# Matching on the line admits no $o(\sqrt{\log n})$ -competitive algorithm

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## — Abstract -

We present a simple proof that the competitive ratio of any randomized online matching algorithm for the line exceeds  $\sqrt{\log_2(n+1)}/15$  for all  $n = 2^i - 1$ :  $i \in \mathbb{N}$ , settling a 25-year-old open question.

2012 ACM Subject Classification Theory of computation  $\rightarrow$  Online algorithms

Keywords and phrases Metric matching, online algorithms, competitive analysis

Digital Object Identifier 10.4230/LIPIcs.ICALP.2021.99

Related Version Available at: https://arxiv.org/abs/2012.15593

Funding Michele Scquizzato: supported, in part, by Univ. Padova grant BIRD197859/19.

**Acknowledgements** We are indebted to Kirk Pruhs and the anonymous reviewers for their constructive criticism and insightful observations.

# **1** Online matching, on the line

In online metric matching [7, 9] n points of a metric space are designated as servers. One by one n requests arrive at arbitrary points of the space; upon arrival each must be matched to a yet unmatched server, at a cost equal to their distance. Matchings should minimize the ratio between the total cost and the offline cost attainable if all requests were known beforehand. A matching algorithm is c(n)-competitive if it keeps this ratio no higher than c(n) for all possible placements of servers and requests.

It is widely acknowledged [1, 10, 14] that the line is the most interesting metric space for the problem. Matching on the line models many scenarios, like a shop that must rent to customers skis of approximately their height, where a stream of requests must be serviced with minimally mismatched items from a known store. Despite matching being specifically studied on the line since at least 1996 [8], no tight competitiveness bounds are known.

As for upper bounds, the line is a doubling space and thus admits an  $O(\log n)$ -competitive randomized algorithm [5]; a sequence of recent developments [1, 12, 13] yielded the same ratio without randomization. Better bounds have been obtained only by algorithms with additional power, such as that to re-assign past requests [6, 11] or predict future ones [2].

As for lower bounds, the competitive ratio is at least 4.591 for randomized algorithms and 9 for deterministic ones since the *cow-path* problem is a special case of matching on the line [8]. These bounds were conjectured tight [8] until a complex adversarial strategy yielded a lower bound of 9.001 for deterministic algorithms [4]. Beyond some  $\Omega(\log n)$  bounds for restricted classes of algorithms [3, 10, 12], there has been no further progress on the lower-bound side before this work.



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48th International Colloquium on Automata, Languages, and Programming (ICALP 2021). Editors: Nikhil Bansal, Emanuela Merelli, and James Worrell; Article No. 99; pp. 99:1–99:3

Leibniz International Proceedings in Informatics

LIPICS Schloss Dagstuhl – Leibniz-Zentrum für Informatik, Dagstuhl Publishing, Germany

## **2** An $\Omega(\sqrt{\log n})$ -competitiveness bound

We prove a simple  $\Omega(\sqrt{\log n})$  lower bound on the competitive ratio of randomized online matching algorithms for the line.

For any  $n = 2^i - 1$  with  $i \in \mathbb{N}$  consider the [0, n+1] interval; for each positive integer  $j \leq n$ place a server at point j, and place n requests over  $\log_2(n+1)$  rounds as follows. On the  $r^{th}$ round (for  $1 \leq r \leq \log_2(n+1)$ ) partition the interval into  $(n+1)/2^r$  subintervals of length  $2^r$ , choose within each uniformly and independently at random an *origin* point, and place a request on the closest integer multiple of  $2^{-n}$  breaking ties arbitrarily. "Discretizing" requests instead of directly using the corresponding origins prevents some technical difficulties – see our remark at the end.

We prove in Lemma 1 that the expected distance between the  $\ell^{th}$  leftmost server and the  $\ell^{th}$  leftmost origin is  $O(\sqrt{\log n})$ , so servers and requests can be matched with an expected offline cost  $O(n\sqrt{\log n})$ . Conversely, we prove in Lemma 2 that *any* online matching algorithm ALG incurs an expected  $\Omega(n)$  cost in any given round, for a total cost  $\Omega(n \log n)$ . The two results can be combined to prove that on *some* request sequence ALG incurs  $\Omega(\sqrt{\log n})$  times the offline cost.

▶ Lemma 1. The expected distance between the  $\ell^{th}$  leftmost origin and the  $\ell^{th}$  leftmost server is at most  $\sqrt{\log_2(n+1)} + 3$ .

