

# **A truthful Multi Item-Type Double-Auction Mechanism**

Erel Segal-Halevi

with

Avinatan Hassidim

Yonatan Aumann

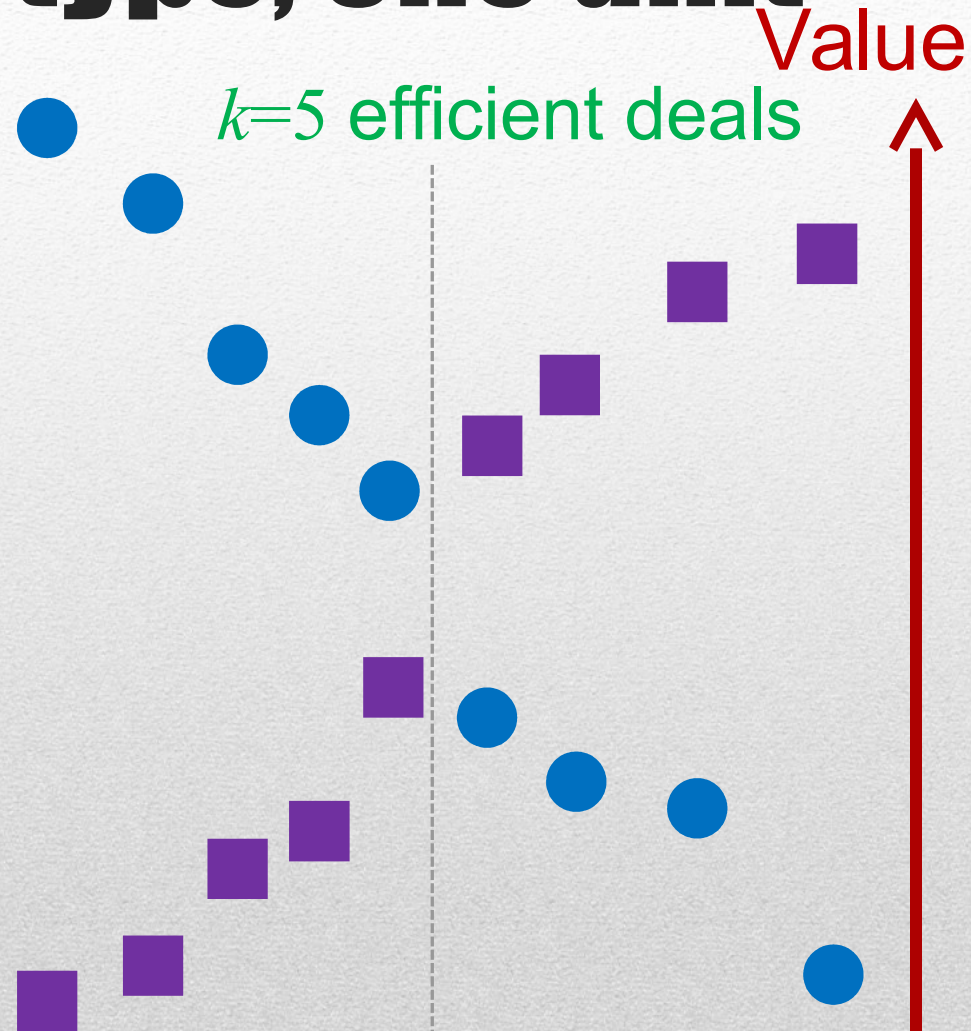
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# Intro: one item-type, one unit

Buyers:

Sellers:

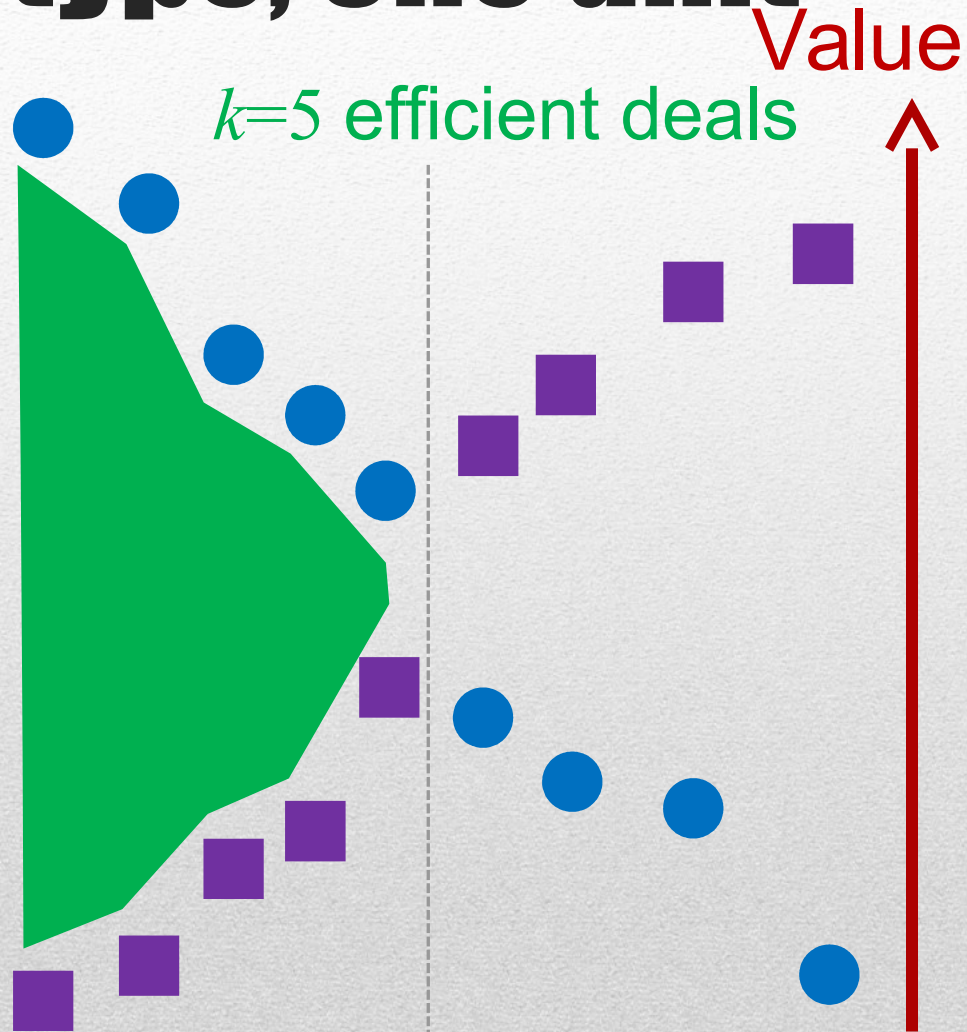


# Intro: one item-type, one unit

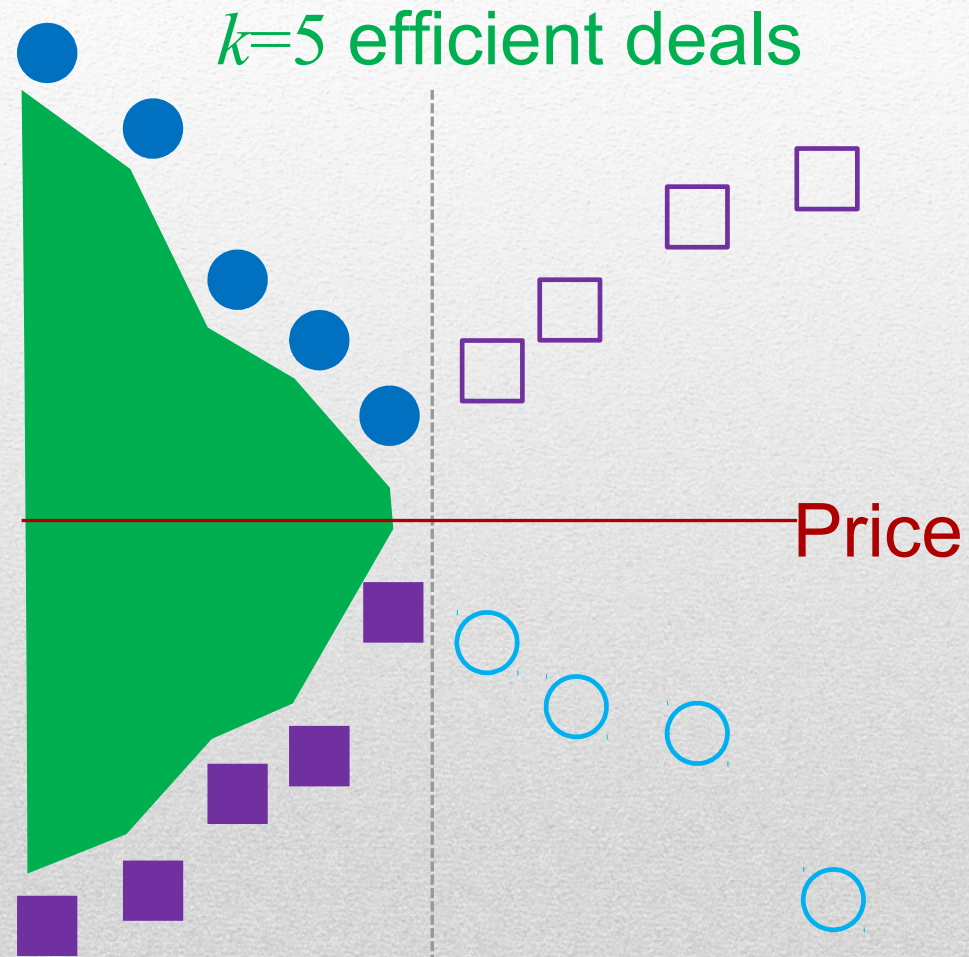
Buyers:

Gain from trade:

Sellers:

