## Oblivious Lower Bound: this time its for real

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$$\label{eq:mit-def} \begin{split} & \text{MIT}^1, \, \text{MIT PRIMES}^2 \\ & \textit{kuszmaul@mit.edu}, \, \textit{alek.westover@gmail.com} \end{split}$$

We call an emptier  $\Delta$ -greedy-like if, when there are two cups  $c_1, c_2$  with fills satisfying fill $(c_1) > \text{fill}(c_2) + \Delta$  the emptier never empties from  $c_2$  without emptying from  $c_1$  on the same round. Intuitively, a  $\Delta$ -greedy-like emptier has a  $\pm \Delta$  range within it is allowed to "not be greedy". Note that a perfectly greedy emptier is 0-greedy-like. Greedy and greedy-like emptiers are of great interest.

We only prove lower bounds for backlog that the filler can achieve against  $\Delta$ -greedy-like emptiers, where  $\Delta \leq O(1)$ ; whether, and if so how, these results can be extended to a more general class of emptiers is an interesting open question.

We say that a cup configuration is **smooth** if every cup has fill in the interval  $[-\Delta - 1, \Delta + 1]$ . Let the **anti-backlog** of a set S of cups be  $-\min_{c \in S} \text{fill}(c)$ ; note that anti-backlog is non-negative, and is the absolute value of the fill of the cup with lowest fill.

First we prove a key property of greedy-like emptiers.

**Proposition 1.** Given a cup configuration with positive tilt T, an oblivious filler can, in running time T, achieve a smooth configuration of cups against a  $\Delta$ -greedy-like emptier  $(\Delta \leq O(1))$ .

Proof. The filler sets p=n/2, and equally distributes fill among the cups. As long as there is some cup with fill above  $\Delta+1$  the emptier must empty from a cup with fill at least 1. Thus, until all cups have fill below  $\Delta+1$  the positive tilt of the set of cups decreases by n/2 every round. However, the positive tilt also increases, by at most (n-1)/2 (which is achieved if there is a single cup with negative fill). The net change in positive tilt is thus a decrease of at least 1/2. It is impossible for the positive tilt to decrease by 1/2 for more than 2T rounds, hence by some round i < 2T all cups will have fill at most  $\Delta+1$ .

Furthermore the anti-backlog cannot have started any higher than T, and the fill of negative cups increases by 1/2 each time.

I'm pretty close here. More importantly, the proposition is true. At least so I believe. Maybe need to change the range to be a bit wider.

(where  $\Delta \leq O(1)$  is a constant known to the filler), with constant probability.

Proof. Let A, the **anchor** set, be a subset of the cups chosen uniformly at random from all subsets of size n/2

**Proposition 2.** There exists an oblivious filling strategy

in the variable-processor cup game on n cups that

achieves backlog  $\Omega(\log n)$  against a  $\Delta$ -greedy-like emptier

*Proof.* Let A, the **anchor** set, be a subset of the cups chosen uniformly at random from all subsets of size n/2 of the cups, and let B, the **non-anchor** set, consist of the rest of the cups (|B|=n/2). Let  $h=8\Delta+8$ , and let h'=2. Our strategy is roughly as follows:

- Step 1: Make a constant fraction of cups in A have fill at least h by playing single processor cup games on constant-size subsets of B. With constant probability we can attain a cup in B with constant fill by this method, that we then swap into A. By a Chernoff bound we get a constant fraction of A, say cn cups, to have fill at least h with exponentially good probability.
- Step 2: Reduce the number of processors to *cn*, and raise the fill of *cn known* cups to fill *h'*.
- Step 3: Recurse on the nc cups that are known to have fill at least h'.

By performing  $\Omega(\log n)$  levels of recursion, achieving constant backlog h' at each step (relative to the average fills), the filler achieves backlog  $\Omega(\log n)$ .

We now provide a detailed description of the filling algorithm, to prove that the results claimed in Step 1 and Step 2 are attainable.

To attain step 2, we smooth the non-anchor set. Now we detail how to achieve Step 1.

We perform a series of *swapping-process*, which are procedures that we use to get a new cup in A. A swapping-process is composed of a substructure, repeated many times, which we call a *round-block*; a round-block is a set of rounds. At the beginning of a swapping-process we choose a round-block  $j \in [n^2]$  uniformly at random from all the round-blocks. The swapping-process proceeds for  $n^2$  round-blocks; on the j-th round-block we swap a cup into the anchor set.