**Proof.** Let  $S_{\ell}$  be  $\ell^{th}$  leftmost server and  $g_{\ell}$  be the number of origins to its left. Note that if  $g_{\ell}$  equals respectively  $\ell$  or  $\ell - 1$ , the  $\ell^{th}$  origin is the first immediately to the left, or to the right of  $S_{\ell}$ ; and since the first round placed one origin in every subinterval of size 2, such an origin is within distance 3 of  $S_{\ell}$ . By the same token, denoting by  $\delta_{\ell}$  the quantity  $|g_{\ell} - (\ell - \frac{\ell}{n+1})|$ , the  $\ell^{th}$  leftmost origin is within distance  $2\delta_{\ell} + 3$  of  $S_{\ell}$ . Note that  $\delta_{\ell}$  is the absolute deviation from the mean of  $r_{\ell}$ , since  $r_{\ell}$  is the sum of n independent indicator random variables each denoting whether a given origin was placed to the left of  $S_{\ell}$ , with total expectation  $\frac{n}{n+1}\ell = \ell - \frac{\ell}{n+1}$  (by construction, the expected density of origins is constant throughout the main interval). At most one such variable in a given round has variance greater than 0, albeit obviously at most 1/4: that corresponding to the origin placed in a subinterval holding  $S_{\ell}$  strictly in its interior. Adding the individual variances we obtain that the variance of  $r_{\ell}$ , i.e. the expectation of  $\delta_{\ell}^2$ , is at most  $\log_2(n+1)/4$ ; and since by Jensen's inequality  $E[\delta_{\ell}] \leq E[\delta_{\ell}^2]^{\frac{1}{2}}$ , the expected distance between  $S_{\ell}$  and the  $\ell^{th}$  leftmost origin is at most  $\sqrt{\log_2(n+1)} + 3$ .

▶ Lemma 2. Any randomized online matching algorithm incurs an expected cost greater than (n+1)/12 in each round.

**Proof.** Consider an origin placed uniformly at random in a subinterval of size  $2^r$  during the  $r^{th}$  round. Assume *m* unmatched servers in the interior points of that subinterval divide it into m + 1 segments of (integer) length  $d_0, \ldots, d_m$ . Then the probability the corresponding request falls within a segment of length d is  $d/2^r$ , in which case the expected distance of the request from the segment's closer endpoint is d/4. Adding over all the  $s_r$  segments in all the round's subintervals, applying Jensen's inequality, and noting that  $s_r$  does not exceed the number of subintervals (i.e.  $(n+1)/2^r$ ) plus the total number of unmatched servers (i.e.  $(n+1)/2^{r-1} - 1$ ), the expected cost to service all requests in the round is at least:

$$\sum_{h=1}^{s_r} \frac{d_h}{4} \cdot \frac{d_h}{2^r} \ge \frac{1}{4 \cdot 2^r} s_r \left(\frac{n+1}{s_r}\right)^2 > \frac{(n+1)^2}{4 \cdot 2^r} \cdot \frac{2^r}{3(n+1)} = \frac{n+1}{12}.$$

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We can then easily prove the following:

▶ **Theorem.** The competitive ratio of any randomized online matching algorithm for the line exceeds  $\sqrt{\log_2(n+1)}/15$  for all  $n = 2^i - 1 : i \in \mathbb{N}$ .

**Proof.** Let  $C_A(\sigma)$  be the expected cost incurred by a randomized online matching algorithm ALG on a request sequence  $\sigma$ , and  $C_O(\sigma)$  the offline cost; and let  $p_{\sigma}$  be the probability of generating  $\sigma$  through the origin-request process described earlier. Since  $\forall a_i, b_i > 0$  we have that  $(\sum_i a_i)/(\sum_i b_i)$  is a convex linear combination of the individual ratios  $a_i/b_i$ , focusing on the case  $\sqrt{\log_2(n+1)}/15 \ge 1$  for which  $\sqrt{\log_2(n+1)} + 3 + 2^{-n} < (5/4)\sqrt{\log_2(n+1)}$ :

$$\max_{\sigma: p_{\sigma} \neq 0} \frac{C_A(\sigma)}{C_O(\sigma)} \ge \frac{\sum_{\sigma: p_{\sigma} \neq 0} C_A(\sigma) p_{\sigma}}{\sum_{\sigma: p_{\sigma} \neq 0} C_O(\sigma) p_{\sigma}} > \frac{(n+1)\log_2(n+1)/12}{n(\sqrt{\log_2(n+1)} + 3 + 2^{-n})} > \frac{\sqrt{\log_2(n+1)}}{15}.$$

**Remark:** Without discretized requests the term  $\sum_{\sigma: p_{\sigma} \neq 0} C_A(\sigma) p_{\sigma}$  in the theorem's proof would have been an integral, potentially ill-defined (for example, if ALG serviced requests for rational points in an interval with one server and for irrational points with another).

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