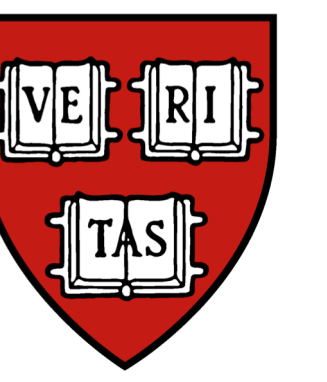


A Bridge between Liquid and Social Welfare in Combinatorial Auctions with Submodular Bidders



Dimitris Fotakis (National Technical University of Athens & Yahoo! Research)

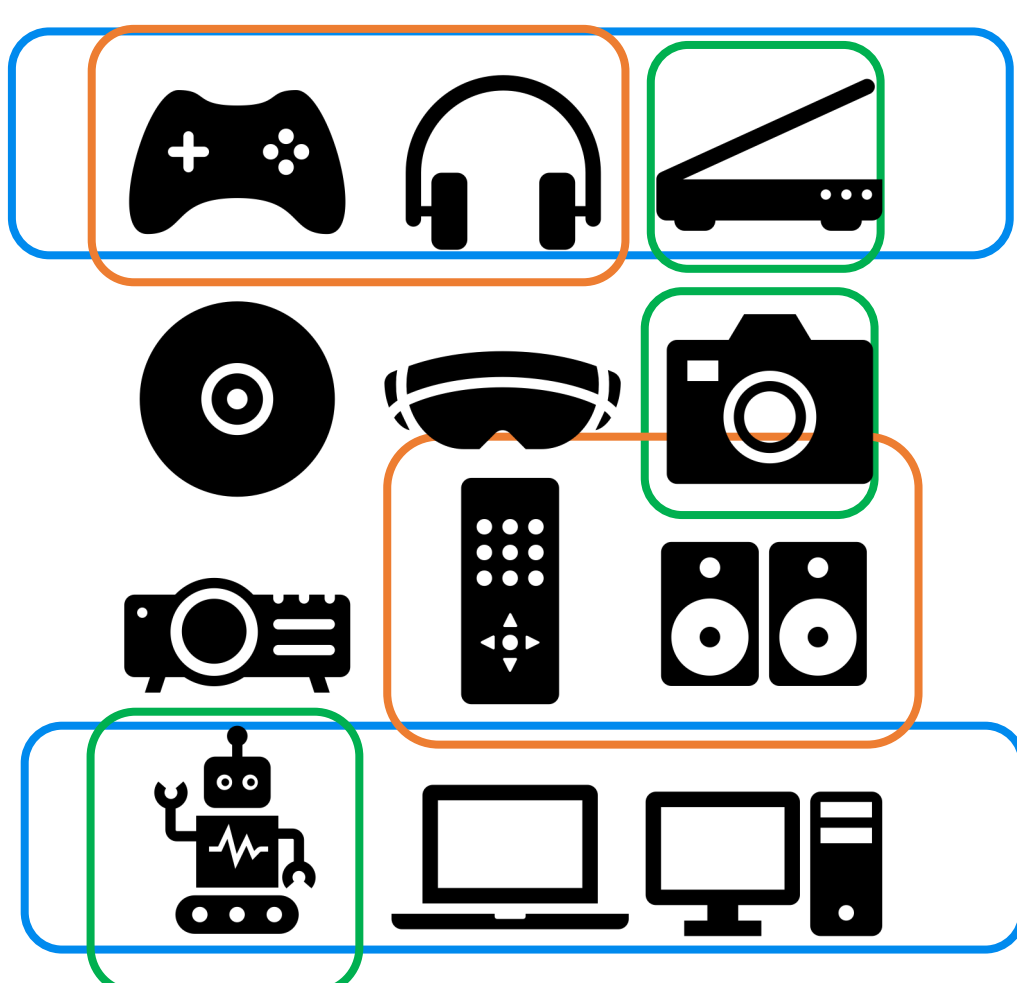
Kyriakos Lotidis (National Technical University of Athens)

Chara Podimata (Harvard University)

Main Question Addressed

Truthful mechanisms approximating the Liquid Welfare in Combinatorial Auctions with the same approximation guarantees as the state-of-the-art for the Social Welfare?

