# A Qualitative Comparison of the Suitability of Four Theorem Provers for Basic Auction Theory

Christoph Lange<sup>1</sup>, Marco B. Caminati<sup>2</sup>, Manfred Kerber<sup>1</sup>, Till Mossakowski<sup>3</sup>, Colin Rowat<sup>1</sup>, Makarius Wenzel<sup>4</sup>, Wolfgang Windsteiger<sup>5</sup>

<sup>1</sup>University of Birmingham, UK

<sup>2</sup>http://caminati.net.tf, Italy (**Mizar**)

<sup>3</sup>University of Bremen and DFKI GmbH Bremen, Germany (**Hets/CASL**)

<sup>4</sup>Univ. Paris-Sud, Laboratoire LRI, Orsay, France (**Isabelle**)

<sup>5</sup>RISC, Johannes Kepler University Linz (JKU), Austria (**Theorema**)

http://cs.bham.ac.uk/research/projects/formare/code/auction-theory/

### **Motivation**

- auction theory as a representative for formalising economics
  - mechanism design close to social choice theory (where mechanised reasoning has been applied successfully)
  - auction theory ⊆ mechanism design
  - practically relevant (→ next slides)
- Vickrey's theorem as a canonical representative
- Question: which systems are suitable for auction theory?
   Our approach: approximate the answer
   by formalising Vickrey's theorem

### The Ideal Mechanised Reasoner for Auctions

- library as versatile as in Isabelle or Mizar
- prover as efficient as Isabelle or Mizar
- error messages as informative as in Isabelle's jEdit GUI
- proof language as close to textbook style as Isabelle or Mizar (for fully automated systems: proof exploration interface as informative as Theorema's)
- textbook-like term syntax like Theorema
- integration of diverse tools like Isabelle or Hets
- community as lively as Isabelle's

### **Auctions**

#### mechanism for

- allocating electromagnetic spectrum, airplane landing slots, bus routes, oil fields, bankrupt firms, works of art, eBay items
- establishing exchange rates, treasury bill yields
- determining opening prices in stock exchanges

#### • challenges:

- finding right auction form for an allocation goal
- maximising revenue (3G spectrum: governments earned between €20 and €600 per capita)
- efficient allocation, prevent monopolies
- Is my auction well-defined?

### **Enabling Auction Designers to Formalise**

- mechanised reasoning in economics: so far only done by computer scientists
- enable auction designers to verify their own designs by building an Auction Theory Toolbox (ATT) http://cs.bham.ac.uk/research/projects/formare/ code/auction-theory/
- goals of our ForMaRE research project beyond auctions:
  - increase confidence in economics' theoretical results
  - aid in the discovery of new results (also in matching, finance: see our S&P paper)
  - foster interest in formal methods within economics
  - collect user experience feedback from new audiences
  - ontribute challenge problems to computer science

# **Auction Designers' Requirements**

- provide ready-to-use formalisations of basic auction concepts
- allow for extension and application to custom-designed auctions
- provide easy access to mechanised reasoning systems

# Computer Scientist's Requirements

- Identify right language to formalise auction theory:
  - expressiveness vs. efficiency
  - use familiar textbook notation
  - 3 provide **libraries** of relevant mathematical foundations.
- Identify a mechanised reasoning system
  - that assists users with developing formalisations,
  - that facilitates reuse of formalisations existing in toolbox,
  - 3 that creates comprehensible output, and
  - whose community is supportive towards new users.

#### Note the conflicts of interest!

### Approach to Building the Toolbox

- avoid chicken-and-egg problem
   ⇒ build ATT while identifying suitable languages/systems
- identifying languages/systems requires having domain problems
- we take problems from Maskin's review paper of Milgrom's canonical auction theory textbook [Mas04]

### Vickrey's Theorem

**Static second-price auction**: everyone submits one sealed bid, highest bidder wins, pays highest *remaining* bid.

### Theorem (Vickrey 1961)

In a second-price auction, "truth-telling" (i.e. submitting a bid equal to one's actual valuation of the good) is a weakly dominant strategy. Furthermore, the auction is efficient.

- earliest result in modern auction theory
- simple environment for gaining intuition

# Vickrey's Theorem (Elaborated towards Formalisation)

### **Definition (Weakly Dominant Strategy)**

Given some auction, a strategy profile  $\boldsymbol{b}$  supports an *equilibrium in* weakly dominant strategies if, for each  $i \in N$  and any  $\widehat{\boldsymbol{b}} \in \mathbb{R}^n$  with  $\widehat{b}_i \neq b_i$ ,  $u_i(\widehat{b}_1, \dots, \widehat{b}_{i-1}, b_i, \widehat{b}_{i+1}, \dots, \widehat{b}_n) \geq u_i(\widehat{\boldsymbol{b}})$ . I.e., whatever others do, i will not be better off by deviating from the original bid  $b_i$ .

### Theorem (Vickrey 1961; Milgrom 2.1)

In a second-price auction, the strategy profile  $\mathbf{b} = \mathbf{v}$  supports an equilibrium in weakly dominant strategies. Furthermore, the auction is efficient.

