

# A Typed Language for Truthful One-Dimensional Mechanism Design

Andrei Lapets      Alex Levin

We leverage programming language design techniques in creating a typed language for describing mechanisms in which well-typed expressions are necessarily truthful mechanisms.

**Theorem 1.** A mechanism  $M = (A, p)$  is *truthful* if and only if its allocation algorithm  $A$  is monotone and it collects as payment the critical value from every bidder.

## Definitions

- Bidders:  $i, j \in \{1, \dots, n\}$
- Private values (and bids):  $v \in \mathbb{R}_+^n, v_i \in \mathbb{R}_+$
- Outcomes:  $o \in \mathcal{O}, o_i \in \{0, 1\}$
- Allocation algorithms:  $A \in \mathbb{R}_+^n \rightarrow \mathcal{O}$
- Welfare:  $w_o(v) = \sum_i o_i v_i$
- Payment functions:  $p(v) \in \mathbb{R}_+^n$
- Mechanisms:  $M = (A, p)$

**Definition 1.** An  $A$  is **monotone** if  $\forall j \forall v_{-j}, \forall v'_j \geq v_j, A_j(v_{-j}, v_j) = 1 \Rightarrow A_j(v_{-j}, v'_j) = 1$ .

**Definition 2.** [MN02] A monotone  $A$  is **bitonic** if  $\forall j, \forall v_{-j}, w_{A(v)}(v_{-j}, v_j)$  is non-increasing for  $v_j < \theta_j(v_{-j})$ , non-decreasing for  $v_j \geq \theta_j(v_{-j})$ .

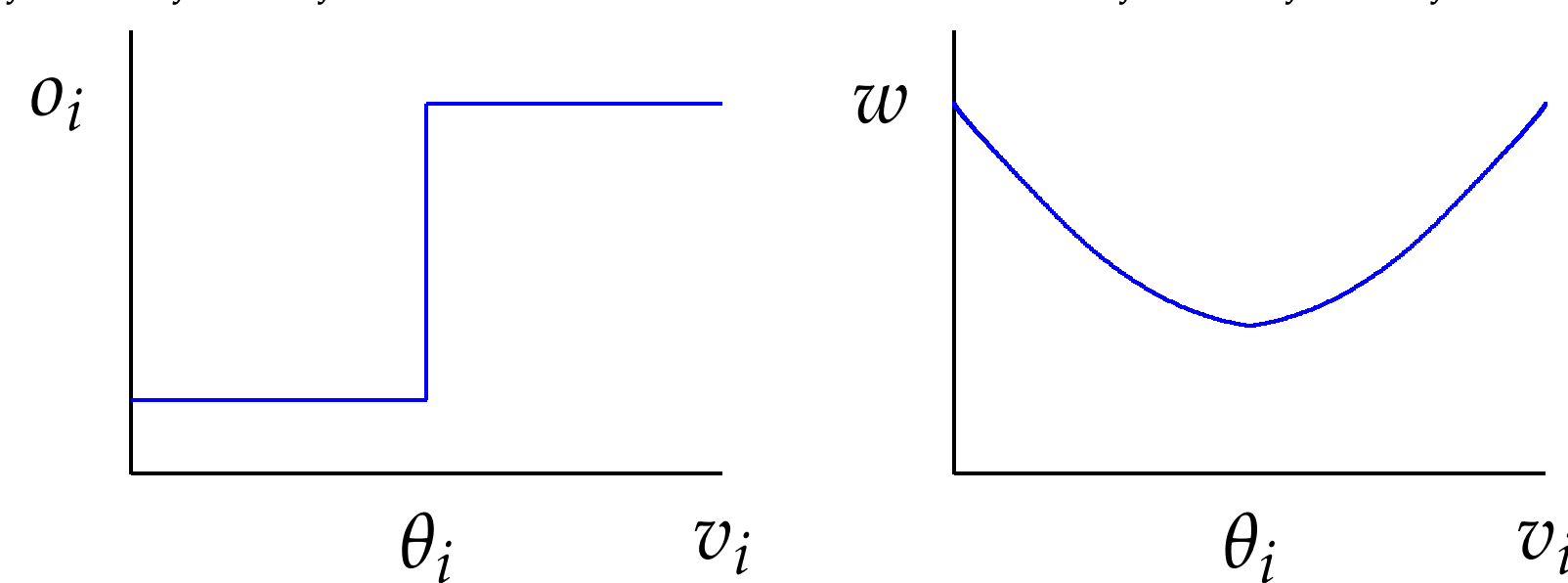


Figure 1: Monotonicity and bitonicity.

- A monotone  $A$  has for every bidder  $j$  a critical value  $\theta_j(v_{-j}) \in \mathbb{R} \cup \{\infty\}$ .
- Quasi-linear utility: bidder  $j$  with value  $v_j$  has utility  $v_j A_j(v'_j, v_{-j}) - p_j(v'_j, v_{-j})$  given mechanism  $M = (A, p)$  and bids  $(v'_j, v_{-j})$ .

