

# Approximate Mechanism Design without Money

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# Social Choice and Voting

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- Mathematical **theory** dealing with **aggregation** of preferences.
- Founded by Condorcet, Borda (1700's) and Dodgson (1800's).
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- Collective decision making, by **voting**, over **anything**:
  - Political representatives, award nominees, contest winners, allocation of tasks/resources, joint plans, meetings, food, ...
  - Web-page ranking, preferences in multiagent systems.

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# A Class of Voting Rules

## Positional Scoring Voting Rules

- Vector  $(a_1, \dots, a_m)$ ,  $a_1 \geq \dots \geq a_m \geq 0$ , of **points** allocated to each **position** in the preference list.
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- **Condorcet criterion**: select the Condorcet winner, if exists.
  - **Plurality** satisfies the **Condorcet criterion**? **Borda count**?
- “Approximation” of the Condorcet winner:  
**Dodgson** (NP-hard to approximate!), **Copeland**, **MiniMax**, ...

# Social Choice

## Setting

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## Desirable Properties of Social Choice Functions

- **Onto**: Range is  $A$ .
- **Unanimous**: If  $a$  is the top alternative in all  $\succ_1, \dots, \succ_n$ , then

$$F(\succ_1, \dots, \succ_n) = a$$

- **Not dictatorial**: For each agent  $i$ ,  $\exists \succ_1, \dots, \succ_n$ :

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- **Strategyproof** or **truthful**:  $\forall \succ_1, \dots, \succ_n, \forall$  agent  $i, \forall \succ'_i$ ,

$$F(\succ_1, \dots, \succ_i, \dots, \succ_n) \succ_i F(\succ_1, \dots, \succ'_i, \dots, \succ_n)$$

# Impossibility Result

## Gibbard-Satterthwaite Theorem (mid 70's)

Any **strategyproof** and **onto** social choice function on **more than 2** alternatives is **dictatorial**.

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- **Restricted domain** of preferences – **Approximation**

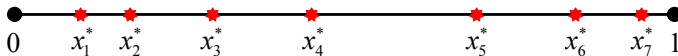
# Single Peaked Preferences and Medians

## Single Peaked Preferences

- One dimensional ordering of alternatives, e.g.  $A = [0, 1]$
- Each agent  $i$  has a **single peak**  $x_i^* \in A$  such that for all  $a, b \in A$ :

$$b < a \leq x_i^* \Rightarrow a \succ_i b$$

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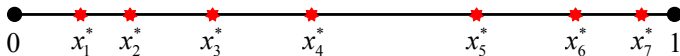
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## Median Voter Scheme [Moulin 80], [Sprum 91], [Barb Jackson 94]

A social choice function  $F$  on a **single peaked** preference domain is **strategyproof**, **onto**, and **anonymous** iff there exist  $y_1, \dots, y_{n-1} \in A$  such that for all  $(x_1^*, \dots, x_n^*)$ ,

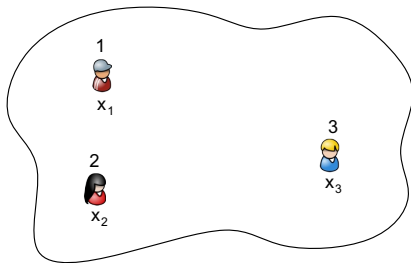
$$F(x_1^*, \dots, x_n^*) = \text{median}(x_1^*, \dots, x_n^*, y_1, \dots, y_{n-1})$$



# $k$ -Facility Location Game

## Strategic Agents in a Metric Space

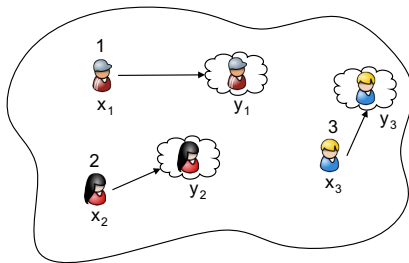
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Location  $x_i$  is agent  $i$ 's **private information**.



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Location  $x_i$  is agent  $i$ 's **private information**.
- Each agent  $i$  **reports** that she wants a facility at  $y_i$ .  
Location  $y_i$  may be **different** from  $x_i$ .



