## Oblivious Online Contention Resolution Schemes

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## Overview

- Online Contention Resolution Scheme (OCRS) is a framework that encompasses many stochastic optimization problems
- This work studies the possibility of OCRS when the underlying prior is unknown
  - A positive result in the simplest setting
  - Negative results in more general settings



## **Contention Resolution Scheme**

- Setup: universe *U*, downward closed feasible sets ℱ ⊆ 2<sup>U</sup>
  Input: **x** ∈ [0,1]<sup>U</sup>, the marginal dist. of a dist. over ℱ, An element in *S* is active sample set *S* ⊆ *U* s.t. each element *i* is in *S* independently with probability *x<sub>i</sub>*
- For c > 0, a *c*-balanced contention resolution scheme (CRS) outputs  $T \subseteq S$ , so that  $\Pr[i \in T] \ge \frac{1}{c} \cdot x_i$  for each *i*
- Originally formulated by Chekuri, Vondrák & Zenklusen (2014) for submodular function maximization



### **Online** Contention Resolution Scheme

- Setup: universe *U*, downward closed feasible sets  $\mathcal{F} \subseteq 2^U$
- Input: a distribution **x** over *F*, and a sampled set *S* such that each element *i* is in *S* independently with probability *x<sub>i</sub>*, but the elements of *U* arrive one by one to reveal their memberships in *S*
- Feldman, Svensson & Zenklusen (2016): For c > 0, a *c*-selectable online contention resolution scheme (OCRS) outputs  $T \subseteq S$ , deciding for each  $i \in S$  its membership in *T* as it arrives, so that  $\Pr[i \in T] \ge \frac{1}{c} \cdot x_i$  for each *i*



# Significance of (0)CRS

 The distribution x can be seen as a correlated distribution that results from
 CRS is intimately connected with correlation gap

• solving a continuous relaxation of an optimization problem

• or solving an ex ante relaxation of an optimization problem

OCRS generates approximately optimal online mechanism

closely related to prophet inequalities, sequential posted pricing...

CRS was invented for rounding



# **Example:** The Singleton Setting

• Let  $\mathcal{F}$  be the singleton subsets of U, then **x** is a distribution on U.

accept *i* so that it is accepted w.p. 1/2.



• This is possible because, with pro

accepted anything when *i* arrives.

• When  $\mathcal{F}$  is a matroid, there is a 2-selectable OCRS. [Singla & Lee 2018]

- A 2-selectable OCRS: if element *i* is active and we have not accepted anything,

bability 
$$1 - \sum_{j \text{ before } i} \frac{x_j}{2} \ge \frac{1}{2}$$
, we have not

• So if *i* is active, we accept it with probability  $\frac{1}{2}$ 



# Oblivious OCRS

- An OCRS is oblivious if it has no knowledge of the distribution **x**
- Besides being mathematically attractive...
  - Dughmi 2020: matroid secretary is reducible to *O*(1)-selectable matroid OCRS with correlated inputs and limited knowledge on **x** 
    - Dughmi already showed such OCRS is impossible; Dughmi 2022 even removed the part "limited knowledge on **x**"
  - For prophet inequalities in the singleton setting, with unknown distributions, a single sample from each distribution recovers the optimal competitive ratio [Rubinstein, Wang, Weinberg, 2020]



## Our Main Results

-selectable for any **x**, and show *e* is the best possible.

• Is there an O(1)-selectable oblivious OCRS for matroids?

with O(1) many samples.

- What's the best oblivious OCRS in the singleton setting?
- For the singleton setting, we obtain an oblivious OCRS that is *e*
- There are transversal matroids and graphic matroids for which no oblivious CRS can be O(1)-balanced. Such CRS is not possible even



### Optimal Oblivious OCRS for Singleton

- - samples from **x**
  - Since no element before *i* is active, we may estimate
    - accept *i* with probability 1/2
  - *j* beofre *i'*

• Intuition: how do we emulate the 2-selectable OCRS without knowing **x**?

• When we see the first active element *i*, elements before *i* may be seen as



• If we did not accept *i*, then by the time we see the second active element *i*', we may estimate  $\sum_{i=1}^{n} x_i$  to be 1, and accept *i* with probability 1.



## **Optimal Oblivious OCRS for Singleton**

• Algorithm: with probability 1/2, accept the first active element; otherwise, accept the second.

