# Mechanism Design with Approximate Valuations 

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## Mechanism Design

generate good outcomes for data you don't have

## Mechanism Design

generate good outcomes for data you don't have by leveraging the players' KNOWLEDGE and RATIONALITY

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KNOWLEDGE and RATIONALITY

## classically

YES, if player's self-knowledge is EXACT

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## classically

YES, if player's self-knowledge is EXACT

## TODAY

YES, if player's self-knowledge is APPROXIMATE
(in single-good auctions)

## Rolex Auction

## GOAL

give Rolex to player who values it the most (max. social welfare)



1


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## Rolex Auction

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## Rolex Auction


use auction mechanism to extract information from the players

## Rolex Auction



## Rolex Auction


bidding true valuation is a (very weakly) dominant strategy

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## Rolex Auction

winner = player with max bid
winner's price $=2^{\text {nd }}$ highest bid

bidding true valuation is a (very weakly) dominant strategy

## WARNING!

## optimal performance from an

 ASSUMPTION:
## WARNING!

## optimal performance from an ASSUMPTION:

each player knows his own valuation exactly


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Either:

(a) it does not make any difference (b) exact knowledge is VERY strong assumption

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## WEAKER ASSUMPTION: Bayesian? each player knows his own individual Bayesian



## WEAKER ASSUMPTION: Bayesian?

 each player knows his own individual Bayesian same second-price mechanism: just truthfully bid your expected value

## WEAKER ASSUMPTION: Bayesian?

 each player knows his own individual Bayesian

Does player 2 really know that $\operatorname{Pr}(16 \mathrm{k})=1.5 \operatorname{Pr}(16.6 \mathrm{k})$ ?
If no, and it matters, still very strong!

## NEED

## A <br> MORE CONSERVATIVE MODEL

## OUR APPROXIMATE KNOWLEDGE MODEL

## OUR APPROXIMATE KNOWLEDGE MODEL

## each player approximately knows his valuation



## OUR APPROXIMATE KNOWLEDGE MODEL

## each player approximately knows his valuation

$8 k \pm 12.5 \% \cdot 8 k$

$\{11\}$

## OUR APPROXIMATE KNOWLEDGE MODEL

## each player approximately knows his valuation

subset of<br>$8 k \pm 12.5 \% \cdot 8 k \quad 4 k \pm 25 \% \cdot 4 k$



## OUR APPROXIMATE KNOWLEDGE MODEL

 each player approximately knows his valuation

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 each player approximately knows his valuation
approximate knowledge induces inaccuracy param. $\delta$ (above, all players within inaccuracy e.g. $\delta=40 \%$ )

## OUR APPROXIMATE KNOWLEDGE MODEL

 each player approximately knows his valuation

## Q:

How well can we leverage approximate knowledge?

## HOW TO MEASURE PERFORMANCE?

## auction <br> mechanism


\{11\}

## ADVERSARIAL PERFORMANCE MEASURE



## ADVERSARIAL PERFORMANCE MEASURE

## auction <br> mechanism



## ADVERSARIAL PERFORMANCE MEASURE

winner=? (prices=...)


## ADVERSARIAL PERFORMANCE MEASURE

winner=2 (prices=...)


## ADVERSARIAL PERFORMANCE MEASURE



## ADVERSARIAL PERFORMANCE MEASURE

winner=2 (prices=...) worst SW/MSW


## How Much SW Can We Guarantee?



## How Much SW Can We Guarantee?



## How Much SW Can We Guarantee?



## How Much SW Can We Guarantee?



QUESTION (now more precise)
What is the $\max \varepsilon(\delta, n)$ that we can guarantee?

## Our Results

## How about dominant strategies?



Should player 2 bid 3k or 5k?

## How about dominant strategies?



Should player 2 bid 3 k or 5 k ?
What if he can report a set?
(if reporting the "true" set is dominant, we may be all set...)