# Mechanisms and Agents' Preferences

## (Randomized) Mechanism

A social choice **function**  $F$  that maps a location profile  $\mathbf{y} = (y_1, \dots, y_n)$  to a (probability distribution over) set(s) of  $k$  **facilities**.

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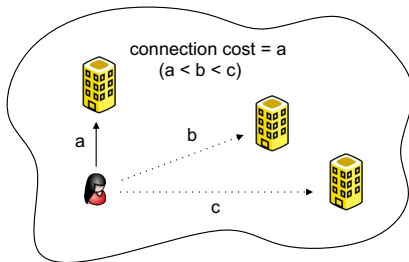
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## Connection Cost

(Expected) distance of agent  $i$ 's **true location** to the **nearest** facility:

$$\text{cost}[x_i, F(\mathbf{y})] = d(x_i, F(\mathbf{y}))$$



# Desirable Properties of Mechanisms

## Strategyproofness

For any location profile  $\mathbf{x}$ , agent  $i$ , and location  $y$ :

$$\text{cost}[x_i, F(\mathbf{x})] \leq \text{cost}[x_i, F(y, \mathbf{x}_{-i})]$$

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$F(x)$  should optimize (or approximate) a given **objective function**.

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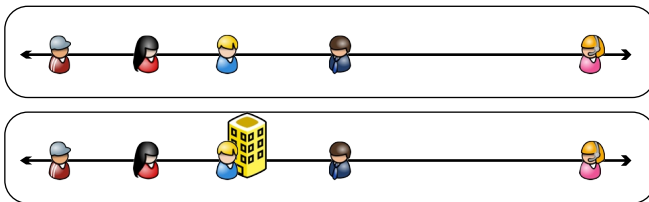
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- Minimize  **$p$ -norm** of  $(\text{cost}[x_1, F(\mathbf{x})], \dots, \text{cost}[x_n, F(\mathbf{x})])$

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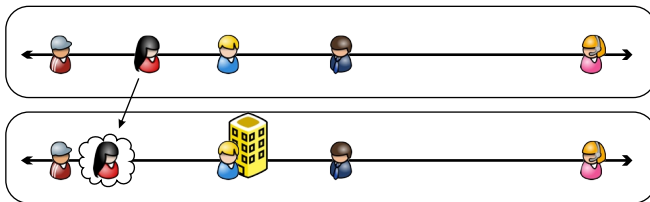
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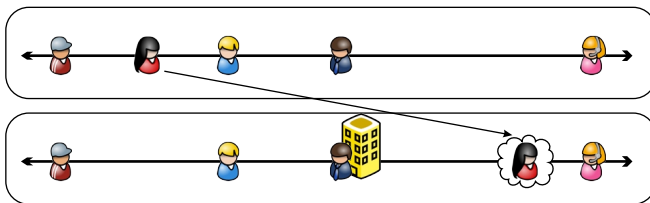
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## 1-Facility Location in a Tree [Schummer Vohra 02]

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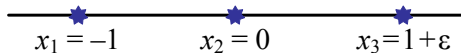
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- Deterministic **dictatorship** has  $\text{cost} \leq (n - 1)\text{OPT}$ .
- Randomized **dictatorship** has  $\text{cost} \leq 2\text{OPT}$  [Alon FPT 10]

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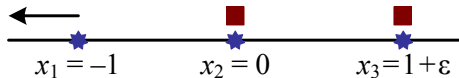
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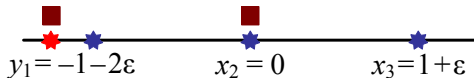
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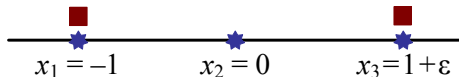
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## Two Extremes Mechanism [Procacc Tennen 09]

- Facilities at the **leftmost** and at the **rightmost** location :

$$F(x_1, \dots, x_n) = (\min\{x_1, \dots, x_n\}, \max\{x_1, \dots, x_n\})$$

- Strategyproof** and  $(n - 2)$ -approximate .