Combinatorial Auctions [No Budgets]



- Generate a lot of revenue (e.g., spectrum auctions)
- Important applications (e.g., airport slot auctions)

Social Welfare (SW) as the Efficiency Metric:

$$SW = \sum_{i=1}^n v_i(S_i)$$

Truthful mechanisms for maximizing SW in CAs truthfully: **extremely challenging!**

- Instead, we resort to **approximations** for specific classes of valuation functions.
- **Submodular** Functions:
 $S \subseteq T, x \notin T: v(S \cup \{x\}) - v(S) \geq v(T \cup \{x\}) - v(T)$

State-of-the-art approximations of SW

Worst – Case

(no further assumptions apart from submodularity)

- $O(\log m)$ [Krysta & Vocking, 2012]
- $O(\sqrt{\log m})$ [Dobzinski, 2016]

Bayesian

(valuations drawn from known distributions)

- $O(1)$ [Feldman, Gravin, Lucier, 2014; Duetting, Feldman, Kesselheim, Lucier, 2017]

- Posted price mechanisms used in both cases
- Bidders choose bundles through Demand Queries (DQ):

$$S_i := DQ(v_i, U_i, \vec{p}) = \operatorname{argmax}_{T \subseteq U_i} \{v_i(T) - p(T)\}$$

Combinatorial Auctions [With Budgets]

Notion of welfare efficiency must balance between the bidder's willingness (= *valuation*) and ability (= *budget*) to pay

Liquid Welfare (LW) [Dobzinski & Paes Leme, 2014]

$$LW = \sum_{i=1}^n \bar{v}_i = \sum_{i=1}^n \min\{v_i(S_i), B_i\}$$

Our Approach

The Core Mechanism [e.g., Krysta & Vocking, '12]

1. Fix bidder ordering π & set $U_1 = U_2 = \dots = U$
2. Initial prices $\vec{p}^{(1)} = (p_1^{(1)}, \dots, p_m^{(1)})$
3. For each bidder $i \sim \pi$ do:
4. Let i choose $S_i := DQ(v_i, U_i, \vec{p})$
5. With prob. q give $i: S_i$ & set: $U_{i+1} = U_i \setminus S_i$
6. Update prices $\vec{p}^{(i+1)} = (p_1^{(i+1)}, \dots, p_m^{(i+1)})$

- ✓ Truthfulness (clear, due to choice of S_i from DQ)
- ✓ Appropriately choosing *initial prices* & *price update rule*:
 $\rightarrow O(\log m)$ - apx for SW in worst-case
 $\rightarrow O(1)$ - apx for SW in Bayesian settings

Lemma 1: If v : submodular/XOS $\rightarrow \bar{v}$: submodular/XOS

Why not change DQ in Step 4: $DQ(\bar{v}_i, U_i, \vec{p})$? **Not truthful**

Definition: Budget Compatible Demand Query (BCDQ):

$$S_i := BCDQ(v_i, U_i, \vec{p}, B_i) = \operatorname{argmax}_{T \subseteq U_i} \{v_i(T) - p(T) \mid p(T) \leq B_i\}$$