## Old Theorem

if $\delta=0 \exists$ dominant-strategy mechanism guaranteeing 100\% •MSW

## New Theorem <br> if $\delta>0 \exists$ dominant-strategy mechanism guaranteeing $(1-\delta) \cdot M S W$ ?

## New Theorem <br> if $\delta>0 \exists$ dominant-strategy mechanism guaranteeing $(1-\delta)^{2} \cdot M S W ?$

## New Theorem

if $\delta>0 \exists$ dominant-stratoov moohartism guaranteeing

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(1-\delta)^{2} \cdot M S W ?
$$

Theorem 1
$\forall \delta>0$, every dominant-strategy
mechanism guarantees at most $\frac{1}{n} \cdot M S W$

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Theorem 1
$\forall \delta>0$, every dominant-strategy

$$
\text { mechanism guarantees at most } \frac{1}{n} \cdot M S W
$$

Remark 1: dominant-strategy mechanism exist
Remark 2: they perform terribly!
a random assignment trivially guarantees $\frac{1}{n}$

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## Interpretation

dominant strategy useful
iff
exact knowledge or Bayesian

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$70(1 \pm 0.1) ?$

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$70(1 \pm 0.1)$
$70(1 \pm 0.01)$ ?

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| $70(1 \pm 0.1)$ |  |
| :---: | :---: |
| $70(1 \pm 0.01)$ |  |
| $70(1 \pm 0.001) ?$ | Interpretation <br> dominant strategy useful <br> iff |
|  |  |
|  |  |
| exact knowledge or Bayesian |  |

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## A New World

Dominant strategies not useful...
What other solution concepts could make sense? undominated strategies [Jackson, BLP]

## Undominated Strategies

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## Undominated Strategies



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Thm 2: Second-price mechanism in
undominated strats. guarantees $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$

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 much better!!
(note that the second-price mechanism is not dominant-strategy anymore!)

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 much better!!
(note that the second-price mechanism is not dominant-strategy anymore!)
$\Rightarrow$ a new role for undominated strategies!

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Thm 3: $\forall$ deterministic undom. strat. mechanism
guarantees no more than $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$

## Harder!

dominant strategies $\rightarrow$ " single" mechanism (rev. principle) undominated strategies $\rightarrow$ infinitely many mechanisms

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undominated strats. guarantees $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$

Thm 3: $\forall$ deterministic undom. strat. mechanism
guarantees no more than $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$

## And with randomness?

## Implementation in Undomin. Strat's

Thm 4: Our mechanism in undom.
strategies guarantees $\frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}} \cdot M S W$

$$
\begin{array}{cll}
\delta=0.5 & n=2 & 5 \text { times better } \\
\delta=0.5 & n=4 & 3 \text { times better } \\
\delta=0.25 & n=2 & 2 \text { times better }
\end{array}
$$

## Implementation in Undomin. Strat's

Thm 4: Our mechanism in undom.
strategies guarantees $\frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}} \cdot M S W$

Thm 5: $\forall$ probabilistic undom. strat. mechanism guarantees no more than $\frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}} \cdot M S W$

## Summary

## Dominant Strategies

Thm 1: Dominant Strategies don't work

## Undominated Strategies

Thm 2: Second-price mechanism
guarantees $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$
Thm 4: Our mechanism
guarantees $\frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}} \cdot M S W$

Thm 3: \& it is optimal among deterministic mechanisms

Thm 5: \& it is optimal among probabilistic mechanisms

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## Structural Theorems

understanding undominated strategies with approximate knowledge

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Lower Bound Tool:
Distinguishable Monotonicity Lemma

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Upper Bound Tool:
Undominated Intersection Lemma

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## Proving Theorem 3

Undominated Intersection Lemma:
$\left|K_{i} \cap K_{i}^{\prime}\right| \geq 2 \Rightarrow \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right) \neq \emptyset$

## Proving Theorem 3

Undominated Intersection Lemma:
$\left|K_{i} \cap K_{i}^{\prime}\right| \geq 2 \Rightarrow \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right) \neq \varnothing$

$$
K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]
$$



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$$
K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]
$$


$\sigma_{1}$
(-)

$\sigma_{2}$
$\sigma_{3}$

$$
\begin{aligned}
& M S W=(1+\delta) x \\
& S W=\frac{(1-\delta)^{2}}{1+\delta} x \\
& \Rightarrow \varepsilon \leq\left(\frac{1-\delta}{1+\delta}\right)^{2}
\end{aligned}
$$

Deterministic: QED

## Approximate Knowledge

more adversarial...
... more work (but doable) ... more fun!