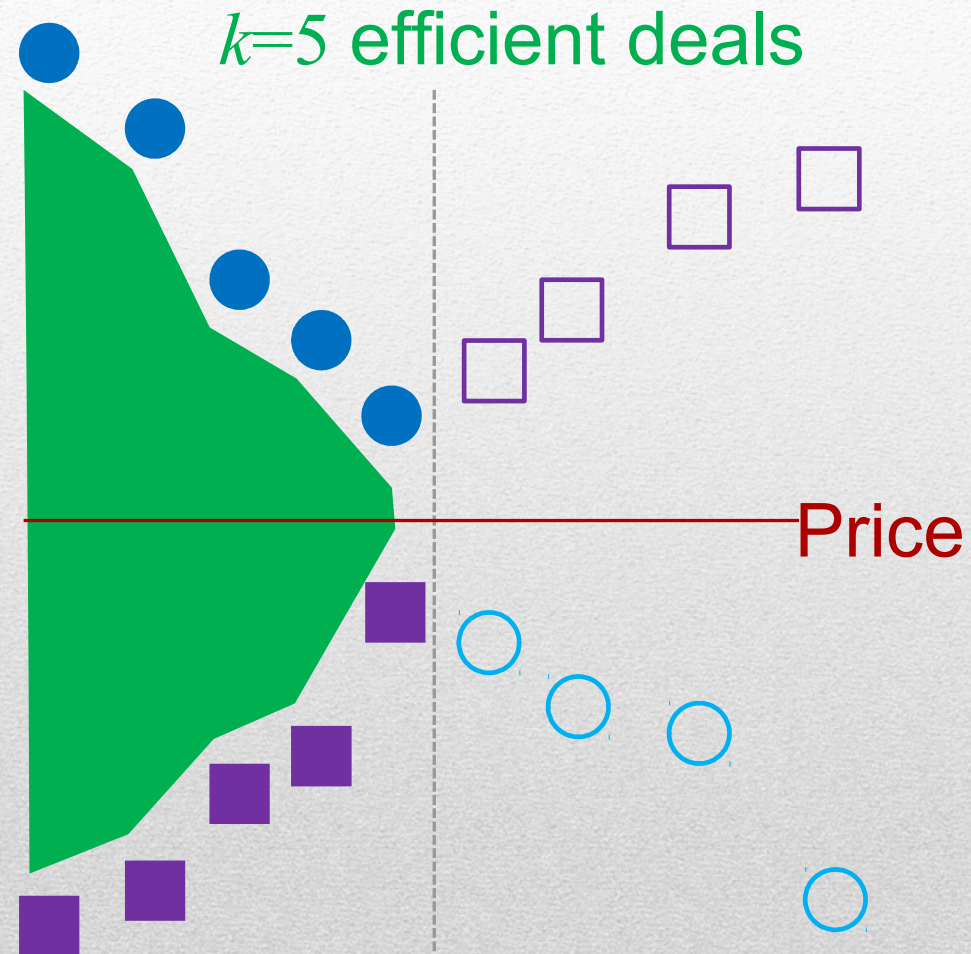


# Price Equilibrium



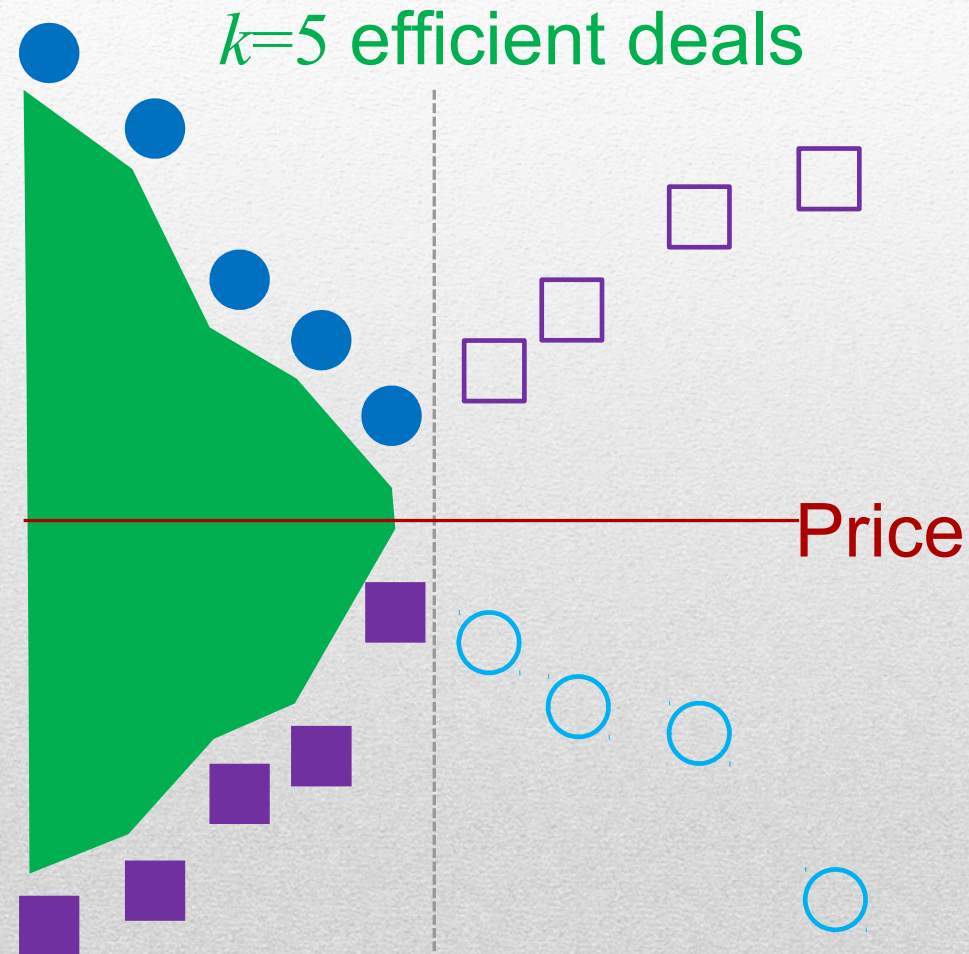
# Price Equilibrium

✓ Maximum gain



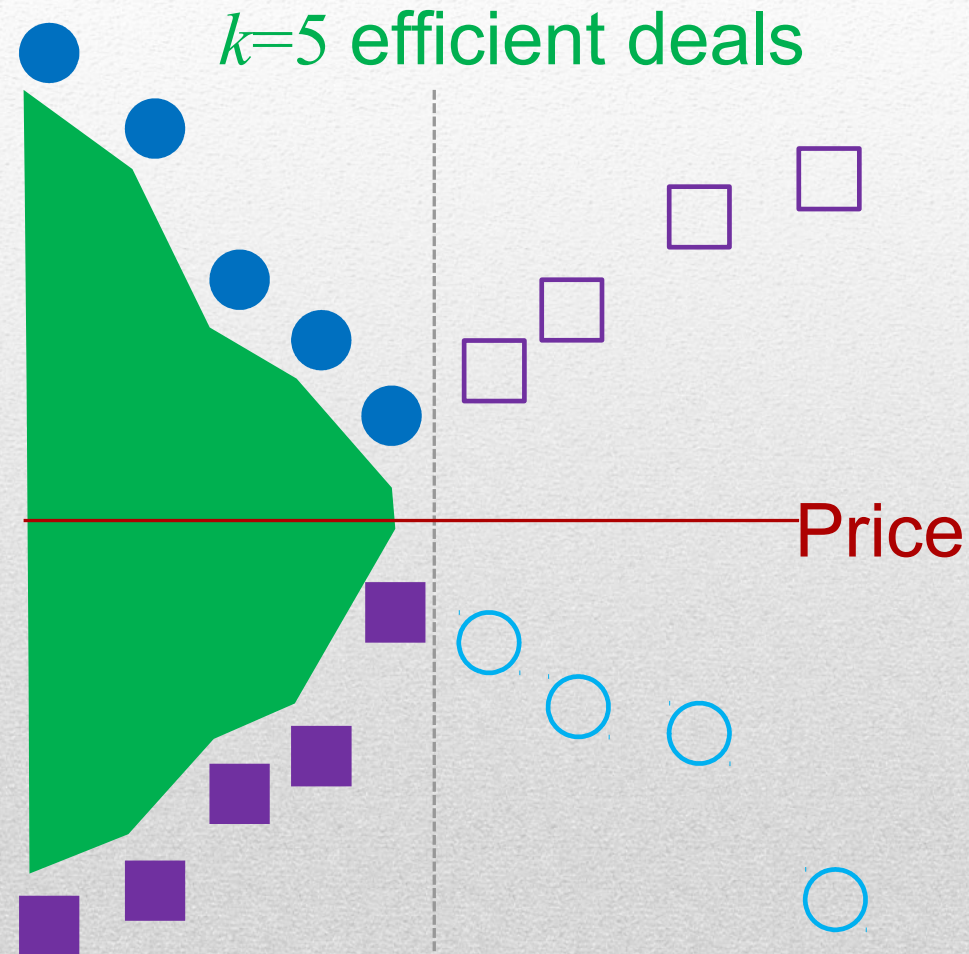
# Price Equilibrium

- ✓ Maximum gain
- ✓ Handles traders with many item-types if they are *Gross-Substitutes* (= no complementarities)



# Price Equilibrium

- ✓ Maximum gain
- ✓ Handles traders with many item-types if they are *Gross-Substitutes* (= no complementarities)
- ✗ Not truthful





# Some related work

## Bayesian prior:

- Single-sided auction: Myerson [1981], Blumrosen and Holenstein [2008], Segal [2003], Chawla et al. [2007-2010], Yan [2011].
- Double auction: Xu et al. [2010], Loertscher et al. [2014], Blumrosen and Dobzinski [2014], Colini-Baldeschi et al. [2016].

## Prior-independent:

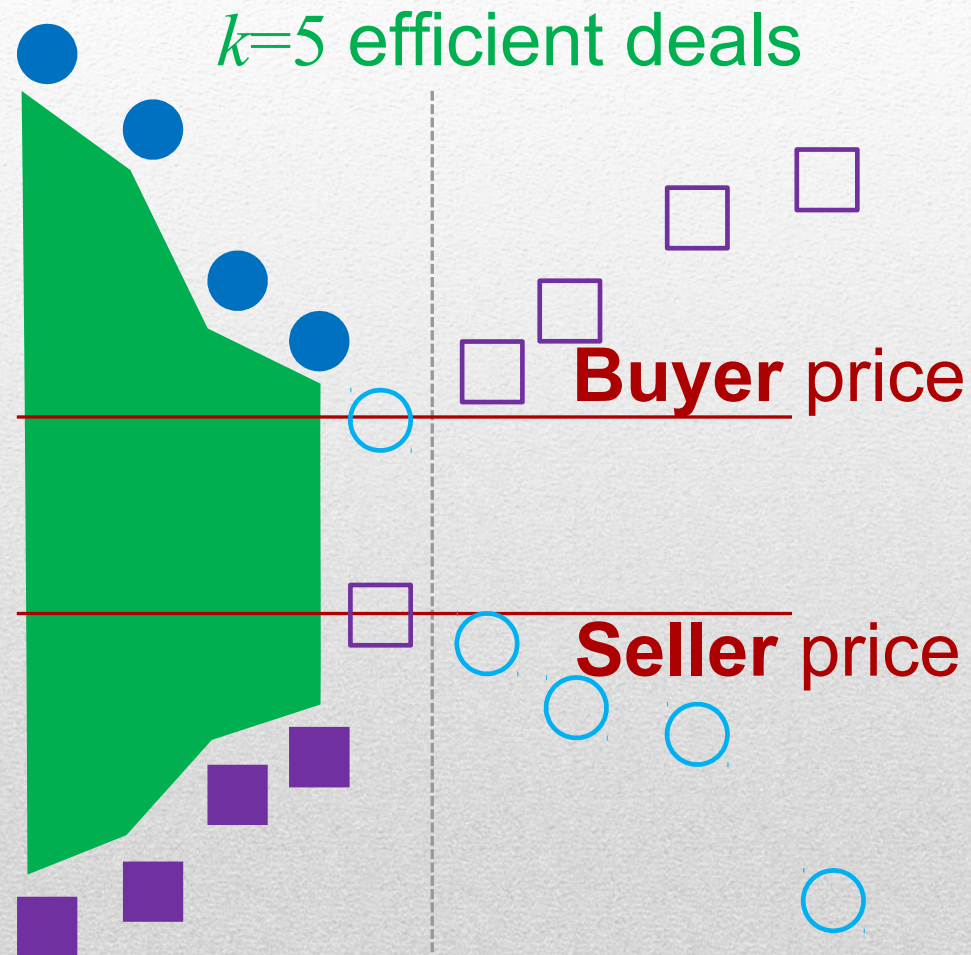
- Single-sided auction: Cole and Roughgarden [2014], Dhangwatnotai et al. [2015], Huang et al. [2015], Morgenstern and Roughgarden [2015], Devanur et al. 2011], Hsu et al. [2016].
- Double auction: Baliga and Vohra [2003] – single-parametric agents.

## Prior-free:

- Single-sided auction: Goldberg et al. [2001-2006], Devanur et al. [2015], Balcan et al. [2007-2008]
- Double auction: **McAfee [1992]** →

# McAfee (1992)

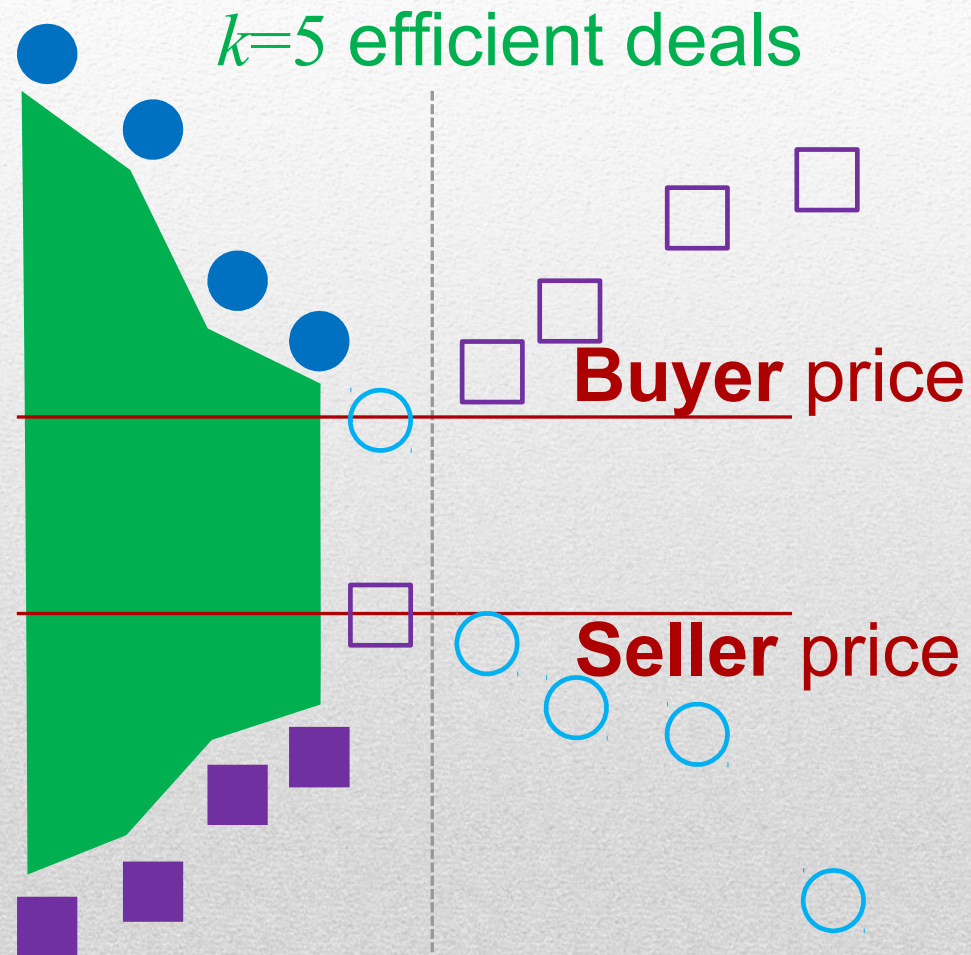
(simplified)



# McAfee (1992)

(simplified)