**Definition 3.** Mechanism  $M = (A, p)$  is truthful when  $\forall v_j \forall v_{-j}$ , for all  $v'_j \neq v_j$ ,

$$v_j A_j(v_j, v_{-j}) - p_j(v_j, v_{-j}) \geq v_j A_j(v'_j, v_{-j}) - p_j(v'_j, v_{-j}).$$

## Decision Trees

We first consider algorithms which are decision trees with comparisons between bid values at the nodes (e.g.  $v_4 \geq v_7$ ), and allocations to a single agent at the leaves.

natural  $i \in \mathbb{N}$   
 bid vector  $v \in \mathbb{R}^n$   
 primitive  $p ::= \text{alloc} \mid \text{value}$   
 expression  $e ::= i \mid v \mid p \mid e_1 e_2$   
                    $\mid \text{if } e_1 \geq e_2 \text{ then } e_3 \text{ else } e_4$

Monotonicity can be checked efficiently through a syntax-directed analysis of the algorithm. For each bidder, every possible execution path is analyzed, and the critical intervals under every execution path are constructed.

**Theorem 2.** A decision tree  $e$  represents a monotonic allocation algorithm iff for every bidder, under every execution path, the critical interval can be represented as a critical value threshold function.

## Example: Two-bidder VCG

Suppose we have an algorithm which allocates to one of two bidders with higher value:

```
if value 1 v >= value 2 v then
  alloc 1 v
else
  alloc 2 v
```

For bidder 1, this is first converted into an expression on intervals over  $\mathbb{R}$ :

$$([0, \infty) \cap [v_2, \infty)) \cup (\emptyset \cap [0, v_2)).$$

Then, according to the reduction rules for intersection and union, this reduces to:

$$[v_2, \infty),$$

A similar approach can be used to determine that the critical interval for bidder 2 is

$$(v_1, \infty).$$

Since both critical intervals can be represented using a critical value threshold function, we know the allocation algorithm is monotonic.

## General Algorithms

We start with a simply-typed  $\lambda$ -calculus with domain-specific primitives and type annotations.

primitive  $p ::= \text{alloc} \mid \text{value} \mid \text{max} \mid + \mid \geq \mid \dots$   
 expression  $e ::= \text{bool} \mid \text{real} \mid i \mid v \mid p$   
                    $\mid e_1 e_2 \mid \text{if } e_1 \text{ then } e_2 \text{ else } e_3$   
                    $\mid x \mid \text{arg } x.e \mid \text{fix}$

proposition  $P ::= \text{Biton} \mid \text{Mon} \mid \text{Indep}$

base type  $\zeta ::= \text{Bool}_P \mid \mathbb{N}_P \mid \mathbb{R}_P \mid V \mid \mathcal{O}_P$