## Thank you!

## Proving Theorem 3

## Will use:

## Undominated Intersection Lemma:

A tool for undominated strategy mechanisms

- No revelation principle to help
- Need to apply to all mechanisms


## Proving Theorem 3

## Undominated Intersection Lemma: <br> $\left|K_{i} \cap K_{i}^{\prime}\right| \geq 2 \Longrightarrow \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right) \neq \emptyset$

Example:


## Proving Theorem 3

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## Undominated Intersection Lemma: <br> $\left|K_{i} \cap K_{i}^{\prime}\right| \geq 2 \Longrightarrow \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right) \neq \emptyset$

Recall Theorem 3:
in undominated strategies, no deterministic mechanism
guarantees more than $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$

## Proving Theorem 3

## Proof:

1. Pick any $x$ and set $K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]$


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1. Pick any $x$ and set $K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]$
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## Proving Theorem 3

Proof:

1. Pick any $x$ and set $K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]$
2. Set $K_{1}^{\prime}=K_{2}^{\prime}=K_{3}^{\prime}$ to "just touch $K_{i}$ from below"
3. Apply UIL to obtain $\sigma_{i} \in \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right)$ for each $i$


## Proving Theorem 3

Proof:

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3. Apply UIL to obtain $\sigma_{i} \in \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right)$ for each $i$
4. When playing $\left(\sigma_{1}, \sigma_{2}, \sigma_{3}\right)$, someone is unlucky, WLOG player 1

$\operatorname{Pr}[1$ wins $]=0 \oslash$

## Proving Theorem 3

Proof:

1. Pick any $x$ and set $K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]$
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4. When playing $\left(\sigma_{1}, \sigma_{2}, \sigma_{3}\right)$, someone is unlucky, WLOG player 1
5. Choose the "world" of $\left(K_{1}, K_{2}^{\prime}, K_{3}^{\prime}\right) \ldots$ This is the hard instance!


$$
\operatorname{Pr}[1 \text { wins }]=0 \bigodot
$$

## Proving Theorem 3

Proof:

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5. Choose the "world" of $\left(K_{1}, K_{2}^{\prime}, K_{3}^{\prime}\right) \ldots$ This is the hard instance!

$\sigma_{1}$

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Deterministic: QED

## Recall...



## Recall...



## Recall...

## Goal:




1


1. Motivation










## Today's focus



## Today's focus



## Today's focus



Within $1 \%$ or $10 \%$ or $25 \%$...

## Approximate Types



## Approximate Types



## Approximate Valuations


$T V_{i}:=$ "true valuation for player $i$ "
$K_{i}:=$ "approximate valuation for player $i$ "


## Approximate Valuations

outcome $\in$ high social welfare

single-good auction
$T V_{i}:=$ "true valuation for player $i$ "
$K_{i}:=$ "approximate valuation for player $i$ "


## Approximate Valuations



## Approximate Valuations



Example 2:


## Approximate Valuations



## Approximate Valuations



constructible plot of land

## Approximate Valuations



## Approximate Valuations



$$
K_{1}=\left[1 \times 10^{9}, 3 \times 10^{9}\right]
$$

## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations



## Approximate Valuations (summary)

outcome


## Approximate Valuations (summary)


approximation inaccuracy $\delta$ is:

- guaranteed
- known to the designer



## 3. Our Question

## Which Social Welfare?



## Which Social Welfare?


the devil's choice (worst case choice)



## How Much SW Can We Get?


$\Rightarrow \begin{aligned} & \delta=0 \\ & \Rightarrow \text { guaranteed } S W \text { is maximum }\end{aligned}$
(by the second-price mechanism)


## How Much SW Can We Get?


$\begin{array}{ll} & \delta \text { increases } \\ \Rightarrow & \text { guaranteed } S W \text { decreases }\end{array}$


## How Much SW Can We Get?


$\begin{array}{ll} & \delta \text { increases } \underline{\text { further }} \\ \Rightarrow & \text { guaranteed } S W \text { decreases further }\end{array}$


## How Much SW Can We Get?


outcome


## Our Question



## What is the best $\varepsilon(\boldsymbol{\delta}, n)$ ?



## Our Question



Under which solution concepts should we ask the question?