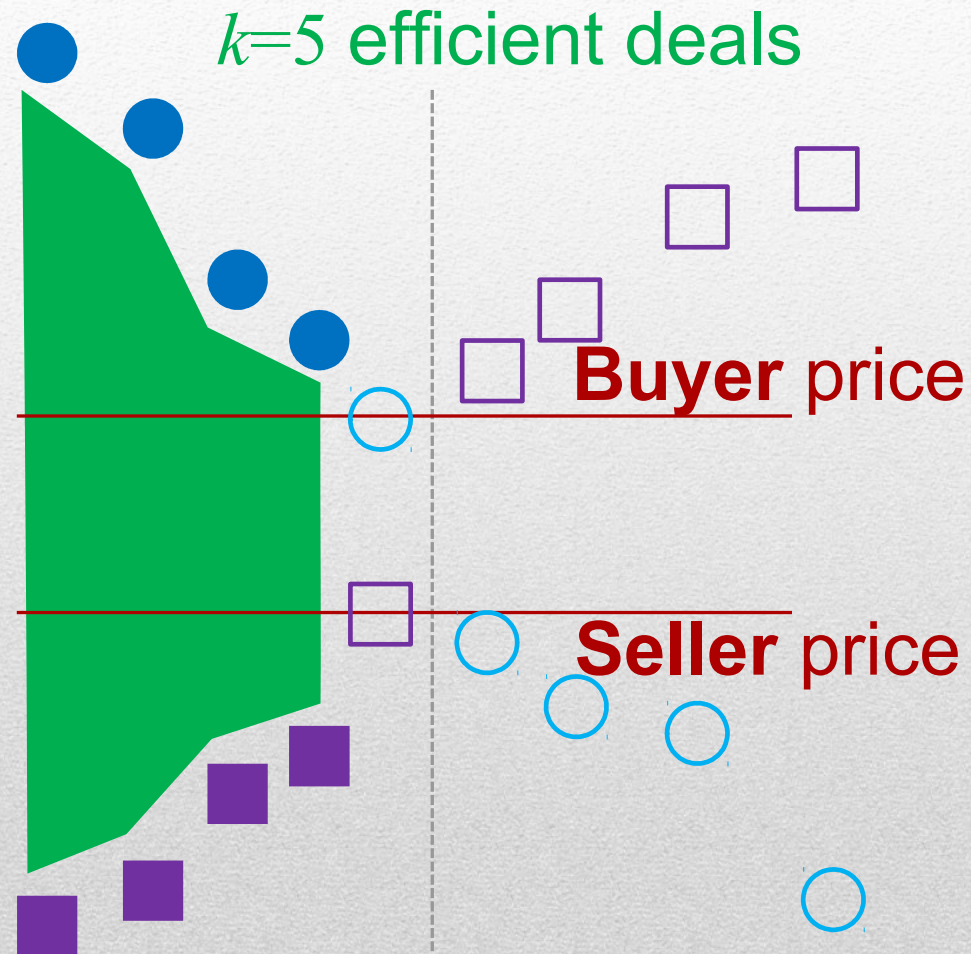
✓ Truthful



# McAfee (1992)

(simplified)

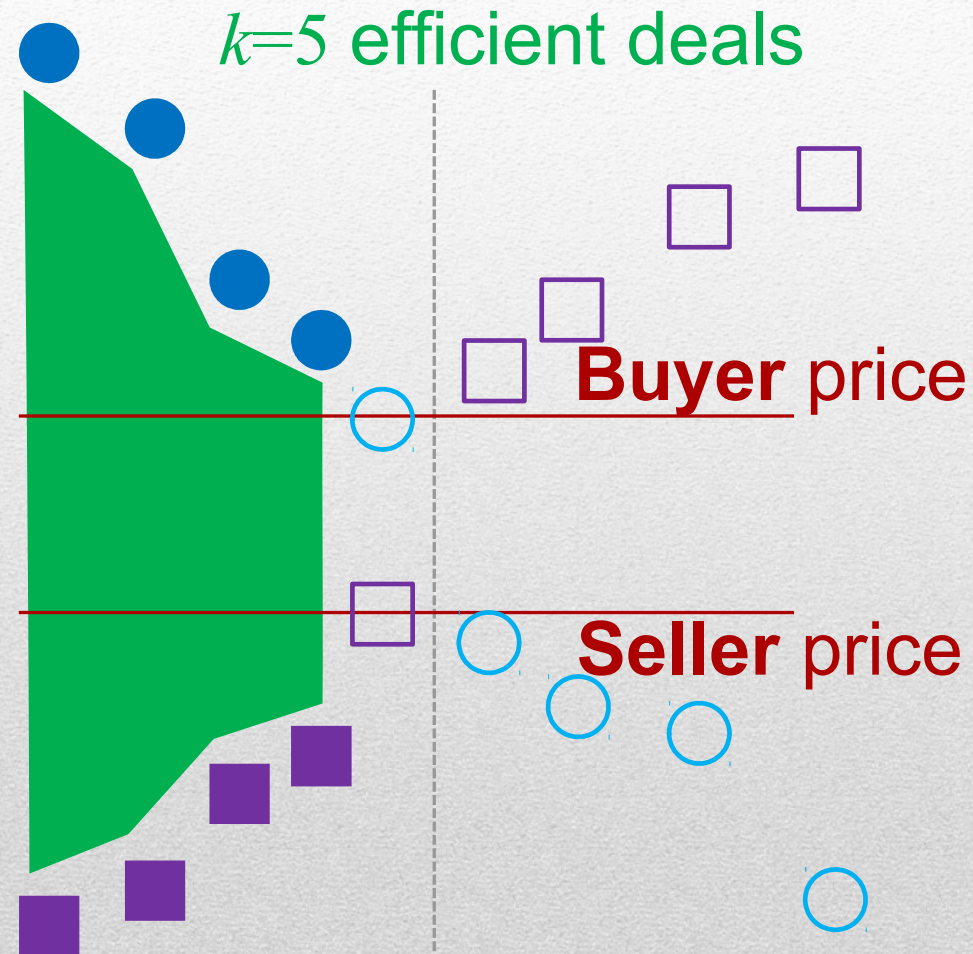
- ✓ Truthful
- ✓ Gain:  $(1 - 1/k)$  of maximum



# McAfee (1992)

(simplified)

- ✓ Truthful
- ✓ Gain:  $(1 - 1/k)$  of maximum
- ✗ Only single item-type, single-unit



# McAfee (1992)

(simplified)

- ✓ Truthful
- ✓ Gain:  $(1 - 1/k)$  of maximum
- ✗ Only single item-type, single-unit

## Extensions:

Babaioff et al. [2004-2006],

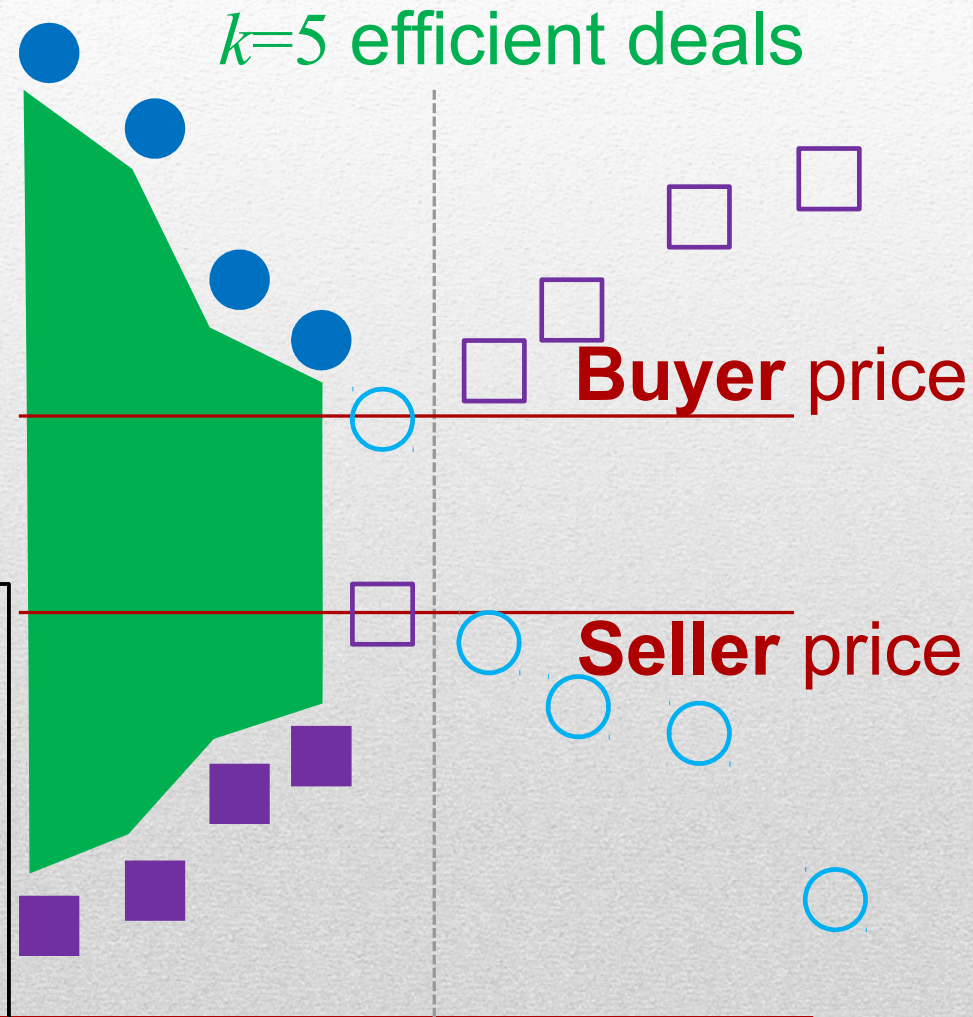
Gonen et al. [2007],

Duetting et al. [2014] –

Single-parametric agents.

Blumrosen & Dobzinsky [2014] -

Single item-type, Gain  $\sim 1/48$ .



# Prior-Free Double-Auctions

	Tru	Gain	Agents
Equilibrium	No	1	Multi-parametric (Gross-substitute)
McAfee family	Yes	$1-o(1)$	Single-parametric / Single-item-type
<b>Our goal</b>	Yes	$1-o(1)$	Multi-parametric, multi-item-type

# Prior-Free Double-Auctions

	Tru	Gain	Agents
Our goal	Yes	1-o(1)	Multi-item-type

## Our current assumptions:

1. Buyers – at most  $g$  item-types, **gross-substitute**.  
Sellers – 1 item-type, **decreasing marginal gain**.
2. **Large market** – for each item-type  $x$ ,  $k_x \rightarrow \infty$ ;  
at most  $m$  units per seller;
3. **Bounded variability** –  $k_{max} / k_{min} \leq c$
4. **Generic valuations** – no ties.



# **MIDA: Multi Item Double-Auction**

a. Random halving.

b. Equilibrium calculation.

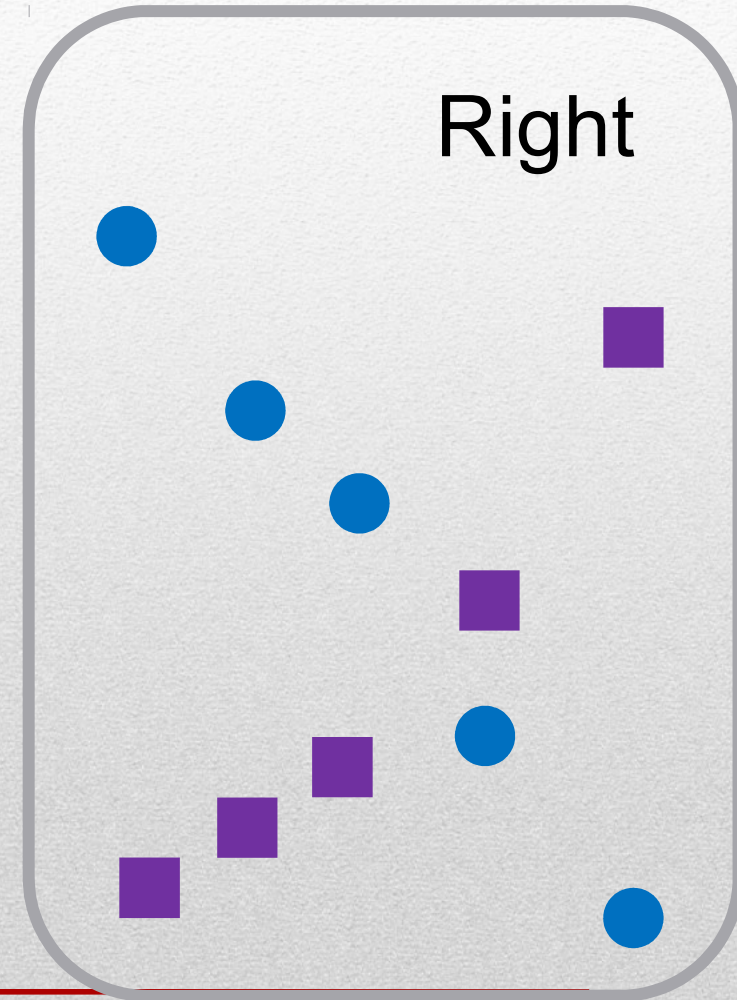
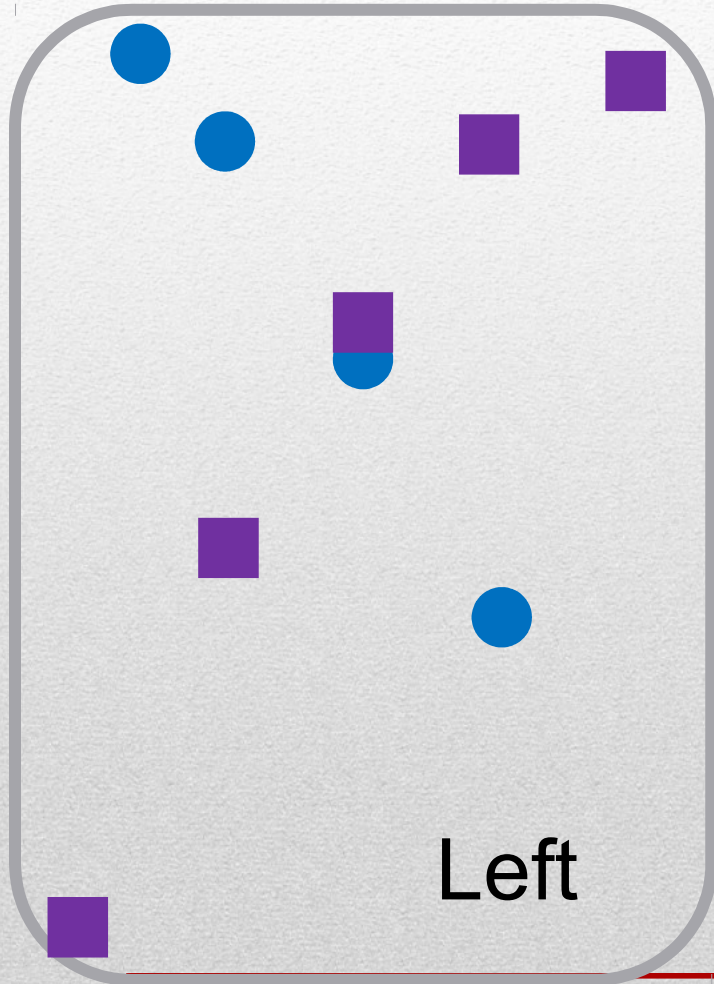
c. Posted pricing.

d. Random serial dictatorship.