On each of the  $n^2$  round-blocks, the filler selects a random subset  $C \subset B$  of the non-anchor cups and plays a single processor cup game on C. In this single-processor cup

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game the filler employs the classic adaptive strategy for achieving backlog  $\Omega(\log|B|)$  on a set of |B| cups, however modified because it is an oblivious filler. In particular, the filler's strategy in the single-processor cup games is to distribute water equally among an *active set* of cups, and then after the emptier removes water from some cup the filler removes a random cup from the active set. There is at least constant probability that this results in the active set having a single cup at the end, with fill that has increased by at least  $1/|B|+1/(|B|-1)+...+1/1 \ge \ln|B|$  since the start of the round-block.

On most round-blocks – all but the j-th – the filler does nothing with the cup that it achieves in the active set at the end of the single processor cup game. However, on the j-th round-block the filler swaps the winner of the single processor cup game into the anchor set.

Claim 1. Let  $q \geq \Omega(1)$  be an appropriately small constant (q is a function of  $h \leq O(1)$ ). In Case 1, with probability at least  $1-e^{-nq^2/1024}$ , we achieve fill at least h in at least nq/16 of the cups in A (i.e. a constant fraction of the cups in A). In particular, this implies that we achieve positive tilt  $nq/16 \geq \Omega(n)$  in A.

*Proof.* Consider a swapping-process where the filler does not perform a storing-operation where at least 1/2 of the cups  $c \in B$  have  $\text{fill}(c) \ge -h$ . Note that by assumption there are at least  $n/4-3/2\gamma$  such rounds.

Say the emptier neglects the anchor set in a round-block if on at least one round of the round-block the emptier does not empty from every anchor cup. By playing the single-processor cup game for  $n^2$  round-blocks, with only one round-block when we actually swap a cup into the anchor set, we strongly disincentive the emptier from neglecting the anchor set on more than a constant fraction of the round-blocks.

The emptier must have some binary function, I(i) that indicates whether or not they will neglect the anchor set on round-block i if the filler has not already swapped. Note that the emptier will know when the filler perform a swap, so whether or not the emptier neglects a round-block i depends on this information. However, j is the only parameter of the swapping-process, so there is no other information that the emptier can use to decide whether or not to neglect a round-block, because on any round-block when we simply redistribute water amongst the non-anchor cups we effectively have not changed anything about the game state.

If the emptier is willing to neglect the anchor set for at least 1/2 of the round-blocks, i.e.  $\sum_{i=1}^{n^2} I(i) \ge n^2/2$ , then with probability at least 1/4,  $j \in ((3/4)n^2, n^2)$ , in which case the emptier neglects the anchor set on at least  $n^2/4$  round-blocks (I(k) must be 1 for at least  $n^2/4$  of the first  $(3/4)n^2$  round-blocks). Each time

the emptier neglects the anchor set the mass of the anchor set increases by at least 1. Thus the average fill of the anchor set will have increased by at least  $(n^2/2)/(n/2) \ge \Omega(n)$  over the entire swapping-process in this case, implying that we achieve the desired backlog.

Otherwise, there is at least a 1/2 chance that the round-block j, which is chosen uniformly at random from the round-blocks, when the filler performs a swap into the anchor set occurs on a round-block with I(j) = 0, indicating that the emptier won't neglect the anchor set on round-block j. In this case, the round-block was a legitimate single processor cup game on  $C_j$ , the randomly chosen set of  $\lceil e^{2h} \rceil$  cups on the j-th round. Then we achieve fill increase  $\geq 2h$  by the end of the round-block with probability at least  $1/\lceil e^{2h} \rceil!$  – the probability that we correctly guess the sequence of cups within the single processor cup game that the emptier empties from.

The probability that the random set  $C_j \subset B$  contains only cups that are among the n/4 fullest cups in B is

$$\binom{n/2}{\lceil e^{2h} \rceil} / \binom{n}{\lceil e^{2h} \rceil} = O(1).$$

Note that because, by assumption, at least half of the cups  $c \in B$  have fill $(c) \ge -h$ , then the n/4 fullest cups in B must have fill at least -h. If all cups  $c \in C_j$  have fill $(c) \ge -h$ , then the fill of the cup in the active set at the end of the round-block is at least -h+2h=h, if the filler guesses the emptier's emptying sequence correctly.

Say that a swapping-process where at least half of the cups  $c \in B$  have  $\mathrm{fill}(c) \geq -h$  succeeds if  $C_j$  is a subset of the n/4 fullest cups in B, and if the filler correctly guesses the emptier's emptying sequence. Note that if a swapping-process succeeds, then the filler is able to swap a cup with fill at least h into A. We have shown that there is a constant probability of a given swapping-process succeeding. Let  $X_i$  be the binary random variable indicating whether or not the i-th swapping process where the filler does not perform a storing-operation where at least half of the cups  $c \in B$  have  $\mathrm{fill}(c) \geq -h$  succeeds. Let  $q \geq \Omega(1)$  be the probability of a swapping-process succeeding, i.e.  $P(X_i = 1)$ . Note that the random variables  $X_i$  are clearly independent, and identically distributed.