## Our Question



## What is the best $\varepsilon(\delta, n)$ ?

Under which solution concepts should we ask the question?
(non-Bayesian) incomplete information,
so two natural notions to consider:

1. implementation in dominant strategies
2. implementation in undominated strategies

## Our Question



## What is the best $\varepsilon(\delta, n)$ ?

Under which solution concepts should we ask the question?
(non-Bayesian) incomplete information,
so two natural notions to consider:

1. implementation in dominant strategies
2. implementation in undominated strategies
(3. ex-post NE reduces to dominant strategies)

## 4. Our Results

## Our Results

## Implementation in ...

... Dominant Strategies

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## Our Results

## Implementation in ...

... Dominant Strategies
irrelevant!?

## Our Results

## Implementation in ...

... Dominant Strategies

## irrelevant!?

maybe not ... as there is more to reveal

## Our Results

## Implementation in ...

... Dominant Strategies

- Thm 1:

Can guarantee $\varepsilon(\delta, n) \cdot M S W$

## Our Results

## Implementation in ...

... Dominant Strategies

- Thm 1: Can guarantee ( ? ) MSW ?


## Our Results

## Implementation in ...

... Dominant Strategies

- Thm 1:

Can guarantee $(1-\delta) \cdot M S W$

## Our Results

## Implementation in ...

... Dominant Strategies

- Thm 1:

Thm 1:
Can guarantee $\left(\frac{1-\delta}{1+\delta}\right) \cdot M S W ?$

## Our Results

## Implementation in ...

... Dominant Strategies

- Thm 1:

Can guarantee $\frac{(1-\delta)^{5}}{(1+\delta)^{3}} \cdot M S W$ ?

## Our Results

## Implementation in ...

... Dominant Strategies

- Thm 1:

Cannot get more than $\frac{1}{n} \cdot M S W$

## Our Results

## Implementation in ...

## ... Dominant Strategies

- Thm 1:

Cannot get more than $\frac{1}{n} \cdot M S W$

Terrible!
can trivially achieve by assigning good at random (after all, some player has the highest valuation!)

## Our Results

## Implementation in ...

... Dominant Strategies

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## Our Results

## Implementation in ...

## ... Dominant Strategies

- Thm 1:

Cannot get more than $\frac{1}{n} \cdot M S W$

Terrible!
can trivially achieve by assigning good at random
(after all, some player has the highest valuation!)

$$
\begin{gathered}
70(1 \pm 0.1) \\
70(1 \pm 0.01)
\end{gathered}
$$



## Our Results

## Implementation in ...

## ... Dominant Strategies

- Thm 1:

Cannot get more than $\frac{1}{n} \cdot M S W$

Terrible!
can trivially achieve by assigning good at random
(after all, some player has the highest valuation!)
\(\left.$$
\begin{array}{c}70(1 \pm 0.1) \\
70(1 \pm 0.01) \\
70(1 \pm 0.001)\end{array}
$$ \begin{array}{c}Interpretation: <br>
dominant strategy <br>

if and only if\end{array}\right\}\)| exact knowledge of valuation |
| :---: |
| or individual Bayesian |

## Our Results

## Implementation in ...

## ... Dominant Strategies

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much better!!
(note that the second-price mechanism is not dominant-strategy anymore!)


## Our Results

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- Second-price mechanism guarantees $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$ much better!!
$\Rightarrow$ a new role for undominated strategies!
(note that the second-price mechanism is not dominant-strategy anymore!)


## Our Results

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- Our mechanism guarantees $\frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}} \cdot M S W$


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Upper Bound Tool:
Undominated Intersection Lemma
... Undominated Strategies

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## Implementation in ...

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Upper Bound Tool:
Undominated Intersection Lemma
Lower Bound Tool:
Distinguishable Monotonicity Lemma
... Undominated Strategies

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Full version at http://arxiv.org/abs/1112.1147

## 5. Our Techniques

## Our Results

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- A tool for undominated strategy mechanisms
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## Undominated Intersection Lemma: <br> $\left|K_{i} \cap K_{i}^{\prime}\right| \geq 2 \Rightarrow \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right) \neq \emptyset$

Example:

all strategies of player $i$ given by mechanism $M_{1}$


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Example:

all strategies of player $i$ given by mechanism $M_{2}$


## Upper Bound Tool

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## Lower Bound Tool

- Establishing lower bounds on $\varepsilon$ involves (possibly finding and then) analyzing mechanisms
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## Lower Bound Tool

## Tool \#2

## Approximate truthfulness: $\operatorname{UDed}_{i}\left(K_{i}\right) \subset\left[\min K_{i}, \max K_{i}\right]$

What if...