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## 2-Facility Location on the Line – Approximation Ratio

|                      | Upper Bound    | Lower Bound          |
|----------------------|----------------|----------------------|
| <b>Deterministic</b> | $n - 2$ [PT09] | $(n - 1)/2$ [LSWZ10] |

# Approximate Mechanism Design without Money

## Approximate Mechanism Design [Procacc Tennen 09]

- Sacrifice **optimality** for **strategyproofness**.
- **Best approximation** ratio by **strategyproof** mechanisms?
- Variants of  $k$ -Facility Location,  $k = 1, 2, \dots$ , among the **central** problems in this research agenda.

## 2-Facility Location on the Line – Approximation Ratio

|                      | Upper Bound    | Lower Bound          |
|----------------------|----------------|----------------------|
| <b>Deterministic</b> | $n - 2$ [PT09] | $(n - 1)/2$ [LSWZ10] |
| <b>Randomized</b>    | 4 [LSWZ10]     | 1.045 [LWZ09]        |

## Deterministic 2-Facility Location on the Line

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- Either  $F(\mathbf{x}) = (\min \mathbf{x}, \max \mathbf{x})$  for all  $\mathbf{x}$  (Two Extremes).
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## Dictatorial Mechanism with Dictator $j$

- Consider distances  $d_l = x_j - \min \mathbf{x}$  and  $d_r = \max \mathbf{x} - x_j$ .
- Place the first facility at  $x_j$  and the second at  $x_j - \max\{d_l, 2d_r\}$ , if  $d_l > d_r$ , and at  $x_j + \max\{2d_l, d_r\}$ , otherwise.
- **Strategyproof** and  $(n - 1)$ -**approximate**.

## Consequences

- **Two Extremes** is the **only anonymous** nice mechanism for allocating 2 facilities to  $n \geq 5$  agents on the line.
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## Deterministic 2-Facility Location in General Metrics

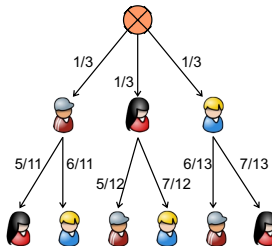
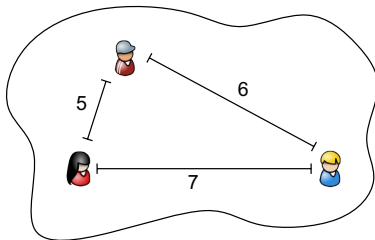
There are **no nice** mechanisms for **2-Facility** Location in metrics more general than the line and the cycle (even for **3 agents** in a **star**).

## Proportional Mechanism

Facilities open at the locations of **selected agents**.

**1st Round:** Agent  $i$  is selected with probability  $1/n$

**2nd Round:** Agent  $j$  is selected with probability  $\frac{d(x_j, x_i)}{\sum_{\ell \in N} d(x_\ell, x_i)}$

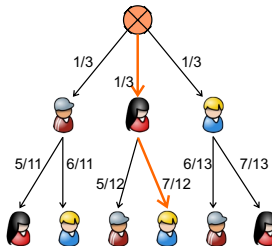
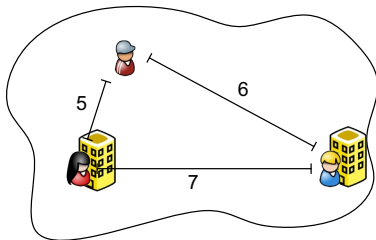


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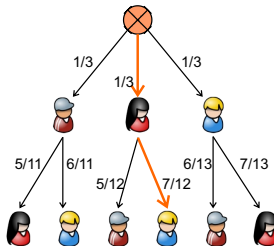
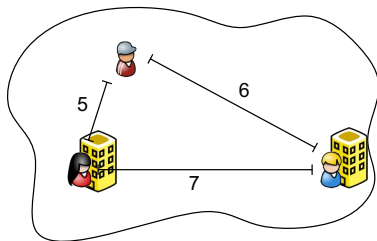
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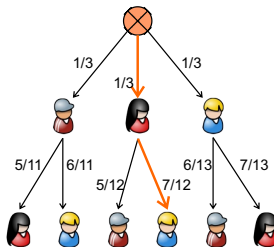
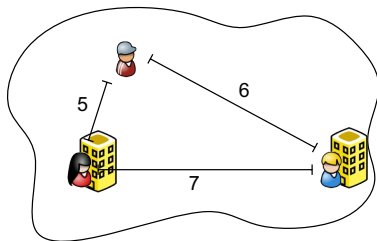
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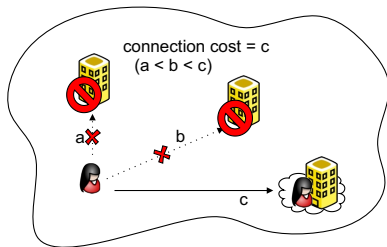
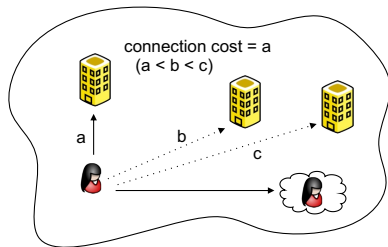
- **Not strategyproof** for  $> 2$  facilities!