# MIDA step a: Random Halving

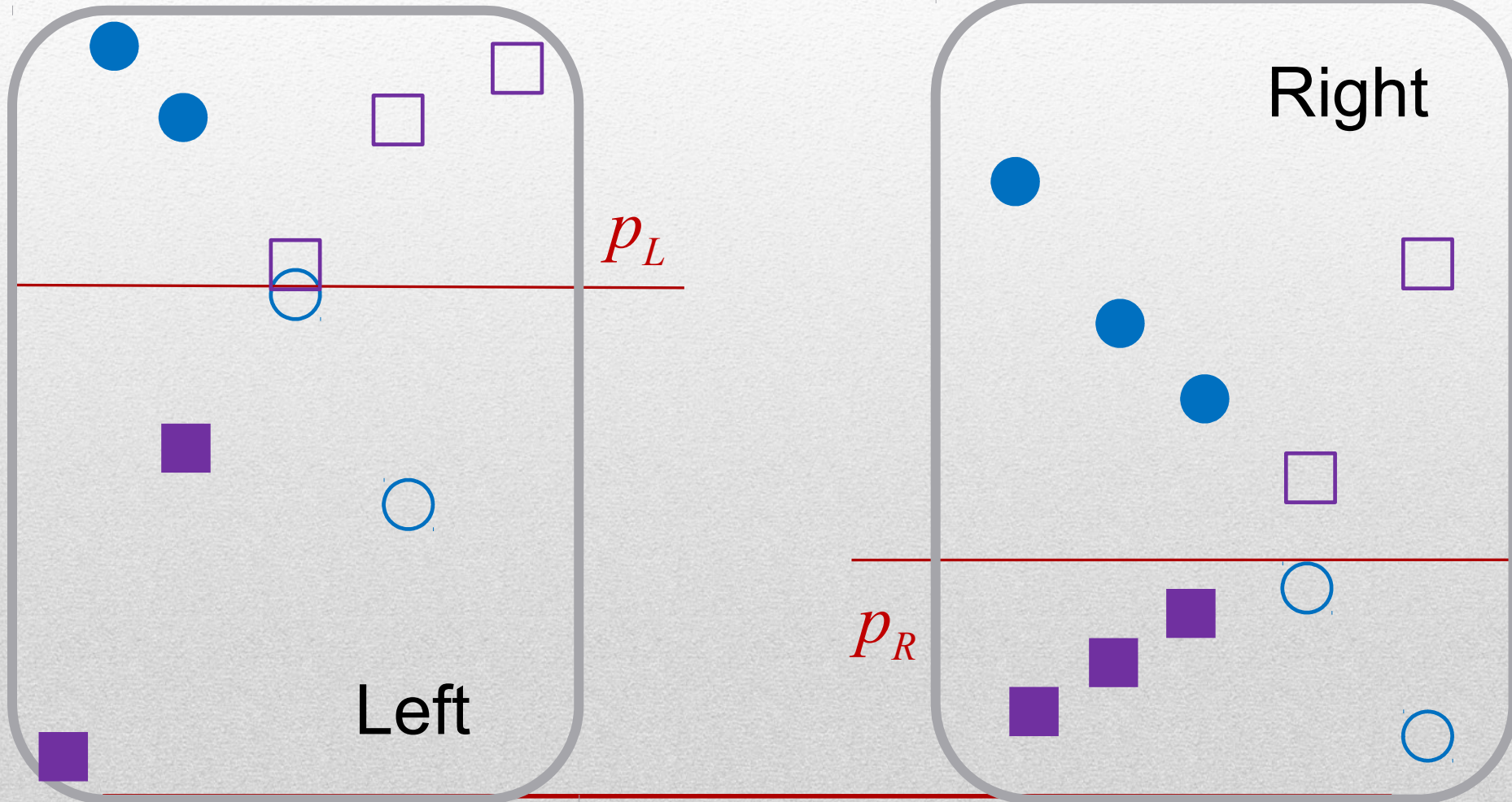


# MIDA step a: Random Halving

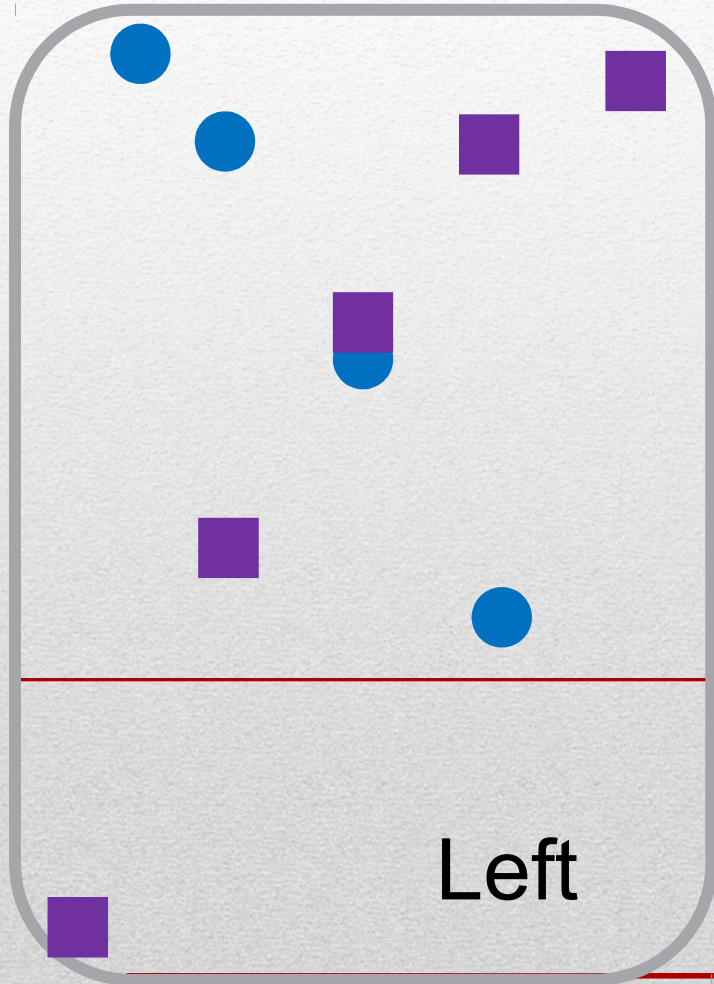


# MIDA step b: Equilibrium Calculation

*Gross-substitute traders → price-equilibrium exists.*

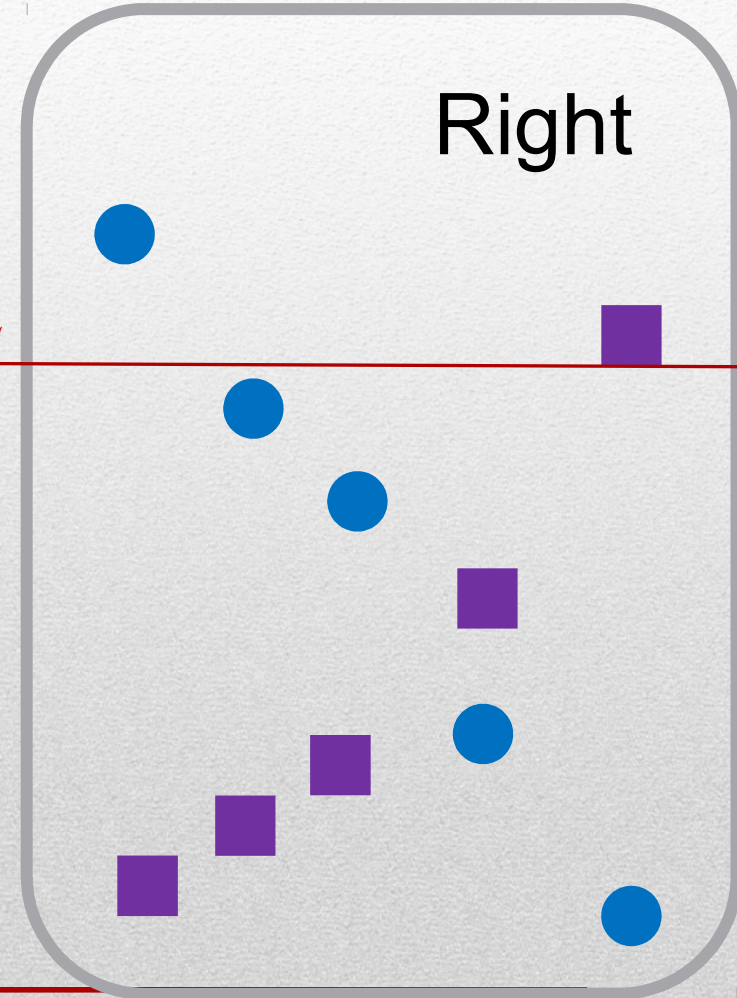


# MIDA step c: Posted Pricing



Left

$p_R$

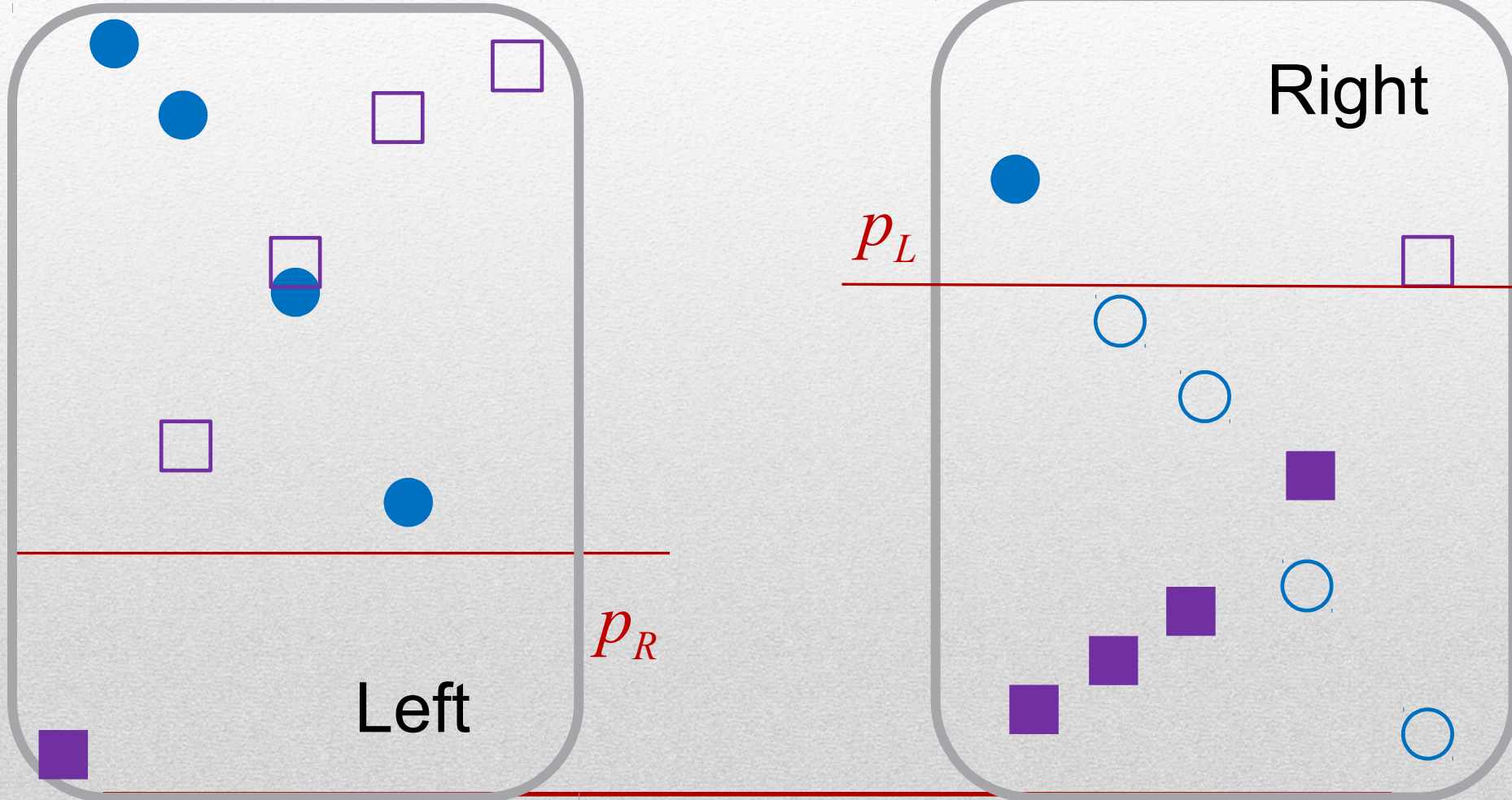


Right

$p_L$

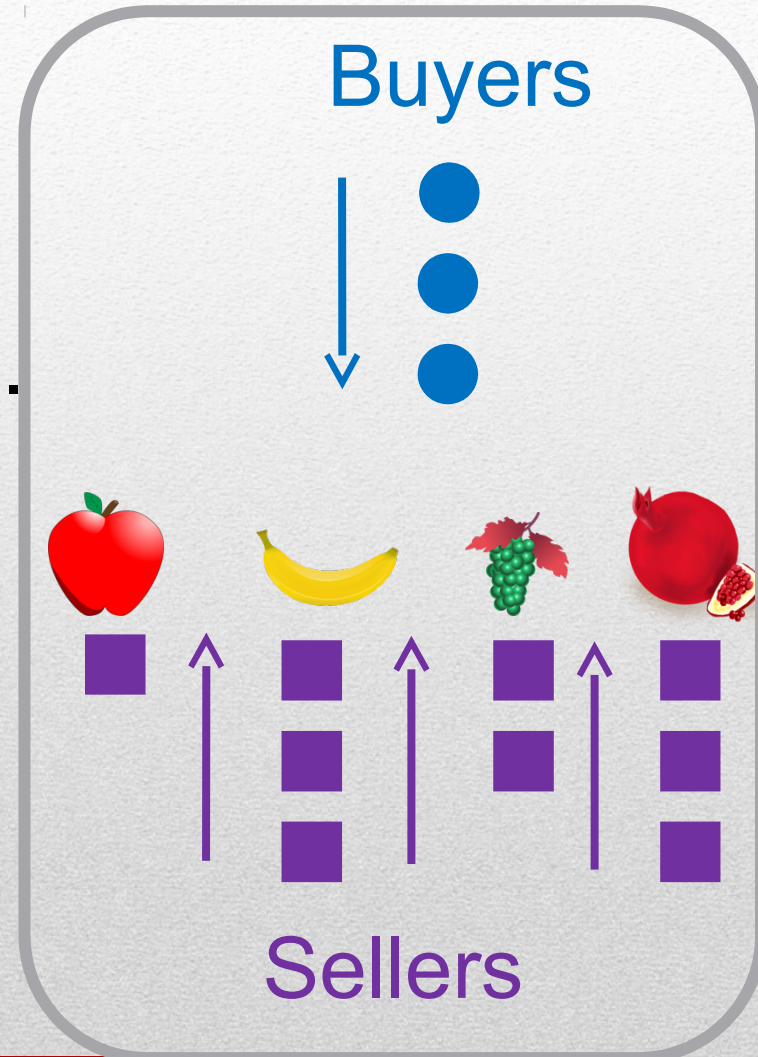
# MIDA step d: Random Dictatorship

*In case of over-demand/supply – randomize.*



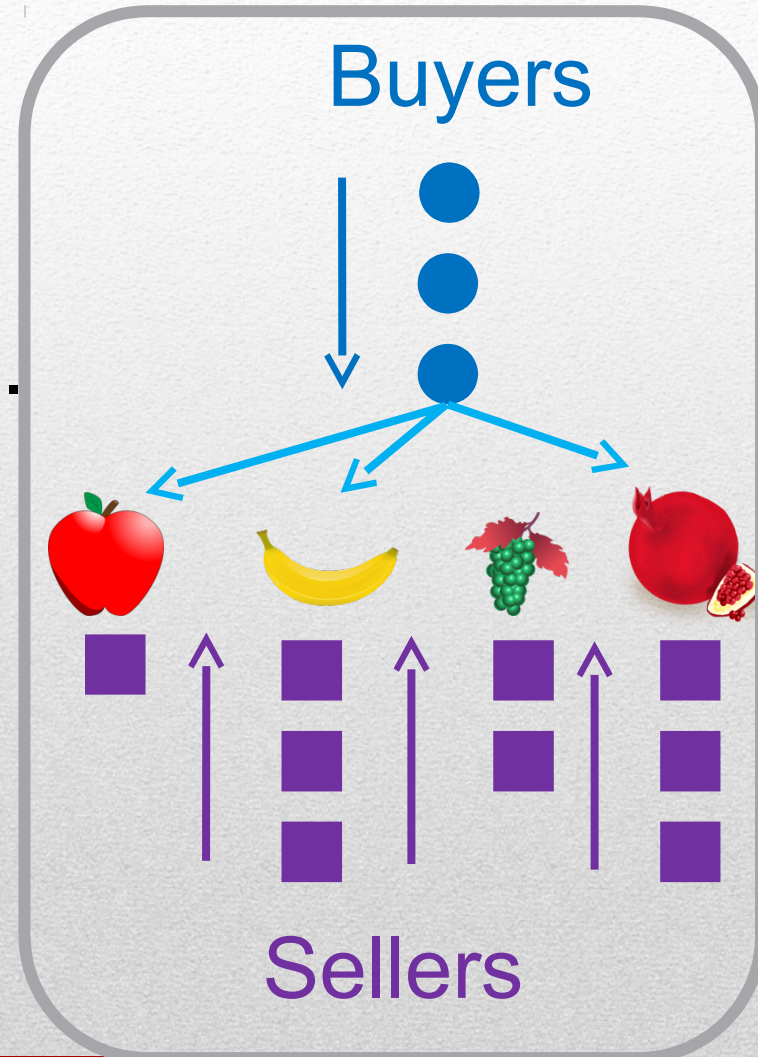
# MIDA step d: Random Dictatorship

- Order buyers randomly;
- Order sellers randomly;