## Lower Bound Tool

## Tool \#2

Distinguishable Monotonicity Lemma:
For any mechanism satisfying good property: $\operatorname{UDed}_{i}\left(K_{i}\right) \subset\left[\min K_{i}, \max K_{i}\right]$

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Examples:


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- Recall a classical result:
$\forall$ monotonic $f: \mathbb{R}^{n} \rightarrow[0,1]^{n}, \quad M_{f}$ is DST


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$$

- How does $M_{f}$ look like? On input bid-profile $v$
- Player $i$ wins w.p. $f_{i}(v)$;
- Player $i$ (if wins), pays $v_{i}-\frac{1}{f_{i}(v)} \int_{z=0}^{v_{i}} f_{i}\left(z \sqcup v_{-i}\right) d z$


## Lower Bound Tool

## Distinguishable Monotonicity Lemma:

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- Our result:
* = distinguishably monotonic
$\Rightarrow$ only need to focus on finding good allocation function $f$


## Our Results

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## Upper Bounds on $\varepsilon$

## Upper Bound Tool

Undominated Intersection Lemma:
$\left|K_{i} \cap K_{i}^{\prime}\right| \geq 2 \Longrightarrow \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right) \neq \emptyset$

- Thm: in undominated strategies, no deterministic mechanism guarantees more than $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$.


## Upper Bounds on $\varepsilon$

Proof:

1. Pick any $x$ and set $K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]$


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4. When playing $\left(\sigma_{1}, \sigma_{2}, \sigma_{3}\right)$, someone is unlucky, WLOG player 1


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4. When playing $\left(\sigma_{1}, \sigma_{2}, \sigma_{3}\right)$, someone is unlucky, WLOG player 1
5. Choose the "world" of $\left(K_{1}, K_{2}^{\prime}, K_{3}^{\prime}\right) \ldots$ This is the hard instance!


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5. Choose the "world" of $\left(K_{1}, K_{2}^{\prime}, K_{3}^{\prime}\right) \ldots$ This is the hard instance!


## 6. Conclusion

## Conclusion


mechanism design $=$

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## Conclusion



Goal: want to learn about others, who may not know themselves very well.

## Conclusion



Goal: want to learn about others,
who may not know themselves very well.
The Goal is desirable and doable!

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## Impl. in Dominant Strategies

- There is a profile of strategies of players that "cannot be beaten" for which the mechanism $M$ ensures good social welfare.


## Classical Model

- $\sigma_{i} \underset{T V_{i}}{\geq w} \sigma_{i}^{\prime}$ if

$$
\forall \tau_{-i}, u_{i}\left(T V_{i}, M\left(\sigma_{i} \sqcup \tau_{-i}\right)\right) \geq u_{i}\left(T V_{i}, M\left(\sigma_{i}^{\prime} \sqcup \tau_{-i}\right)\right)
$$

( $\operatorname{Dnt}_{i}\left(\mathrm{TV}_{i}\right)=\left\{\sigma_{i}: \forall \sigma_{i}^{\prime}, \quad \sigma_{i} \underset{T V_{i}}{\mathrm{vw}} \sigma_{i}^{\prime}\right\}=$ "unbeatable strategies w.r.t. $T V_{i}$ "

- A mechanism $M$ implements $\varepsilon \cdot M S W$ if

$$
\begin{aligned}
\forall T V \quad & , \exists \sigma \in \operatorname{Dnt}(T V) \\
& \underset{M, \sigma}{\mathbb{E}}[S W(T V, M(\sigma))] \geq \varepsilon \cdot M S W(T V)
\end{aligned}
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## Impl. in Dominant Strategies

- There is a profile of strategies of players that "cannot be beaten" for which the mechanism $M$ ensures good social welfare.