Profile  $(0:\text{many}, 1:50, 1 + 10^5:4, 101 + 10^5:1)$ ,  $1 \rightarrow 1 + 10^5$ .



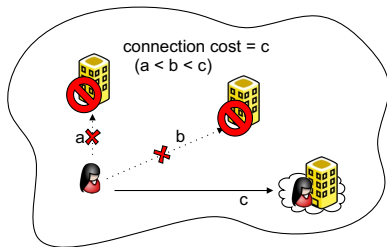
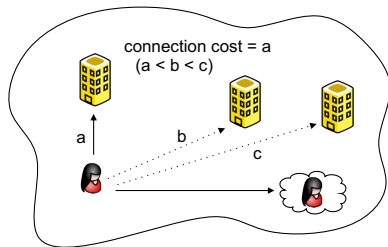
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- Winner-imposing** version of the Proportional Mechanism is **strategyproof** and  **$4k$ -approximate** in general metrics, for any  $k$ .



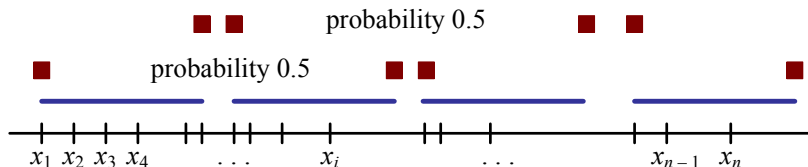
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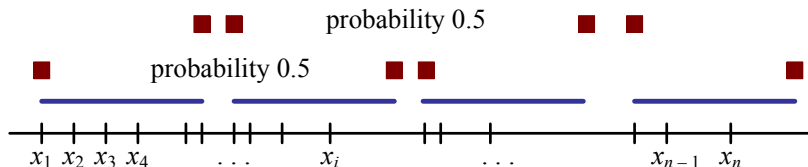


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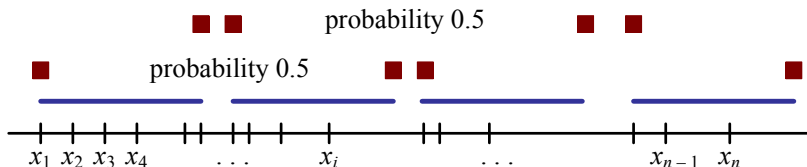


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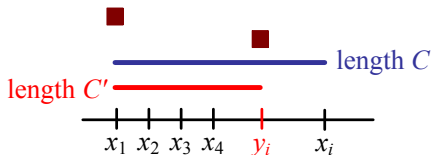


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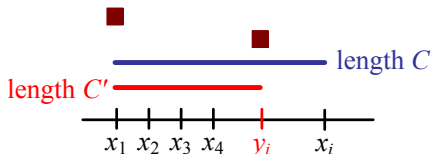


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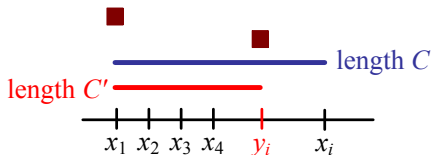


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## Agents with Concave Costs

**Generalized** Equal-Cost Mechanism is **strategyproof** and has the **same approximation** ratio if agents' cost is a **concave function** of distance to the nearest facility.

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## Voting and Social Networks

- How group of people **vote** for their **leader** in **social networks**?
- How **social network** affects the people's **votes** and the outcome? Relation to **opinion dynamics**?

**Thank You!**