- First buyer buys from first sellers and goes home.
- Seller goes home when marginal gain  $< 0$ .



# MIDA step d: Random Dictatorship

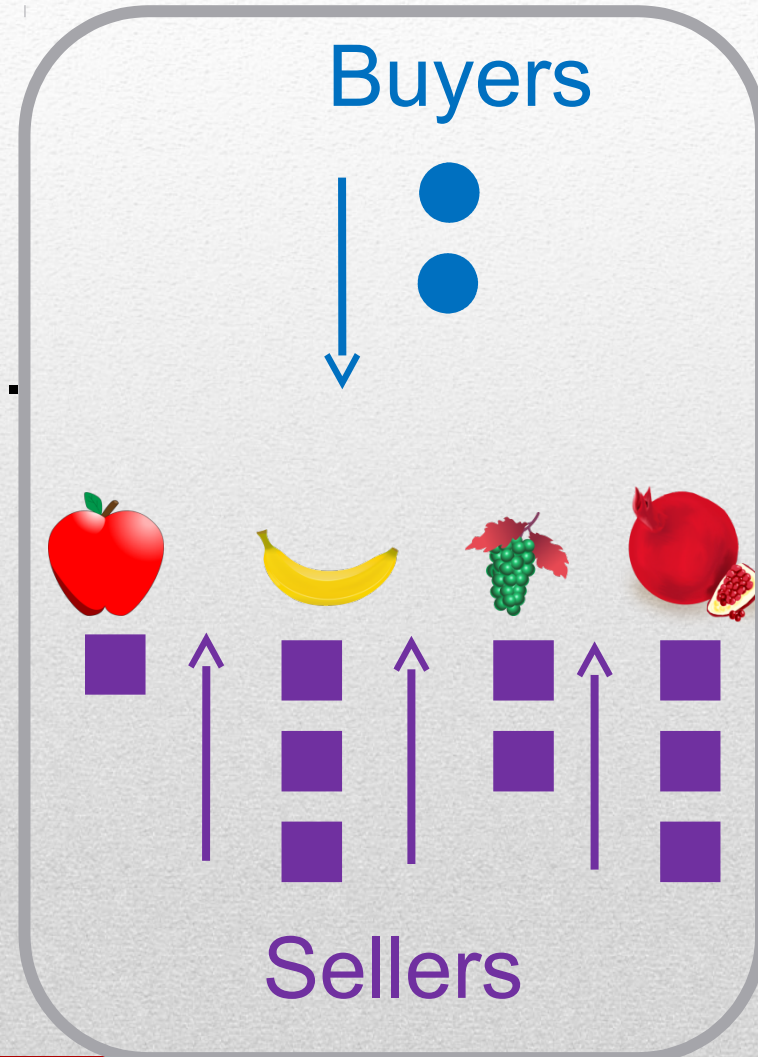
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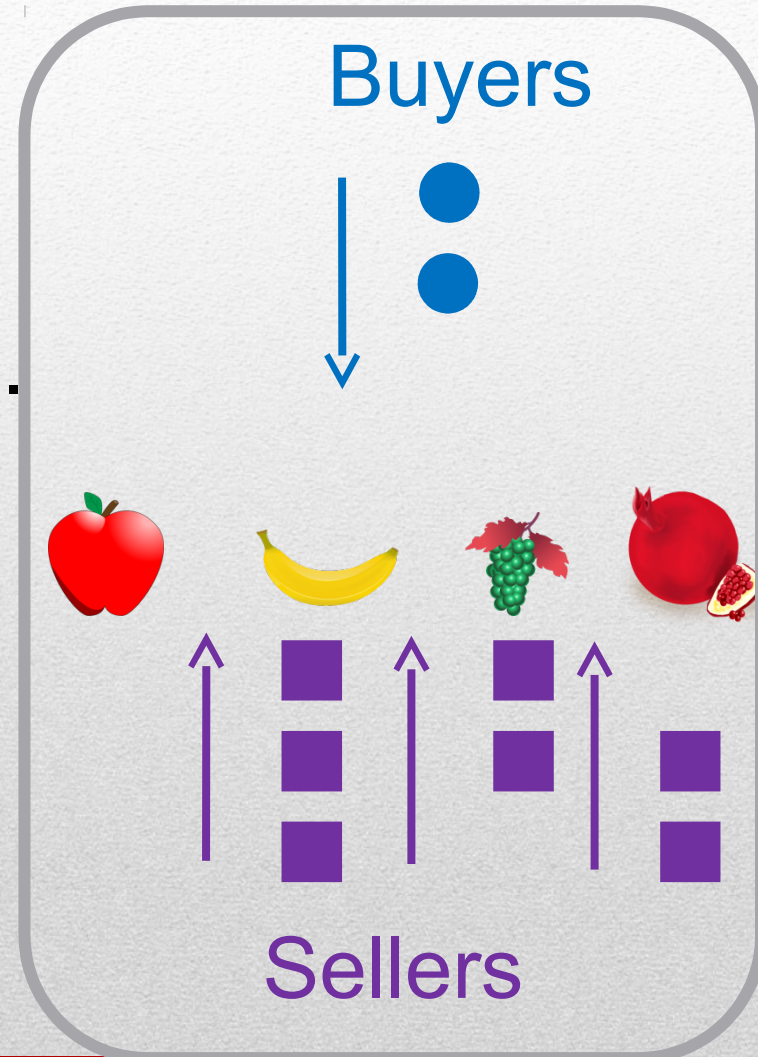
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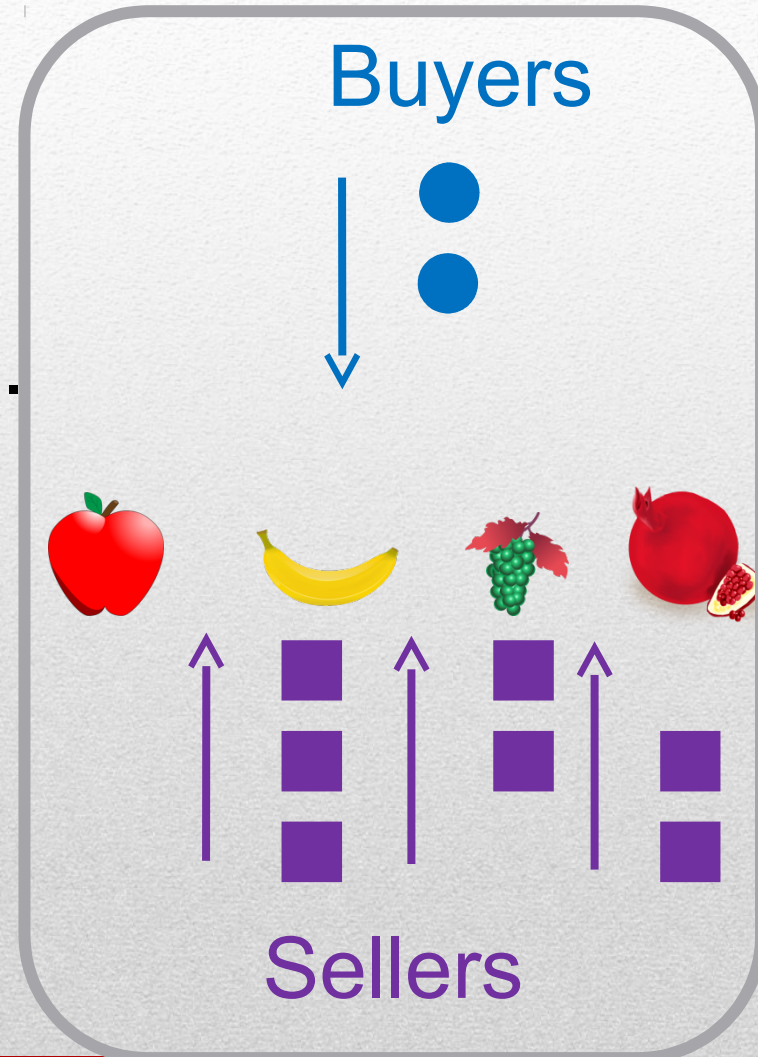
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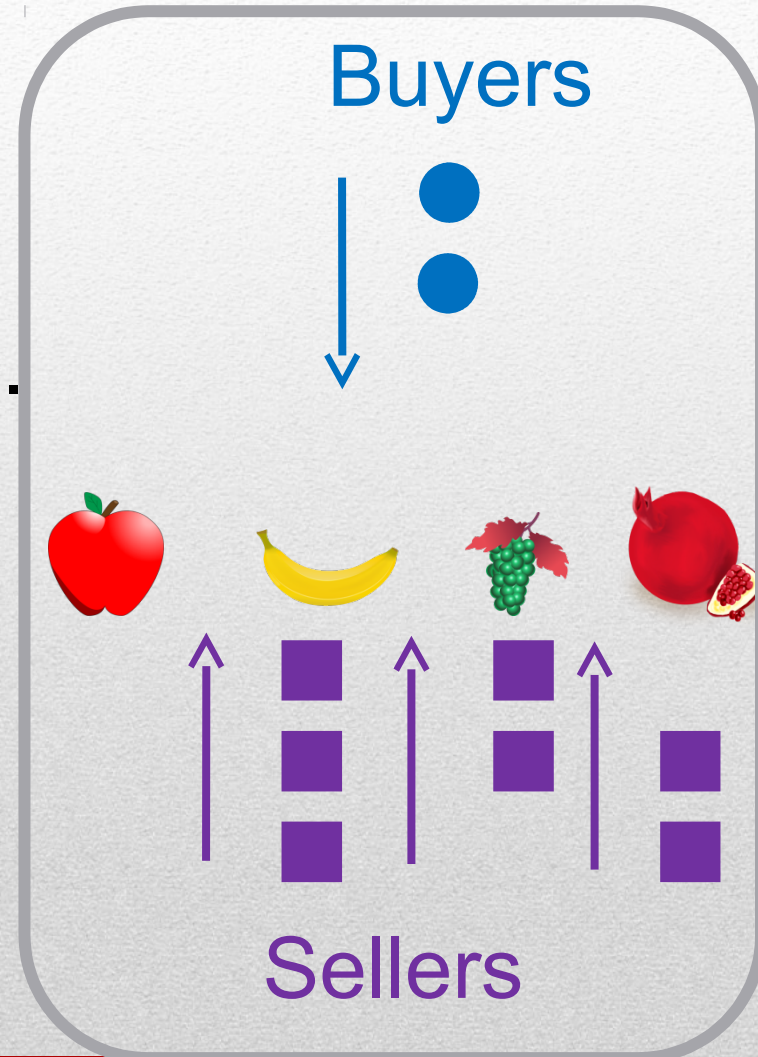
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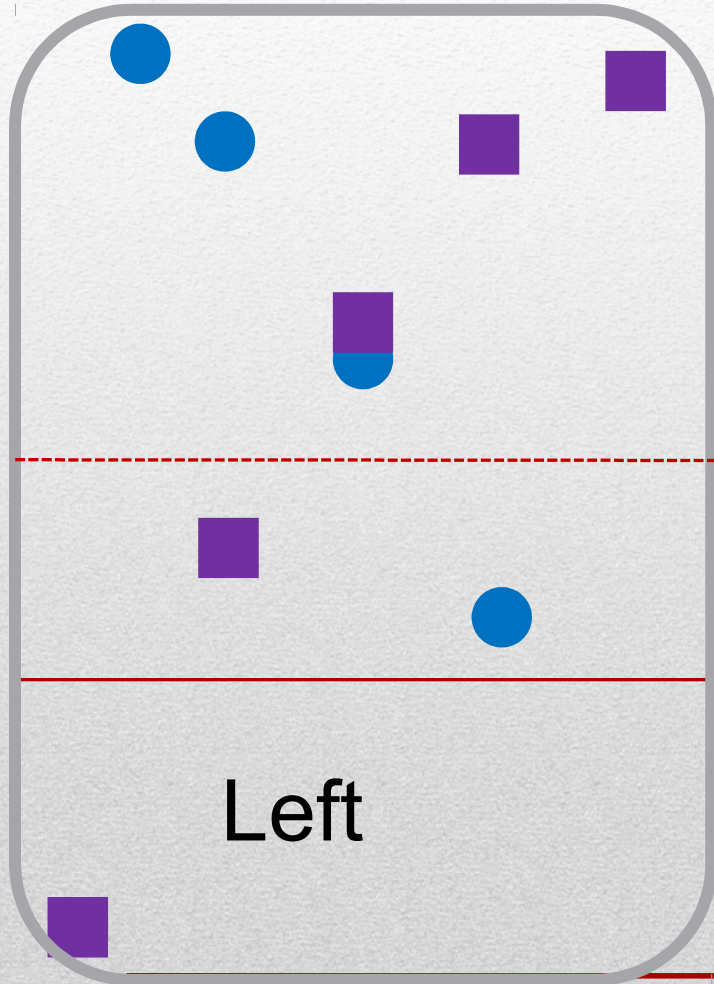
**Theorem:** If each seller sells one item-type and has decreasing-marginal-gains, then MIDA is truthful.