## Our Model

- $\sigma_{i} \underset{\substack{\mathrm{NW} \\ K_{i}}}{\mathrm{Vw}} \sigma_{i}^{\prime}$ if $\forall T V_{i} \in K_{i}, \forall \tau_{-i}, u_{i}\left(T V_{i}, M\left(\sigma_{i} \sqcup \tau_{-i}\right)\right) \geq u_{i}\left(T V_{i}, M\left(\sigma_{i}{ }^{\prime} \sqcup \tau_{-i}\right)\right)$

- A mechanism $M \delta$-implements $\varepsilon \cdot M S W$ if

$$
\begin{aligned}
& \forall K \in[\delta], \forall T V \in K, \exists \sigma \in \operatorname{Dnt}(\stackrel{T}{K} K) \\
& \underset{M, \sigma}{\mathbb{E}}[S W(T V, M(\sigma))] \geq \varepsilon \cdot M S W(T V)
\end{aligned}
$$

## Impl. in Dominant Strategies

- Thm: in dominant strategies, every (possibly probabilistic) mechanism cannot guarantee more than $\frac{1}{n} \cdot M S W$
"Revelation Principle" *
- Claim: in dominant strategies, every (possibly probabilistic) direct mechanism cannot guarantee more than $\frac{1}{n} \cdot M S W$
set of strategies is $[\delta] *$


## Impl. in Dominant Strategies

- Claim: in dominant strategies, every (possibly probabilistic) direct mechanism cannot guarantee more than $\frac{1}{n} \cdot M S W$
- Proof:

1. Lemma: a dominant strategy direct mechanism $M$ gives the same outcome when a player deviates individually: $\forall K, \forall i, \forall K_{i}^{\prime}$,

$$
M_{i}(K)=M_{i}\left(K_{i}^{\prime} \sqcup K_{-i}\right)
$$

(Proof: play with different worlds)
2. Consider WORLD $_{1}$ : all players bid low; there is some unlucky player, say player 5.
3. Consider $\mathrm{WORLD}_{2}$ : all players bid low except player 5 .
4. Compute and conclude. QED

## Our Results

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## Impl. in Undominated Strategies

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- "When players use non-stupid strategies, the mechanism $M$ ensures good social welfare"


## Impl. in Undominated Strategies

"When players use non-stupid strategies, the mechanism $M$ ensures good social welfare"

## Classical Model

$$
\ominus \sigma_{i} \underset{T V_{i}}{\leq} \sigma_{i}^{\prime} \text { if }\{
$$

$$
\begin{aligned}
& \forall \tau_{-i}, u_{i}\left(T V_{i}, M\left(\sigma_{i} \sqcup \tau_{-i}\right)\right) \leq u_{i}\left(T V_{i}, M\left(\sigma_{i}^{\prime} \sqcup \tau_{-i}\right)\right) \\
& \exists \tau_{-i}, \\
& u_{i}\left(T V_{i}, M\left(\sigma_{i} \sqcup \tau_{-i}\right)\right)<u_{i}\left(T V_{i}, M\left(\sigma_{i}^{\prime} \sqcup \tau_{-i}\right)\right)
\end{aligned}
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## Impl. in Undominated Strategies

- "When players use non-stupid strategies, the mechanism $M$ ensures good social welfare"

Classical Model

$$
\begin{aligned}
& \text { never worse } \\
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& \int \exists \tau_{-i}, u_{i}\left(T V_{i}, M\left(\sigma_{i} \sqcup \tau_{-i}\right)\right)<u_{i}\left(T V_{i}, M\left(\sigma_{i}{ }^{\prime} \sqcup \tau_{-i}\right)\right) \\
& \text { better at least once }
\end{aligned}
$$

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## Impl. in Undominated Strategies

- "When players use non-stupid strategies, the mechanism $M$ ensures good social welfare"


## Our Model

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## Impl. in Undominated Strategies

- "When players use non-stupid strategies, the mechanism $M$ ensures good social welfare"


## Our Model neverworse

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## Impl. in Undominated Strategies

- "When players use non-stupid strategies, the mechanism $M$ ensures good social welfare"


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- $\quad \sigma_{i} \underset{\underset{T}{T K_{i}}}{K_{i}} \sigma_{i}^{\prime}$ if $\left\{\begin{array}{l}\forall T V_{i} \in K_{i}, \forall \tau_{-i}, u_{i}\left(T V_{i}, M\left(\sigma_{i} \sqcup \tau_{-i}\right)\right) \leq u_{i}\left(T V_{i}, M\left(\sigma_{i}^{\prime} \sqcup \tau_{-i}\right)\right) \\ \exists T V_{i} \in K_{i}, \exists \tau_{-i}, u_{i}\left(T V_{i}, M\left(\sigma_{i} \sqcup \tau_{-i}\right)\right)<u_{i}\left(T V_{i}, M\left(\sigma_{i}^{\prime} \sqcup \tau_{-i}\right)\right)\end{array}\right.$