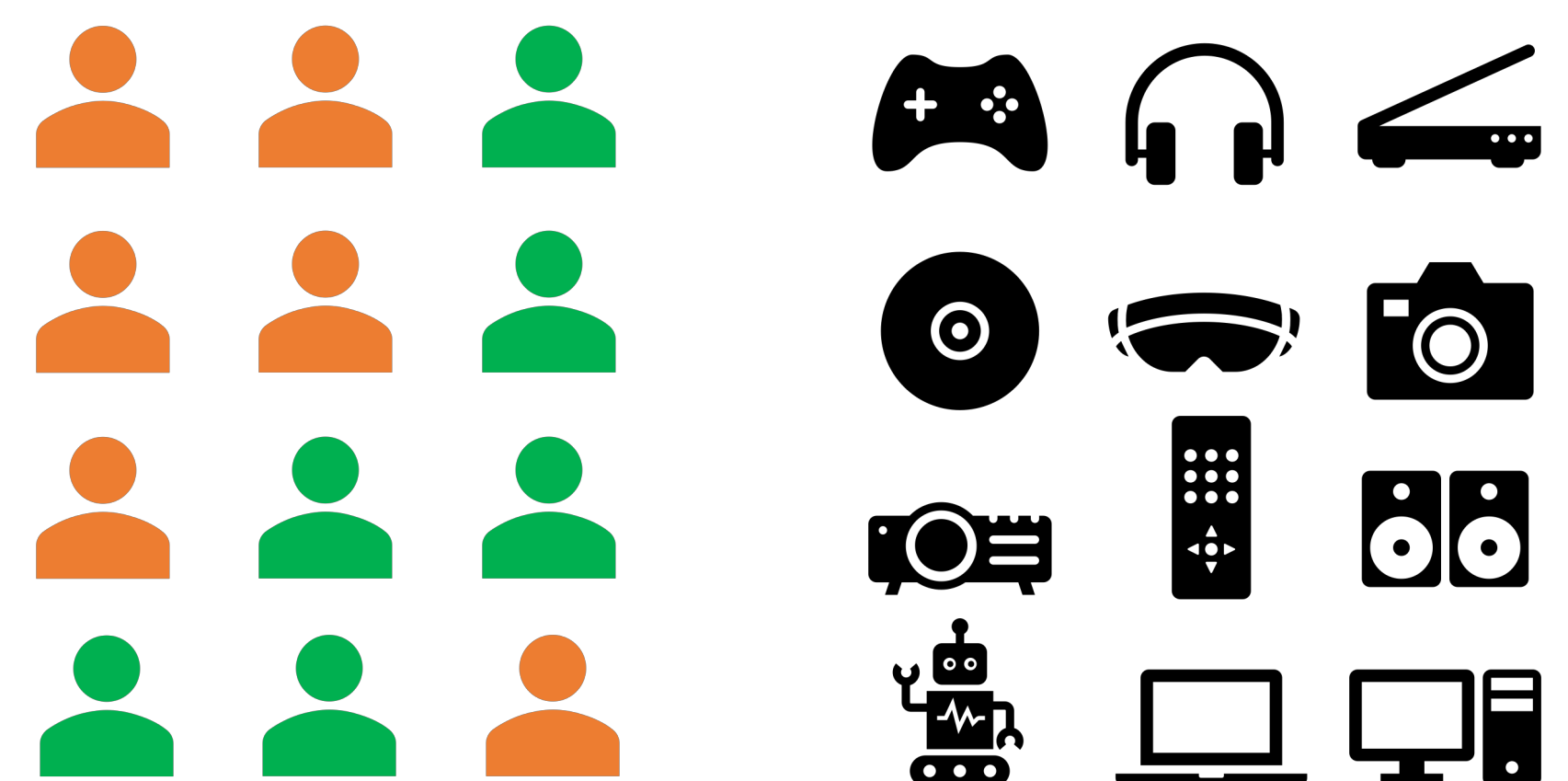
- ✓ Truthfulness **restored!** What about approximations?

Lemma 2: Let $S \subseteq U$: chosen from BCDQ. Then, for any $T \subseteq U$:

1. $\bar{v}(S) \geq \bar{v}(T) - p(T)$
2. $2\bar{v}(S) - p(S) \geq \bar{v}(T) - p(T)$

- ✓ Guarantees same order apx, just added constant of 1/2

Introducing Competitive Markets in CAs



$$\Pr \left[\overline{OPT}_T \geq \left(1 - \frac{\epsilon}{2}\right) \overline{OPT} \right] \geq 1 - \delta$$

- ✓ Homogeneity of the market
- ✓ Important buyers in both sets
- ✓ With high probability if you only sell in the second set, you don't lose much