**MIDA:  
Estimating the  
gain-from-trade**

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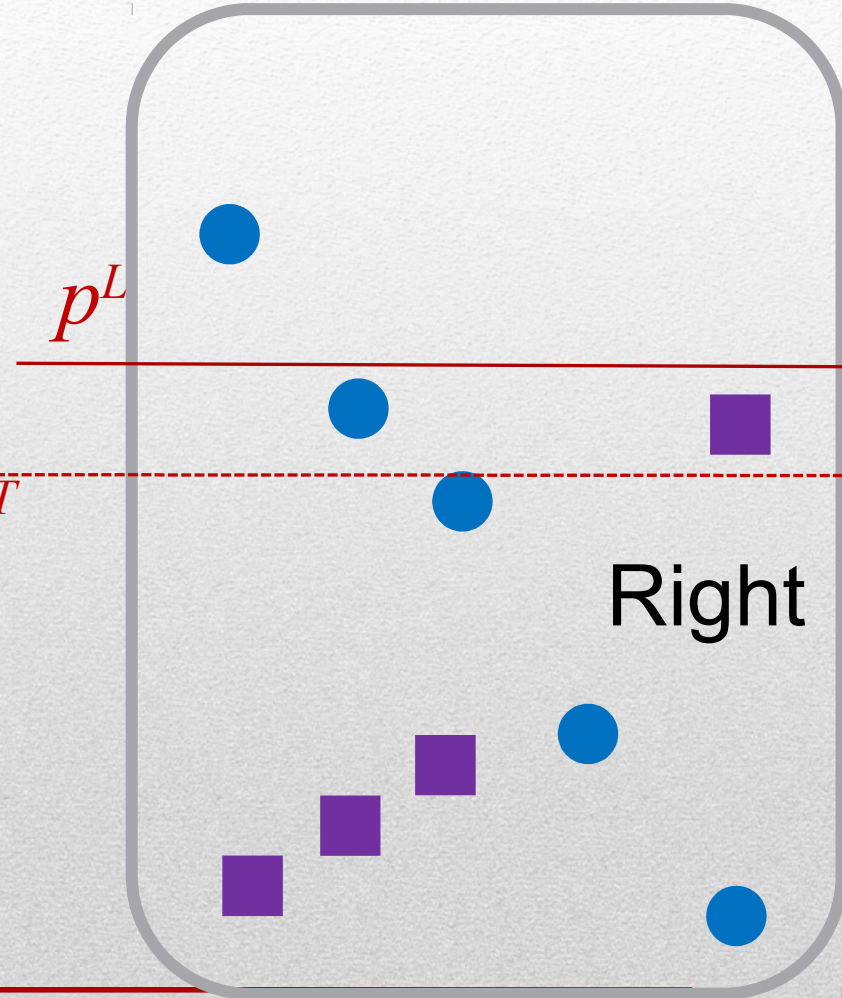
# Four ways to lose gain-from-trade



Left

Erel Segal-Halevi et al

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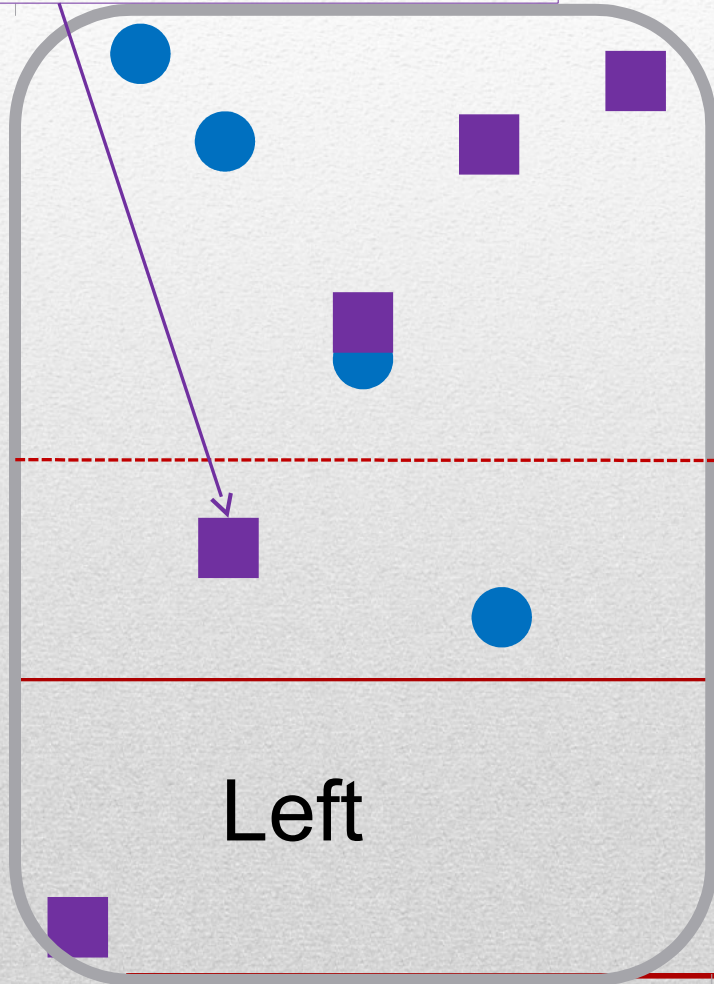