- A mechanism $M \delta$-implements $\varepsilon \cdot M S W$ if

$$
\begin{aligned}
& \forall K \in[\delta], \forall T V \in K, \forall \sigma \in \operatorname{UDed}(\underset{K}{N}) \\
& \underset{M, \sigma}{\mathbb{E}}[S W(T V, M(\sigma))] \geq \varepsilon \cdot \operatorname{MSW}(T V)
\end{aligned}
$$



## Our Results

## Implementation in ...

... Dominant Strategies

- Thm 1:

Cannot get more than $\frac{1}{n} \cdot M S W$

Upper Bound Tool:
Undominated Intersection Lemma

Lower Bound Tool:
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- Thm 2:
- Second-price mechanism guarantees $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$
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- Thm 3:
- Our mechanism guarantees $\frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}} \cdot M S W$
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## Upper Bounds on $\varepsilon$

Proof:

1. Pick any $x$ and set $K_{1}=K_{2}=K_{3}=[(1-\delta) x,(1+\delta) x]$
2. Set $K_{1}^{\prime}=K_{2}^{\prime}=K_{3}^{\prime}$ to "just touch $K_{i}$ from below"
3. Apply UIL to obtain $\sigma_{i} \in \operatorname{UDed}_{i}\left(K_{i}\right) \cap \operatorname{UDed}_{i}\left(K_{i}^{\prime}\right)$ for each $i$
4. When playing ( $\sigma_{1}, \sigma_{2}, \sigma_{3}$ ), someone is unlucky, WLOG player 1
5. Choose the "world" of $\left(K_{1}, K_{2}^{\prime}, K_{3}^{\prime}\right) \ldots$ This is the hard instance!


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$$
\ldots \Rightarrow \varepsilon \leq \frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}}
$$

Probabilistic: QED
$\sigma_{1}$
$\sigma_{2}$
$\sigma_{3}$


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## Lower Bounds on $\varepsilon$

Thm: Second-price mechanism guarantees $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$ Proof:

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2. Done!

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Thm: Second-price mechanism guarantees $\left(\frac{1-\delta}{1+\delta}\right)^{2} \cdot M S W$ Proof:

1. $\operatorname{UDed}_{i}\left(K_{i}\right) \subset\left[\min K_{i}, \max K_{i}\right]$ for every player $i$
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Second-price: QED

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Proof:


For any $\tau_{-i}$, have three cases:
$i$ loses in $\sigma_{i} \sqcup \tau_{-i} ; i$ wins in $\sigma_{i}^{\prime} \sqcup \tau_{-i}$ $i$ loses in $\sigma_{i} \sqcup \tau_{-i} ; i$ loses in $\sigma_{i}^{\prime} \sqcup \tau_{-i}$ $i$ wins in $\sigma_{i} \sqcup \tau_{-i} ; \quad i$ wins in $\sigma_{i}^{\prime} \sqcup \tau_{-i}$
$i$ wins in $\sigma_{i} \uplus \tau_{-i}$; ioses in $\sigma_{i}^{\prime} \uplus \tau_{-i}$

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Proof:

$$
K_{i} \quad \operatorname{UDed}_{i}\left(K_{i}\right)
$$

$i$ loses in $\sigma_{i} \sqcup \tau_{-i} ; i$ wins in $\sigma_{i}^{\prime} \sqcup \tau_{-i}$
Utility of player $i$ :

$$
\left.\begin{array}{l}
\sigma_{i}^{\prime} \sqcup \tau_{-i}<0 \\
\sigma_{i} \sqcup \tau_{-i}=0
\end{array}\right\} \begin{aligned}
& \text { No matter what the } \\
& \text { devil chooses }
\end{aligned}
$$

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## Lower Bounds on $\varepsilon$

Thm: Our mechanism guarantees $\frac{(1-\delta)^{2}+\frac{4 \delta}{n}}{(1+\delta)^{2}} \cdot$ MSW Proof:

## Lower Bounds on $\varepsilon$

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... where to start?