# Vickrey's Theorem (Proof Sketch)

Suppose participant i bids truthfully, i.e.

$$(\widehat{b}_1,\ldots,\widehat{b}_{i-1},v_i,\widehat{b}_{i+1},\ldots,\widehat{b}_n)=:\widehat{\boldsymbol{b}}^{i\leftarrow v}.$$

*i* wins . . .

Now consider i submitting an arbitrary bid  $\hat{b}_i \neq b_i$ , i.e. assume an overall bid vector  $\hat{\boldsymbol{b}}$ .

- *i* wins with the new bid . . .
- i loses with the new bid . . .
- *i* **loses** . . .
  - i wins with the new bid . . .
  - i loses with the new bid . . .

In each case, we obtain  $u_i(\widehat{\boldsymbol{b}}) \leq u_i(\widehat{\boldsymbol{b}}^{i \leftarrow v})$ .

### Choosing a Mechanised Reasoning System

#### Systems differ in:

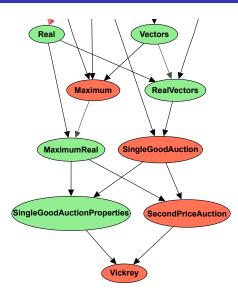
- **logic**: maximum of n bids  $b_i \in \mathbb{R}$  but proof structure is simple; no induction.
- syntax: some like textbook mathematics, others like programming language
- user experience: fully automated proving vs. proof checking vs. interactive proving

### Mechanised Reasoning Systems we Used

Systems and state of our formalisations:

- Mizar: FOL + set theory, text editor, proof checker
- **Isabelle/HOL**: higher-order logic (typed), interactive theorem proving environment, document-oriented IDE
- Hets/CASL/TPTP: sorted FOL, text editor, proof management GUI, frontend to local or remote automated provers
- Theorema 2.0: FOL + set theory, textbook-style documents (Mathematica notebooks), built-in automated provers, proof management GUI

# Theory Structure



### Level of Detail and Explicitness Required

- paper elaboration was detailed and explicit but systems need even more (≥ 1.5 times as much code)
- benefits of explicitness: It becomes obvious that . . .
  - exactly one participant wins
  - a second-price auction requires at least 2 participants second-highest bid undefined otherwise alternative: define max Ø := 0

### Expressiveness vs. Efficiency (Mizar)

Our Mizar formalisation uses low-level set theory:

- bid vector represented as a relation R
- natural numbers represented as sets:  $0 := \emptyset$ ,  $n + 1 := \{0, ..., n\}$

#### Advantages:

- basic set theory well supported in library
- certain operations are **elegant** and **concise**, e.g. max := ∪, and hence arg max as inverse image (") through R: winnerof R **equals** the Element **of** R"{union rng R}

#### Disadvantages:

- hard to read for domain experts However, formalisation becomes clearer when proving lemmas with explicit assumptions such as "R is a function with range  $\mathbb{N}$ ".
- Mizar does not support numbers and arithmetics natively (i.e. you need to represent numbers as sets)

### Proof Development and Management

#### "Automated vs. interactive" difference blurs:

- Isabelle and Mizar give access to automated provers workflow practically similar to Theorema and Hets:
  - specifying the knowledge to be used
  - configuring the prover
- when **fully automated provers need guidance** (e.g. Theorema or Hets can't do  $A \Rightarrow C$ , but can do  $A \Rightarrow_P B$  and  $B \Rightarrow_{P'} C$ ):
  - these additional "proof steps" have to be emulated by lemmas
  - prover configuration has to be maintained separately from the formalisation

### Term Input Syntax (Isabelle)

```
definition second price auction winner ::
     "participants \Rightarrow bids \Rightarrow allocation \Rightarrow payments \Rightarrow participant \Rightarrow bool"
  where
     "second price auction winner N b x p i ↔
       i \in N \land i \in arg \ max \ set \ N \ b \land x \ i = 1 \land p \ i = maximum \ (N - \{i\}) \ b"
definition second price auction loser ::
     "participants ⇒ allocation ⇒ payments ⇒ participant ⇒ bool"
  where "second price auction loser N x p i \longleftrightarrow i \in N \land
      x i = 0 \land
      p i = 0"
definition spa pred :: "participants ⇒ bids ⇒ allocation ⇒ payments ⇒ bool"
  where
     "spa pred N b x p ↔
       bids N b A
       (∃i ∈ N. second price auction winner N b x p i ∧
          (\forall j \in N : j \neq i \longrightarrow \text{second price auction loser } N \times p \ j))"
```