Right

Multi Item Double Auction

# Four ways to lose gain-from-trade

Efficient sellers quitting:  
loss for buyers

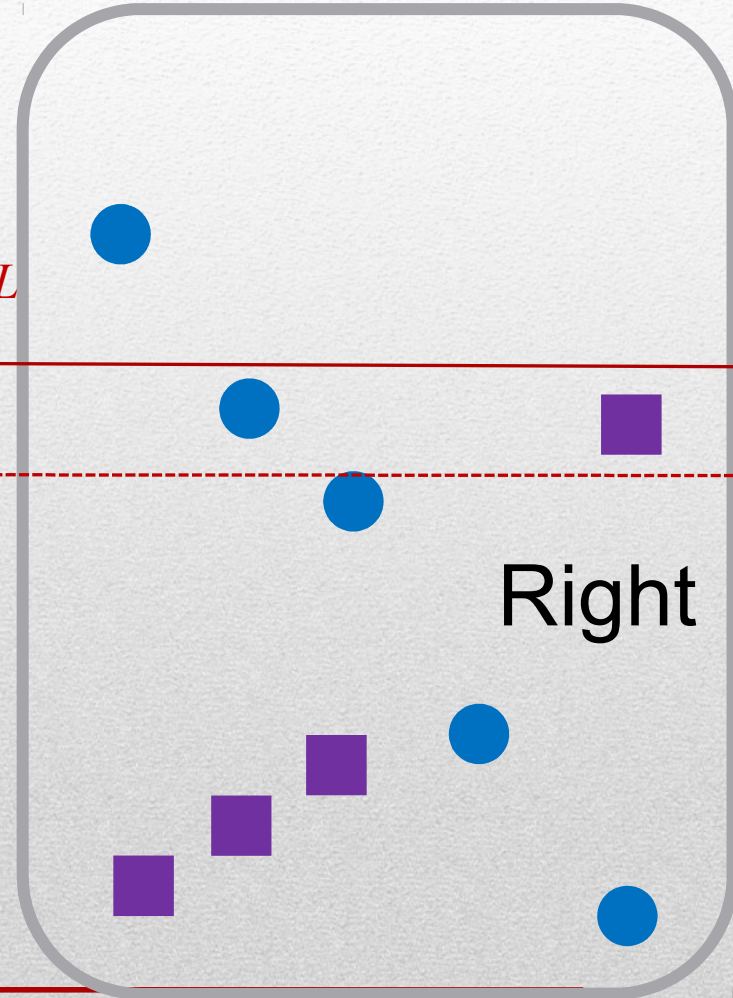


Left

$p^R$

$p^{OPT}$

$p^L$



Right



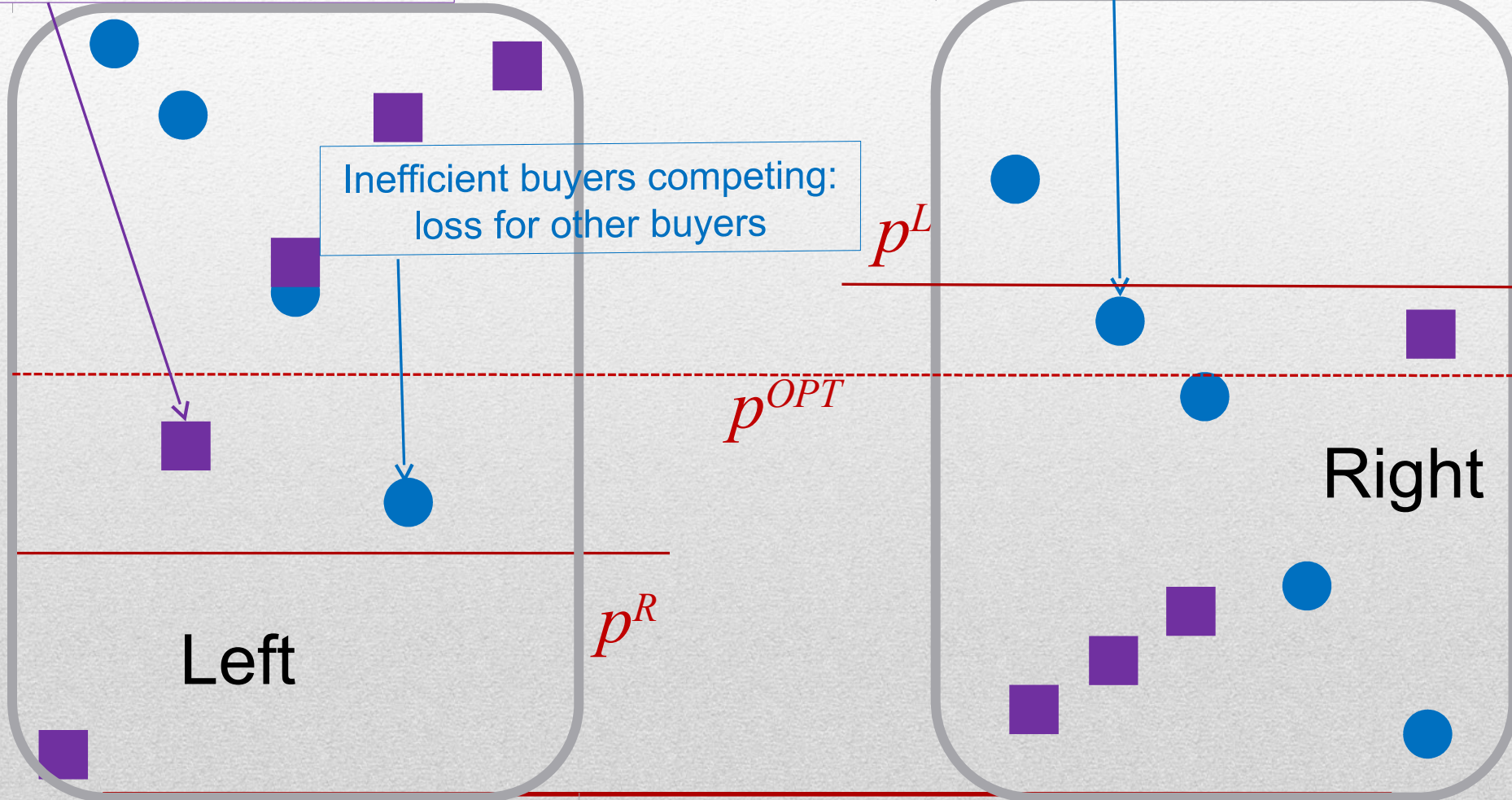


# Four ways to lose gain-from-trade

Efficient sellers quitting:  
loss for buyers

Inefficient buyers competing:  
loss for other buyers

Efficient buyers quitting



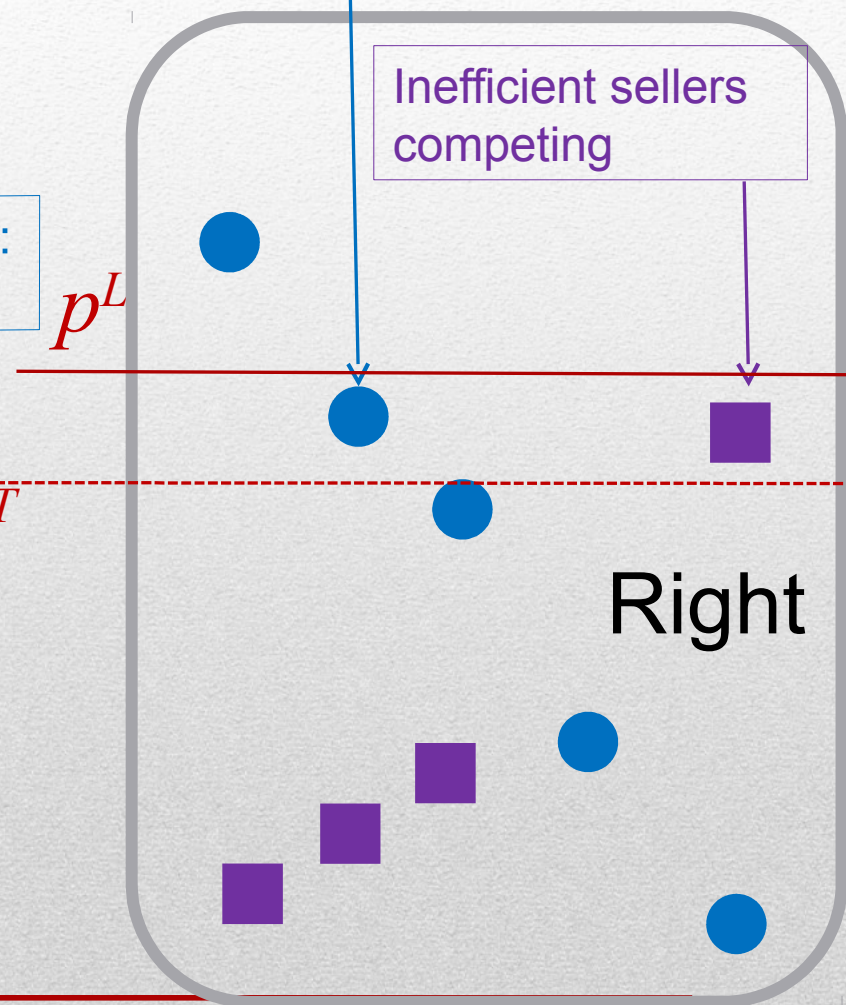
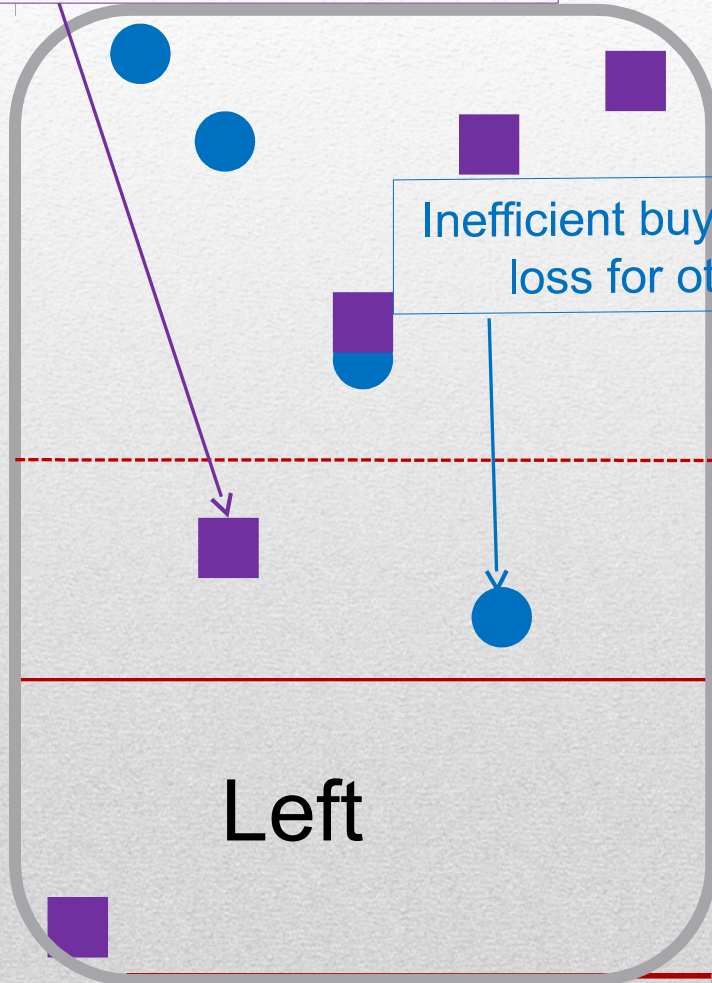
# Four ways to lose gain-from-trade

Efficient sellers quitting:  
loss for buyers

Inefficient buyers competing:  
loss for other buyers

Efficient buyers quitting

Inefficient sellers competing



# Four ways to lose gain (left market)

For every item-type  $x$ , define:

- $B_{x^*}$  – buyers who want  $x$  in  $p^{OPT}$
- $B_{x-}$  – buyers who want  $x$  in  $p^{OPT}$  but not in  $p^R$
- $B_{x+}$  – buyers who want  $x$  in  $p^R$  but not in  $p^{OPT}$
- $S_{x^*}$  – sellers who offer  $x$  in  $p^{OPT}$
- $S_{x-}$  – sellers who offer  $x$  in  $p^{OPT}$  but not in  $p^R$
- $S_{x+}$  – sellers who offer  $x$  in  $p^R$  but not in  $p^{OPT}$

We lose  $|B_{x-}| + |S_{x+}|$  random sellers and  $|S_{x-}| + |S_{x+}|$  random buyers. So:

$$\mathbf{E}[Loss_x] \leq (|B_{x-}| + |B_{x+}| + |S_{x-}| + |S_{x+}|) / |B_{x^*}|$$

# Bounding the loss

$$\mathbf{E}[Loss_x] \leq (|B_{x^-}| + |B_{x^+}| + |S_{x^-}| + |S_{x^+}|) / k_x$$

**Price-equilibrium equations:** for every  $x$ :

Global population:  $|B_{x^*}| = |S_{x^*}| = k_x$

Right market ( $^R =$  the subset sampled to Right):

$$|B_{x^*}{}^R| + |B_{x^+}{}^R| - |B_{x^-}{}^R| = |S_{x^*}{}^R| + |S_{x^+}{}^R| - |S_{x^-}{}^R|$$

# Bounding the loss

$$\mathbf{E}[Loss_x] \leq (|B_{x^-}| + |B_{x^+}| + |S_{x^-}| + |S_{x^+}|) / k_x$$

**Price-equilibrium equations:** for every  $x$ :

Global population:  $|B_{x^*}| = |S_{x^*}| = k_x$

Right market ( $R =$  the subset sampled to Right):

$$|B_{x^*}^R| + |B_{x^+}^R| - |B_{x^-}^R| = |S_{x^*}^R| + |S_{x^+}^R| - |S_{x^-}^R|$$

**Concentration bounds:** w.h.p:

$$\left| |B_{x^*}^R| - |B_{x^*}|/2 \right| < err_x$$

$$\left| |S_{x^*}^R| - |S_{x^*}|/2 \right| < err_x$$

$$err_x = m \sqrt{k_x \ln k_x}$$

# Bounding the loss

$$\mathbf{E}[Loss_x] \leq (|B_{x-}| + |B_{x+}| + |S_{x-}| + |S_{x+}|) / k_x$$

**Price-equilibrium + Concentration bounds:**

With high probability:

$$||B_{x-}^R| - |B_{x+}^R|| < 2 \text{err}_x$$

$$||S_{x-}^R| - |S_{x+}^R|| < 2 \text{err}_x$$

# Bounding the loss

$$\mathbf{E}[Loss_x] \leq (|B_{x-}| + |B_{x+}| + |S_{x-}| + |S_{x+}|) / k_x$$

## Price-equilibrium + Concentration bounds:

With high probability:

$$||B_{x-}^R| - |B_{x+}^R|| < 2 \text{err}_x$$

$$||S_{x-}^R| - |S_{x+}^R|| < 2 \text{err}_x$$

Let's focus on the buyers.

