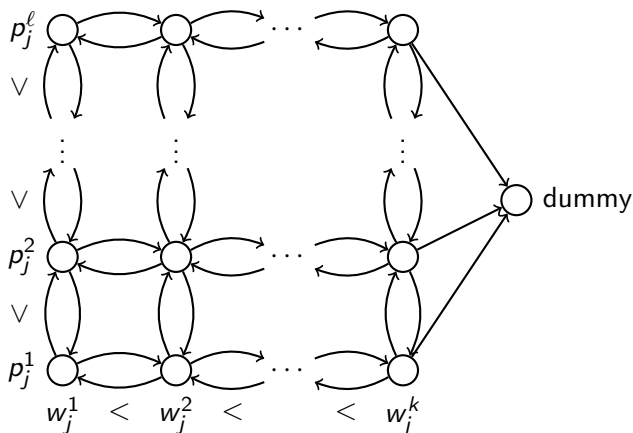
Proof



Monotonicity:

$$w_j \geq w'_j \Leftrightarrow ES_j(w_j, p_j) \leq ES_j(w'_j, p'_j) \quad \forall w_j, w'_j, p_j, p'_j.$$

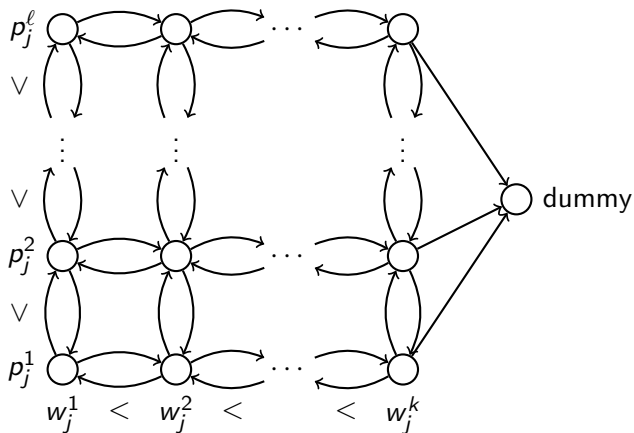
Proof



For all choices of p_j^i, \dots, p_j^h :

$$\pi_j(w_j^i, p_j^i) \geq w_j^k Es_j(w_j^k, p_j^k) + \sum_{h=i}^{k-1} w_j^h \left(Es_j(w_j^h, p_j^h) - Es_j(w_j^{h+1}, p_j^{h+1}) \right) .$$

Proof



$$ES_j(w_j, p_j) = ES_j(w_j, p_j') \text{ for all } j, w_j, p_j, p_j'.$$



Optimal 2-D mechanism

- ▶ Reduction to 1-D case with (conditional) stochastic processing requirement
- ▶ Solved by priorities: $\bar{w}_j / \mathbb{E}(p_j | w_j)$ [Rothkopf, 1966]
- ▶ Dominant strategy implementation
- ▶ IIA

Summary

- ▶ 2-D sequencing mechanism design reduces to 1-D case
- ▶ Priority sequencing rule
- ▶ 1.5-D optimal mechanism has no priority sequencing rule

Open problem:

- ▶ 2-D mechanism as an approximately optimal 1.5-D mechanism?