# Term Input Syntax (CASL)

```
forall n: Participants;
      x: Allocation:
       p: Pauments:
      v: Valuations:
       b: Bids:
       winner, loser, i. maxBidder: Participant
. secondPriceAuctionWinner(n, b, x, p, i) <=>
  inRange(n. i) /\
  inArgMaxSet(b, i) /\
 allocated(x, b, i) /\
  paument(p. b. i) = secondPriceAuctionWinnersPaument(b. i) %(second_price_auction_winner_def)%
. secondPriceAuctionLoser(n, b, x, p, i) <=>
  inRange(n, i) /\
  not allocated(x, b, i) /\
  payment(p, b, i) = 0
                                                              %(second_price_auction_loser_def)%
. secondPriceAuction(n. x. p) <=>
 %[ (x, p) is the outcome of a second price auction with n participants iff ... ]%
 n > 1 / 
  (forall h: Bids .
    length(b) = n
    allocation(b, x) /\
    payments(b, p) /\
    (exists i: Participant .
      inRange(n, i) /\
      secondPriceAuctionWinner(n, b, x, p, i) /\
      (forall j: Participant .
        inRange(n, j) /\
       not j = i
        =>
        secondPriceAuctionLoser(n, b, x, p, j))))
                                                                    %(second_price_auction_def)%
```

### Term Input Syntax (Theorema)

```
DEFINITION (SECOND-PRICE AUCTION)

secondPriceAuction[b, x, p] :\Leftrightarrow

\exists secondPriceAuctionWinner[b, x, p, i] \land

\forall secondPriceAuctionLoser[x, p, j]

\forall i=1,...,n

secondPriceAuctionWinner[b, x, p, i] :\Leftrightarrow b<sub>i</sub> = \max_{j=1,...,n} b<sub>j</sub> \land x<sub>i</sub> = 1 \land p<sub>i</sub> = \max_{j=1,...,n} b<sub>j</sub> secondPriceAuctionWinner \land x secondPriceAuctionLoser[x, p, i] :\Leftrightarrow x<sub>i</sub> = 0 \land p<sub>i</sub> = 0

(secondPriceAuctionLoser x \Rightarrow x secondPriceAuctionLoser x \Rightarrow x secon
```

# Term Input Syntax (Mizar)

definition let R be Relation:

```
:: bids are cartesian products participants × offers
func topbiddersof R → Subset of dom R
 equals R"{union rng R};
  :: R"Y is the preimage of Y under R
func winner of R equals the Element of topbidders of R;
func losersof R equals dom R \ {winnerof R};
func priceof R equals union rng (R | losersof R);
:: allocation and payments for each participant
func R-allocat equals [:dom R,{0}:]+*[:{winnerof R},{1}:];
func R-pay
```

**equals** [:dom R, {0}:]+\*[:{winnerof R},{priceof R}:];

# Other Comparison Criteria

- library coverage and searchability
  - *n*-argument maximum built in?
  - how to find reusable material?
- comprehensibility and trustability of the output
  - Why did a proof fail?
  - What was used in proving a non-trivial goal automatically?
  - A proof "succeeded" trivially; did we accidentally state a tautology?
- online community support and documentation

# System Comparison

#### Our contribution so far:

- recommending to auction designers what system to use next: providing them with a growing library to build their formalisations on
- giving systems' developers user experience feedback from the field (new user group!)
   next: compile challenge problems

### **Formalising Auction Theory**

- Our source [Mas04] contains 13 propositions and their proofs (overview on ATT homepage: http://cs.bham.ac.uk/ research/projects/formare/code/auction-theory/)
- Bidding typically requires forming conjectures of others' beliefs ⇒ integration over conditional density functions; calculation of second derivatives
- Maskin's review limited to single good auctions
  - combinatorial auctions are more economically critical (spectrum, monetary policy)
  - but few general results exist

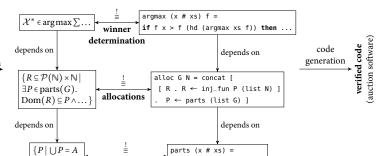
# Checking Well-Definedness of Combinatorial Auctions

set partitions

#### paper-like formalisation

 $\land \forall x \in P....$ 

#### executable formalisation





Jinject x ' (parts xs)

### Comparison result

System age	Proof speed	Proof speed Textbook closeness		Top-down proofs Library			Output			Community	Documen- tation	de Bruijn factor
Signi		$PI^a$	Tla		$LC^a$	$LS^a$	$PO^a$	$CE^a$	$WF^a$			
Isabelle/HOL	++ <sup>b</sup>	++	+	++	++	++	0	++	++	++	++	1.3
Theorema	?	n/a <sup>c</sup>	++	++	+		++	n/a	_		_	n/a
Mizar	++	++	-	++	++	+	$\circ$	n/a	++	+	$\circ$	1.7
CASL/TPTP	$\bigcirc^d$	-	+	++	+	-	$\circ$	+	+	$\circ$	+	1.5

 $<sup>^{</sup>a}$  PI/TI = proof/term input; LC/LS = library coverage/search; PO = proof output; CE = counterexamples (incl. consistency checks); WF = well-formedness check.  $^{b}$  scores from very bad (—) to very good (++)  $^{c}$  fully GUI-based  $^{d}$  automated provers

Result specific to auctions? –

No, but the application orientation prioritised "soft" criteria!

#### etc.

- Robert Leese, who worked on the UK's spectrum auctions, has called for auction software to be added to the Verified Software Repository [Woo+09].
- other work in 'verifying' auction properties can be seen in our case checking paper - q.v. [Arc+05] and [Den+12], both described there

pendix References

### References I



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pendix References

### References II



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