- We **have** bounds on:  $||B_{x-}^R| - |B_{x+}^R||$
- We **need** bounds on:  $|B_{x-}|$  ,  $|B_{x+}|$

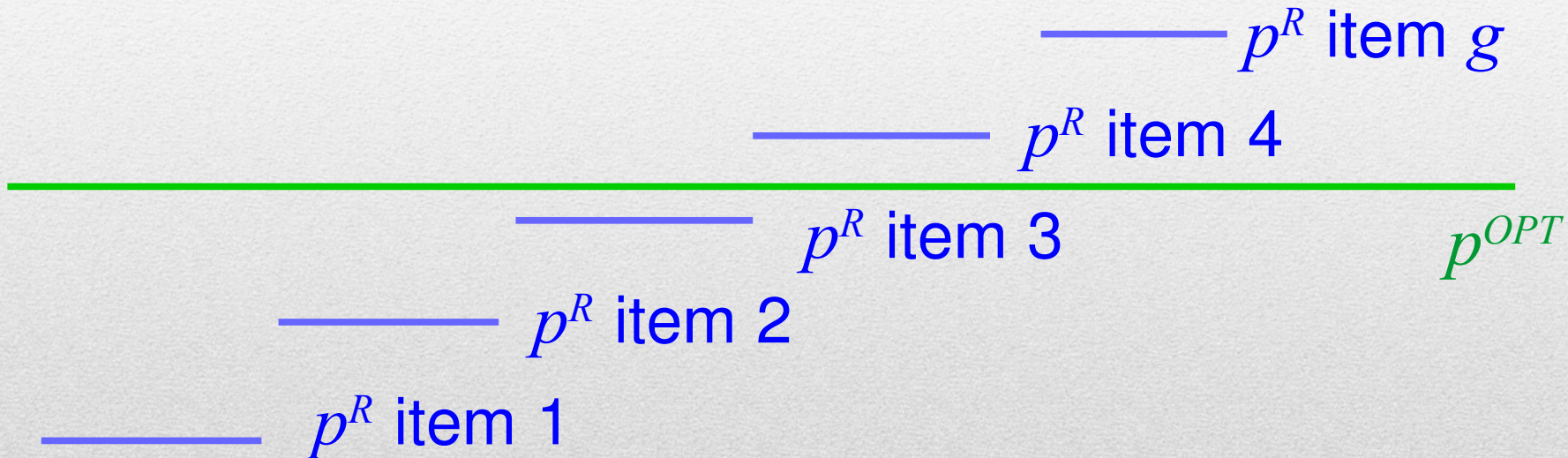
# Bounding the loss: step A

- We have bounds:  $||\mathbf{B}_{x^-}^R| - |\mathbf{B}_{x^+}^R|| < 2 \text{ err}_x$   
 $||\mathbf{B}_{1^-}^R| - |\mathbf{B}_{1^+}^R|| < 2 \text{ err}_1$   
 $||\mathbf{B}_{2^-}^R| - |\mathbf{B}_{2^+}^R|| < 2 \text{ err}_2$   
 $\dots ||\mathbf{B}_{g^-}^R| - |\mathbf{B}_{g^+}^R|| < 2 \text{ err}_g$
- We derive bounds on:  $|\mathbf{B}_{x^-}^R|$  ,  $|\mathbf{B}_{x^+}^R|$



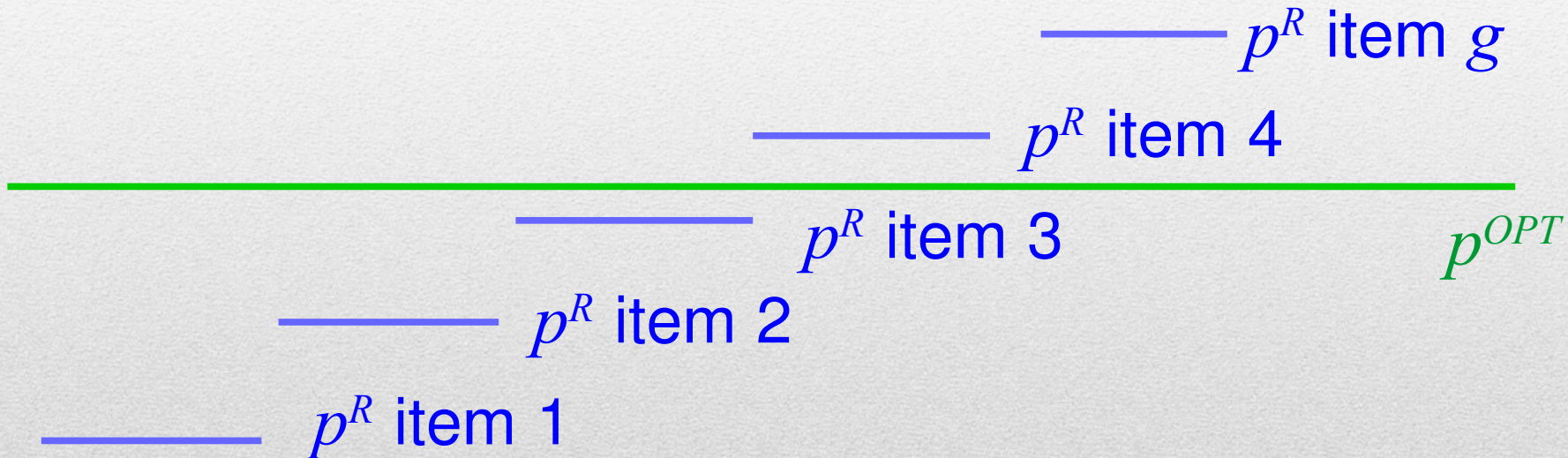
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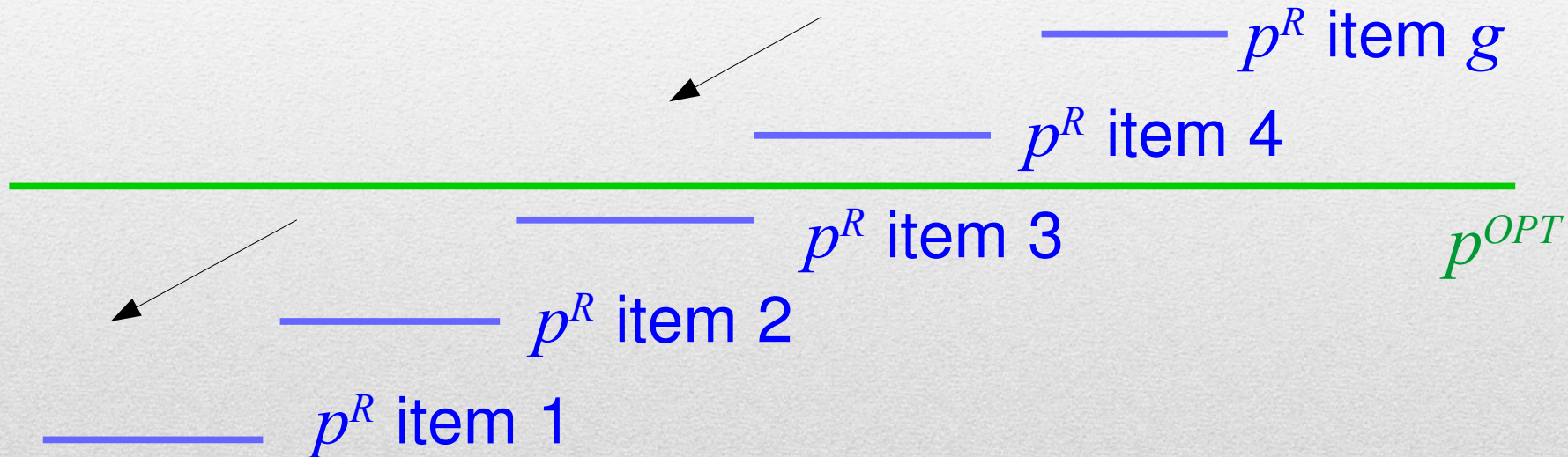
- We have bounds:  $||B_{x^-}^R| - |B_{x^+}^R|| < 2 \text{err}_x$
- We derive bounds on:  $|B_{x^-}^R|$  ,  $|B_{x^+}^R|$



**Theorem:** The demand of gross-substitute agents moves only downwards (Segal-Halevi et al, 2016).

# Bounding the loss: step A

- We have bounds:  $||B_{x^-}^R| - |B_{x^+}^R|| < 2 \text{err}_x$
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**Theorem:** The demand of gross-substitute agents moves only downwards (Segal-Halevi et al, 2016).

# Bounding the loss: step A

- We **have** bounds:  $\left| |B_{x-}^R| - |B_{x+}^R| \right| < 2 \text{err}_x$
- We **derive** bounds on:  $|B_{x-}^R|$  ,  $|B_{x+}^R|$

For every item  $x$  that became cheaper:  $B_{x-}^R \subseteq \bigcup_{y < x} B_{y+}^R$

- $\left| |B_{1-}^R| - |B_{1+}^R| \right| < 2 \text{err}_{\max}$   
 $\left| |B_{2-}^R| - |B_{2+}^R| \right| < 2 \text{err}_{\max}$   
...  $\left| |B_{g-}^R| - |B_{g+}^R| \right| < 2 \text{err}_{\max}$
- $|B_{1-}^R| = 0 \rightarrow |B_{1+}^R| < 2 \text{err}_{\max}$   
 $|B_{2-}^R| < 2 \text{err}_{\max} \rightarrow |B_{2+}^R| < 4 \text{err}_{\max}$   
...  $|B_{g-}^R| < 2^g \text{err}_{\max}$  ,  $|B_{g+}^R| < 2^g \text{err}_{\max}$

# Bounding the loss: step B

- We have a bound:  $|B_{x^-}^R|, |B_{x^+}^R| < 2^g \text{err}_{max}$
- We need a bound on:  $|B_{x^-}|, |B_{x^+}|$

- When  $T$  is a **deterministic set** – (like  $B_{x^*}$ ) –  
determined **before** randomization –

$$\text{w.h.p: } \left| |T^R| - |T|/2 \right| < \sqrt{|T| \ln |T|}$$

$B_{x^-}$  and  $B_{x^+}$  are **random sets** - depend on price  
– determined **after** randomization!

Our solution: bound the **UI dimension** of  $B_{x^-}, B_{x^+}$

# UI Dimension of Random Sets

**UI Dimension** – property of a random-set.

If  $\text{UIDim}(T) \leq d$  then (Segal-Halevi et al, 2017):

$$\text{w.h.p: } \left| |T^R| - |T|/2 \right| < d \cdot \sqrt{|T| \ln |T|}$$

**1. Containment-Order Rule:** If the support of  $T$  is ordered by containment, then  $\text{UIDim}(T) \leq 1$ .

**2. Union Rule:**

$$\text{UIDim}(T_1 \cup T_2) \leq \text{UIDim}(T_1) + \text{UIDim}(T_2)$$

**3. Intersection Rule:** If  $|T_1| < t$  then:

$$\text{UIDim}(T_1 \cap T_2) \leq \log(t) * (\text{UIDim}(T_1) + \text{UIDim}(T_2))$$

# Bounding the loss: step B

- We have a bound:  $|B_{x-}^R|, |B_{x+}^R| < 2^g \text{err}_{max}$
- We derive a bound on:  $|B_{x-}|, |B_{x+}|$

**Lemma:** For every item-type  $x$ :

$$B_{x-} = B_{x*} \cap \bigcap_{X \ni x} \left( \bigcup_{Y \not\ni x} \mathbb{B}_{X \prec Y} \right) \implies \text{UIDim}(B_{x-}) \leq 2^{2g} \ln k_{\max}$$

Similarly:  $\text{UIDim}(B_{x+}) \leq 2^{2g} \ln k_{\max}$

**Corollary:** When  $k_{\max} \gg 2^{3g}$ , w.h.p:

$$|B_{x-}|, |B_{x+}| < 3 * (2^g \text{err}_{max})$$

# Bounding the loss: step C

- We have a bound:  $|B_{x-}|, |B_{x+}| < 3 * 2^g * err_{max}$
- Similarly:  $|S_{x-}|, |S_{x+}| < 3 * 2^g * err_{max}$
- Lost deals in item x:  $< 12 * (2^g err_{max})$
- Lost gain in item x  $< 12 * (2^g err_{max}) / k_x$
- Lost gain overall  $< 12 * (2^g err_{max}) / k_{min}$
- Lost gain overall  $< Const * o(k_{max}) / k_{min}$

**Theorem:** Under large-market assumptions, gain-from-trade of MIDA approaches maximum.



# Prior-Free Double-Auctions

	Tru	Gain	Agents
Equilibrium	No	1	Multi-parametric (Gross-substitute)
McAfee family	Yes	$1-o(1)$	Single-parametric / Single-item-type
MIDA	Yes	$1-o(1)$	Multi-parametric (Sellers: 1 type, Buyers: $g$ types, Gross-substitute).

# Acknowledgments

- Game theory seminar in BIU
- Ron Peretz
- Simcha Haber
- Tom van der Zanden
- Assaf Romm
- Economic theory seminar in HUJI
- Econ.&Comp. seminar in HUJI
- Algorithms seminar in TAU

**Thank you!**