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Lower Bound Tool
Distinguishable Monotonicity Lemma:
$\forall$ monotonic $^{*} f: \mathbb{R}^{n} \rightarrow[0,1]^{n}, \quad M_{f}$ satisfies $\operatorname{UDed}_{i}\left(K_{i}\right) \subset\left[\min K_{i}, \max K_{i}\right]$

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Task reduces to designing a good $f$

## Lower Bounds on $\varepsilon$

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- Designing $f$ :
- When bids are close to each other: give good at random.
- When there is a "clear winner": act like second-price.
- If neither: interpolate in a smart way.


## Lower Bounds on $\varepsilon$

## Lower Bound Tool

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- Designing $f$ :
- When bids are close to each other: give good at random.
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- If neither: interpolate in a smart way.

This is delicate. In every "intermediate case", need to:

1) ensure the target social welfare, and
2) ensure distinguishable monotonicity.

## Our Optimal Mechanism

## Our Optimal Mechanism

"10000m" view:

1. On input bids $\left(v_{1}, v_{2}, \ldots, v_{n}\right)$, WLOG $v_{1} \geq v_{2} \geq \cdots \geq v_{n}$.

## Our Optimal Mechanism

## "10000m" view:

1. On input bids $\left(v_{1}, v_{2}, \ldots, v_{n}\right)$, WLOG $v_{1} \geq v_{2} \geq \cdots \geq v_{n}$.
2. Find "magic" threshold $n^{*}$

## Our Optimal Mechanism

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3. Assign good to only "candidate winning" players $1,2, \ldots, n^{*}$ where player $i \in\left\{1,2, \ldots, n^{*}\right\}$ wins with "magic" probability:

## Our Optimal Mechanism

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## Our Optimal Mechanism

## " 100 m " view:

1. On input bids $\left(v_{1}, v_{2}, \ldots, v_{n}\right)$, WLOG $v_{1} \geq v_{2} \geq \cdots \geq v_{n}$.
2. Find "magic" threshold $n^{*}$ s.t. $\left\{\begin{array}{l}v_{i}>\frac{\sum_{j=1}^{n^{*}} v_{j}}{n^{*}+D(\delta)} \text { for all } 1 \leq i \leq n^{*} \\ v_{i} \leq \frac{\sum_{j=1}^{n^{*}} v_{j}}{n^{*}+D(\delta)} \text { for all } n^{*}<i \leq n\end{array}\right.$
3. Assign good to only "candidate winning" players $1,2, \ldots, n^{*}$ where player $i \in\left\{1,2, \ldots, n^{*}\right\}$ wins with "magic" probability:

$$
f_{i}(v)=\frac{1}{n} \cdot \frac{n+D(\delta)}{n^{*}+D(\delta)} \cdot \frac{v_{i}\left(n^{*}+D(\delta)\right)-\sum_{j=1}^{n^{*}} v_{j}}{v_{i} D(\delta)}
$$

## Our Optimal Mechanism

## "100m" view:

1. On input bids $\left(v_{1}, v_{2}, \ldots, v_{n}\right)$, WLOG $v_{1} \geq v_{2} \geq \cdots \geq v_{n}$.
2. Find "magic" threshold $n^{*}$ s.t. $\left\{\begin{array}{l}v_{i}>\frac{\sum_{j=1}^{n^{*}} v_{j}}{n^{*}+D(\delta)} \text { for all } 1 \leq i \leq n^{*} \\ v_{i} \leq \frac{\sum_{j=1}^{n^{*}} v_{j}}{n^{*}+D(\delta)} \text { for all } n^{*}<i \leq n\end{array}\right.$
3. Assign good to only "candidate winning" players $1,2, \ldots, n^{*}$ where player $i \in\left\{1,2, \ldots, n^{*}\right\}$ wins with "magic" probability:

$$
f_{i}(v)=\frac{1}{n} \cdot \frac{n+D(\delta)}{n^{*}+D(\delta)} \cdot \frac{v_{i}\left(n^{*}+D(\delta)\right)-\sum_{j=1}^{n^{*}} v_{j}}{v_{i} D(\delta)}
$$

Easy to evaluate, just like the second-price mechanism!

## Our Optimal Mechanism

"1m" view:


## Our Optimal Mechanism

"1m" view:


## Approximate Valuations