type  $\tau ::= \zeta \mid \tau \rightarrow \tau$

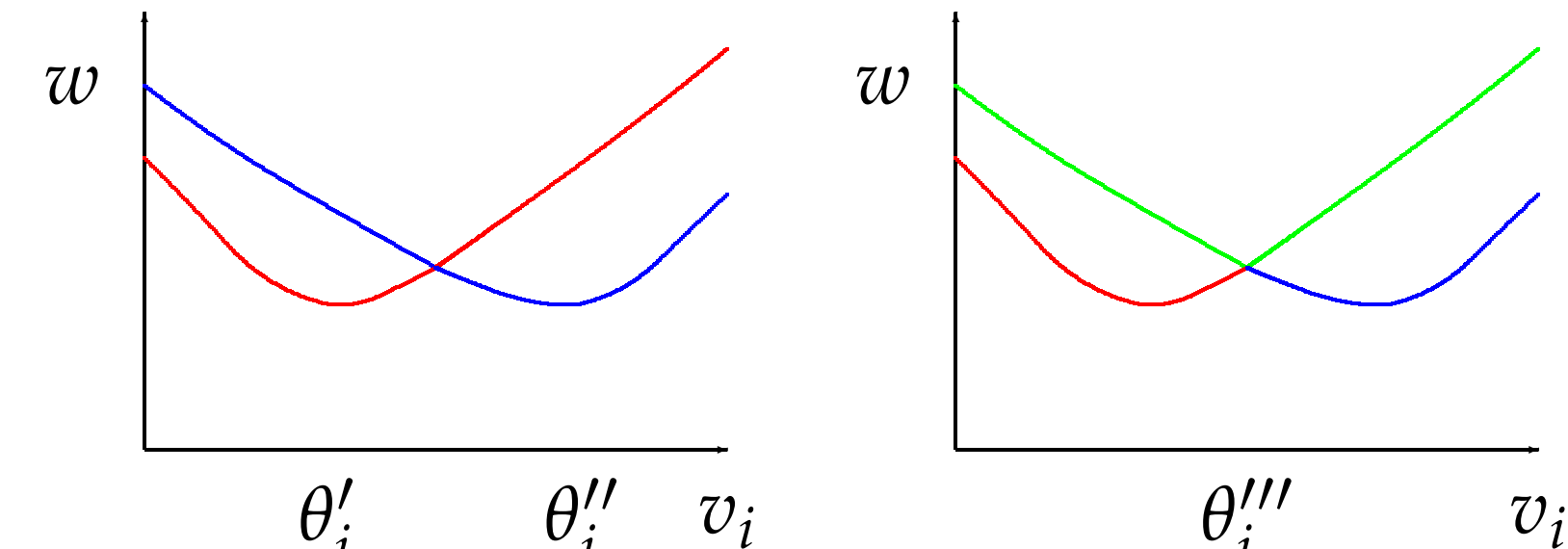


Figure 2: Maximum of bitonic functions.

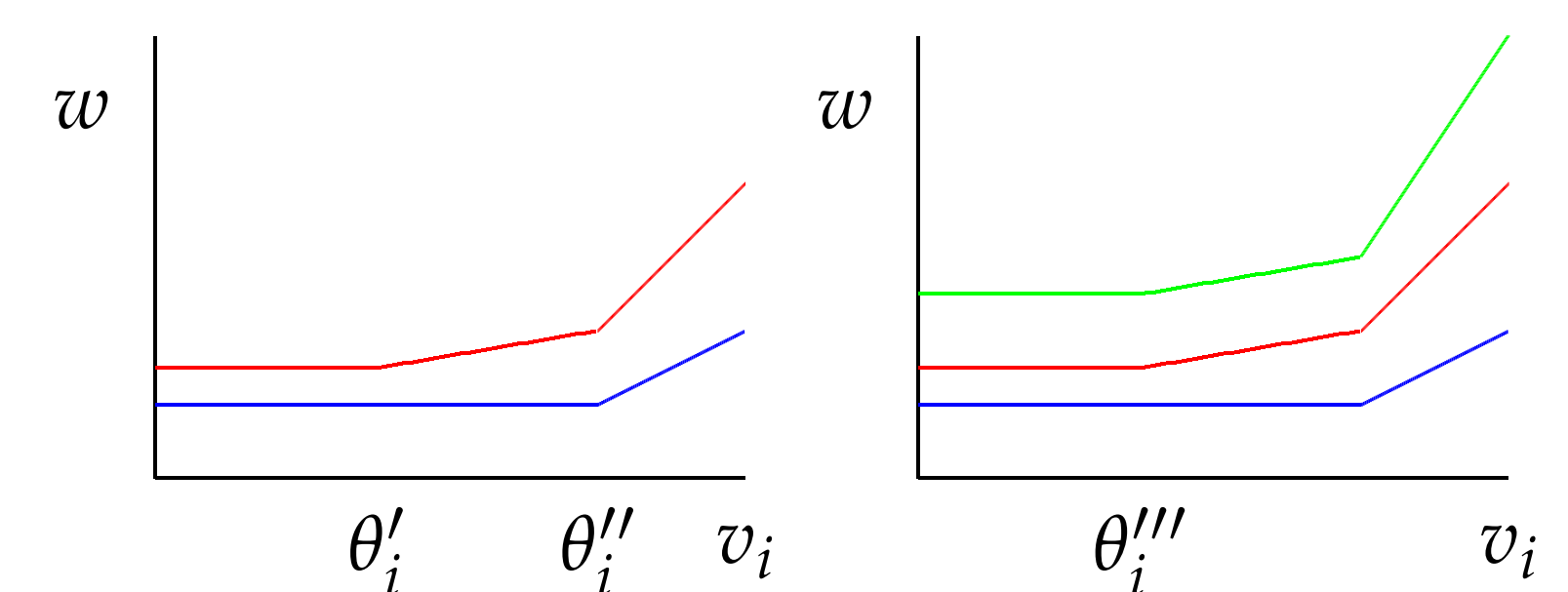


Figure 3: Sum of constant-monotonic functions.