**Theorem**. This algorithm is *e*-selectable. <u>*Proof.*</u> For element *i*, let A(i) be the set of elements arriving before *i*.

When *i* is active, it is accepted with probability

 $\frac{1}{2} \left[ \prod_{j \in A(i)} (1 - x_j) + \sum_{j \in A(i)} x_j \prod_{k \in A(i) \setminus \{j\}} (1 - x_k) \right], \text{ which minimizes to } \frac{1}{e} \text{ at } \mathbf{x} = (\frac{1}{n}, \dots, \frac{1}{n}).$ 



### **Oblivious OCRS for Singleton: Lower Bound**

• Algorithm: with probability 1/2, accept the first active element; otherwise, accept the second. <u>**Theorem</u></u>. No oblivious OCRS can be (e - \epsilon)-selectable for any \epsilon > 0.</u>** 

*Proof idea*: I. An OCRS is counting based if for any active *i*,

 $\Pr[i \text{ accepted}] = f(\#active elements before i).$ 

Not hard to show a counting based OCRS can't be  $(e - \epsilon)$ -selectable.



### **Oblivious OCRS for Singleton: Lower Bound**

<u>*Proof idea*</u>: I. A counting based OCRS can't be  $(e - \epsilon)$ -selectable. counting based OCRS. • Large enough *n* guarantees *S* of any desired size • This is proved via a Hypergraph Ramsey theorem.

- <u>**Theorem</u></u>. No oblivious OCRS can be (e \epsilon)-selectable for any \epsilon > 0.</u>**
- II. For any OCRS, there is a subset S on which it is approximated by a

- This proof technique was used by Correa, Dütting, Fischer, Schewior 2019



### Impossibility of Oblivious Matroid CRS

<u>Thm</u>. For any c > 0, there is no *c*-selectable oblivious CRS for graphic or transversal matroids.

<u>Proof sketch (for graphic matroid)</u>. For a complete bipartite graph  $K_{N,M'}$ , the weak distribution is one where each edge has weight  $\frac{1}{M}$ .

A strong distribution is hardwired with an event that is rare in the weak distribution.





#### A strong distribution

The bold edges are active w.p. 1

#### Relationship:

Conditioning on that a sample from the weak distribution has all the edges in  $\delta(u_i)$ , the posterior distribution is precisely the strong distribution with  $\delta(u_i)$  hardwired.





#### A sample from the weak distribution

U\*: left nodes with all incident edges active

### #edges accepted in $\delta(U^*)$ :

#### $\leq \operatorname{rank}(\delta(U^*)) = |U^*| + M - 1$









#### A sample from the weak distribution

 $U^*$ : left nodes with all incident edges active

#### $\mathbb{E}[$ #edges accepted in $\delta(U^*)]$ :

 $\geq NM \cdot \frac{1}{M^M} \cdot c$ 

$$\leq \mathbb{E}[\operatorname{rank}(\delta(U^*))] = \frac{N}{M^M} + M - 1$$

selectability on strong distribution

 $\Pr[\text{left endpoint in } U^*]$ 

Total #edges









#### A sample from the weak distribution

 $U^*$ : left nodes with all incident edges active

 $\mathbb{E}[$ #edges accepted in  $\delta(U^*)]$ :

$$\leq \mathbb{E}[\operatorname{rank}(\delta(U^*))] = \frac{N}{M^M} + M - 1$$

$$\geq NM \cdot \frac{1}{M^M} \cdot c$$

$$\Rightarrow c \leq \frac{1}{M} + \frac{M^{M-1}(M-1)}{N}$$





Make *M*, *N* arbitrarily large!



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<u>Proof sketch (for graphic matroid)</u>. For a complete bipartite graph  $K_{N,M'}$ , the weak distribution is one where each edge has weight  $\frac{1}{M}$ .

A strong distribution is hardwired with an event that is rare in the weak distribution.

**Remark**: O(1) samples cannot distinguish weak and strong distributions.



## Conclusions

#### • Our results

- An optimal oblivious OCRS for the singleton setting
- Open questions
  - Sample complexity for O(1)-selectable matroid OCRS

• O(1)-selectable oblivious OCRS for matroids is not possible

• Sample complexity for *O*(1)-competitive matroid prophet inequalities