Clearly

$$\mathbb{E}\left[\sum_{i=1}^{n/8} X_i\right] = qn/8.$$

Note that we do not use all the  $X_i$ ; we know there must be at least  $n/4-3/2\gamma$  swapping-processes that do not consist of a storing-operation, but only use n/8 of the  $X_i$ . We make this choice because the particular constants that we get do not matter, and because it substantially simplifies the analysis. By a Chernoff Bound (i.e. Hoeffding's Inequality applied to binary random variables),

$$P\left(\sum_{i=1}^{n/8} X_i \le nq/16\right) \le e^{-nq^2/1024}.$$

That is, the probability that less than nq/16 of the anchor cups have fill at least h is exponentially small in n, as desired.

**Lemma 1** (The Oblivious Amplification Lemma). Let f be an oblivious filling strategy that achieves backlog f(n) in the variable-processor cup game on n cups with constant probability (relative to average fill, with negative fill allowed). Let  $\delta \in (0,1)$  be a parameter. Then, there exists an adaptive filling strategy that, with constant probability, either achieves backlog

$$f'(n) \ge (1-\delta) \Big( f((1-\delta)n) + f((1-\delta)\delta n) \Big)$$

or achieves backlog  $\Omega(poly(n))$  in the variable processor cup game on n cups.

Corollary 1. There is an oblivious filling strategy for the variable-processor cup game on n cups that achieves backlog at least  $2^{\Omega(\sqrt{\log n})}$  in running time O(n) with constant probability.

Proof. Given the Oblivious Amplification Lemma we could try to apply the same strategy as outlined in the proof of Corollary ?? to achieve backlog  $\Omega(n^{1-\epsilon})$  for constant  $\epsilon > 0$  in time  $2^{O(\log^2 n)}$ . Because of our definition of an overpowered cup as a cup with fill at least  $\tilde{\Omega}(\sqrt{n})$ , we can't get quite as close to linear as an adaptive filer could. However, the more pressing problem is that of running time: randomized algorithms are traditionally supposed to have polynomial-running time. By artificially reducing n, i.e. ignoring some portion of the cups, we can get an algorithm that achieves high backlog, but in polynomial time. In particular, we want to choose a subset of n' of the cups to focus on, where  $2^{O(\log^2 n')} = O(n)$ . An appropriate choice is  $n' = 2^{\sqrt{\log n}}$ .

With n' chosen, we apply the exact same strategy as given in the paragraph in the proof of Corollary on the  $2^{O(\log^2 n)}$ -time construction for achieving backlog  $\Omega(n^{1-\epsilon})$  for constant  $\epsilon > 0$ , but using repeated application of the Oblivious Amplification Lemma rather than the Adaptive Amplification Lemma, which yields the disclaimer that the backlog is only achieved with constant probability. Thus, we achieve backlog  $\Omega(n')$  in running time

 $2^{O(\log^2 n')}$ . By design, expressing this in terms of n the filler achieves backlog  $2^{\Omega(\sqrt{\log n})}$  in running time O(n).

For completeness we – briefly (as they are nearly identical) – present the ideas from Proposition ?? in the randomized context.

Fix constant  $\epsilon > 0$  and choose appropriate constant  $\delta$ , as mandated by Claim ??. Choose constant c, according to an inequality to be specified later. We aim to achieve backlog  $c(n')^{1-\epsilon}$ . As before, we define a sequence of functions. First,

$$f_0(k) = \begin{cases} \lg k, & k \ge 1, \\ 0 & \text{else.} \end{cases}$$

Then, we define  $f_i$  as the amplification of  $f_{i-1}$  for  $i \ge 1$ , where amplification is as defined in the Oblivious Amplification Lemma. However, this time the filling strategy  $f_i$  achieves backlog  $f_i(k)$  on k cups only with constant probability. As before we define a sequence  $g_i$  as

$$g_i = \begin{cases} \lceil 1/\delta \rceil \gg 1, & i = 0, \\ \lceil g_{i-1}/(1-\delta) \rceil - 1 & i \ge 1. \end{cases}$$

Claim ??, which states that

$$f_i(k) \ge ck^{1-\epsilon}$$
 for all  $k < g_i$ ,

holds with no modifications required.

Again, because  $g_i$  is increasing, we achieve the desired backlog  $c(n')^{1-\epsilon}$  in finite time. In particular, applying identical arguments to those in Corollary ??, we find that the running time is  $2^{O(\log^2 n')}$ .

As stated earlier, by design of n', this means we get backlog  $2^{\Omega(\sqrt{\log n})}$  in time O(n).