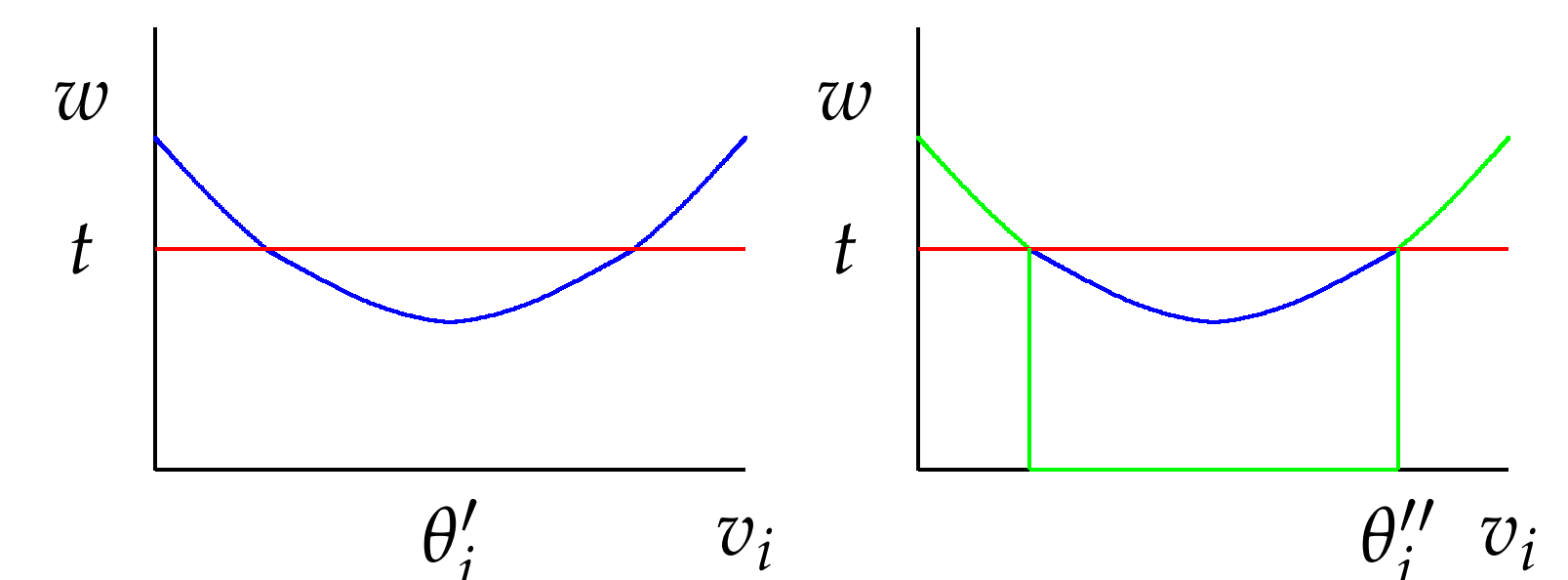


Figure 4: Constant threshold on bitonic function.

We introduce primitives for manipulating outcomes, and assign types to them.

$\text{max} : \mathcal{O}_{\text{Biton}} \rightarrow \mathcal{O}_{\text{Biton}} \rightarrow \mathcal{O}_{\text{Biton}}$   
 $\text{combine} : \mathcal{O}_{\text{Biton}} \rightarrow \mathcal{O}_{\text{Biton}} \rightarrow \mathcal{O}_{\text{Biton}}$   
 $\text{thresh} : \mathbb{R}_{\text{Indep}} \rightarrow \mathcal{O}_{\text{Biton}} \rightarrow \mathcal{O}_{\text{Biton}}$

These type annotations are induced by the operations on functions: maximum, addition, and threshold.

## Example: Exhaustive Search

Mu'alem and Nisan [MN02] define  $\text{Exst}_k$ , which exhaustively searches all feasible outcomes which allocate to at most  $k$  bidders.

```
Exst_k k v = maxAllk v 1 n 1 k noalloc

maxAllk = arg v i n d k o.
if (or (>= k d) (>= n i)) then
  max
  // try remaining branches 'i' up to 'n'
  (maxAllk v (+ i 1) n d k o)
  // add to accumulator, go deeper
  (maxAllk v 1 n (+ d 1)
    k (combine (alloc i v) o))
else if (feasible o) then o else noalloc
```

## Example: Profit Extraction

Goldberg et al. [GHK<sup>+</sup>06] define an algorithm assuming an unlimited supply of an item.

```
filter = arg k v n i.
if (>= n i) then
  combine (thresh k (alloc i v))
  (filter k v n (+ i 1))
else noalloc

profitExtract = arg R v n k maxk.
if (>= maxK k) then
  max (thresh R (filter k v n 1))
  (profitExtract R v n (+ k k) maxk)
else noalloc
```

For each  $k$ , an outcome must have at least  $R/k$  bidders with value above  $k$ , so the  $R/k$ th highest bidder must have value above  $k$ .

## References

- [GHK<sup>+</sup>06] Andrew Goldberg, Jason Hartline, Anna Karlin, Mike Saks, and Andrew Wright. Competitive auctions. *Games and Economic Behavior*, 55:242–269, 2006.
- [MN02] A. Mu'alem and N. Nisan. Truthful approximation mechanisms for restricted combinatorial auctions. In *Proc. 18th National Conference on Artificial Intelligence (AAAI-02)*, 2002.