#### **Oblivious Online Contention Resolution Schemes**

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  - Statuses are given in an **online** fashion, revealed one by one from 1 to *n*.
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A  $\frac{1}{4}$ -selectable oblivious OCRS: Always accept w.p.  $\frac{1}{2}$  whenever possible.

### History

- 1. CRS is first formalized by Chekuri, Vondrák, Zenklusen [CVZ14] for rounding fractional solutions in submodular function maximization.
- 2. OCRS is introduced by Feldman, Svensson, Zenklusen [FSZ16]. It turns out to be a powerful tool for a wide range of applications in Bayesian and stochastic online optimization problems, such as prophet inequalities and stochastic probing.

- 1. We give a simple yet optimal  $\frac{1}{e}$ -selectable oblivious single-item OCRS.
- 2. We show that no good CRS or OCRS with O(1) samples exists for graphic or transversal matroids.

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• Analysis:  $\frac{1}{e}$ -selectable by direct calculation

$$\mathsf{Pr}[i \text{ accepted} \mid i \text{ active}] = \frac{1}{2} \left[ \prod_{j < i} (1 - x_j) + \sum_{j < i} x_j \prod_{k < i, k \neq j} (1 - x_k) \right] \ge \frac{1}{e}.$$

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$$x_1 = \frac{1}{n} \qquad x_2 = \frac{1}{n} \qquad x_3 = \frac{1}{n} \qquad x_n = \frac{1}{n}$$

### **Optimality among Counting-Based Strategies**

▶ A **counting-based strategy** with an infinite sequence of probabilities (*p*<sub>1</sub>, *p*<sub>2</sub>, ...):

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**•** No counting-based strategy can do better than  $\frac{1}{e}$  on uniform instances!

From Counting-Based Strategies to General Strategies

▶ Any oblivious OCRS A for size-N input can be characterized by  $f_A : 2^{[N]} \rightarrow [0, 1]$ :

 $f_A(T) = \Pr[A \text{ accepts (max } T)\text{-th element } | T \text{ is the set of active elements so far}].$ 

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#### Definition (( $\epsilon$ , k)-approximation)

An oblivious OCRS A is  $(\epsilon, k)$ -approximate to a counting-based strategy C on S if

$$f_A(T) \in [p_{|T|}, p_{|T|} + \epsilon]$$
 for all  $T \subseteq S$  and  $|T| \le k$ ,

where  $(p_1, p_2, \cdots)$  is the probability sequence of *C*.

Lemma (Any oblivious OCRS is partly counting-based, informal) For any oblivious OCRS A of size-N input, we can always find a subset  $S \subseteq [N]$  and a counting-based strategy C, such that A is  $(\epsilon, |S|)$ -approximate to C on S. Moreover, |S| can be arbitrarily large, as long as N is sufficiently large.

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• Having the lemma, one can easily embed the hard instances to these subsets and prove the general  $\frac{1}{e}$  lower bound.

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▶ Base case: find  $S_1$  such that A is  $(\epsilon, 1)$ -approximate to C on  $S_1$ .

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• Let 
$$\epsilon = \frac{1}{4}$$
,  $N = 5$ .

$$(\widehat{1}) \qquad (\widehat{2}) \qquad (\widehat{3}) \qquad (\widehat{4}) \qquad (\widehat{5}) \\ f_A(\{i\}) \qquad 0.4 \qquad 0.1 \qquad 0.7 \qquad 0.3 \qquad 1.0$$

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  - Let ε = 1/2, |S<sub>1</sub>| = 6. We only need to consider subsets of size = 2.
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  - Color edge (i,j) with color  $\lfloor \frac{1}{\epsilon} f_A(\{i,j\}) \rfloor$ .
  - By Ramsey Theorem, such  $S_2$  of size at least 3 exists. (R(3,3) = 6).



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 $f_A(\cdot) < 1/2 \\ f_A(\cdot) \ge 1/2$ 

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3-uniform hypergraph

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- 1. Show no counting-based strategy can be strictly better than  $\frac{1}{e}$ -selectable.
- 2. Prove for any oblivious OCRS, there must be a subset of elements on which it behaves like a counting-based strategy.
- 3. Embed the hard instance into the subset, hence the hard instance for counting-based strategies applies to all oblivious schemes.

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For any  $c \in (0, 1]$ , there is no oblivious c-balanced CRS for graphic matroids or transversal matroids. Moreover, the impossibility persists even if the CRS has access to O(1) samples of the random set R of active elements.

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- ► E.g., in the graphical matroid (U, F), let (u<sub>4</sub>, v<sub>1</sub>), (u<sub>4</sub>, v<sub>2</sub>), (u<sub>4</sub>, v<sub>3</sub>) be active w.p. 1, while other edges are active with a small probability <sup>1</sup>/<sub>M</sub>.



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- If N >> M<sup>M</sup>, these elements will be instinguishable from others!



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- [FSZ16] Moran Feldman, Ola Svensson, and Rico Zenklusen. Online contention resolution schemes. In Robert Krauthgamer, editor, <u>Proceedings of the</u> <u>Twenty-Seventh Annual ACM-SIAM Symposium on Discrete Algorithms,</u> <u>SODA 2016, Arlington, VA, USA, January 10-12, 2016</u>, pages 1014–1033. SIAM, 2016.