

Entropic Lower Bounds for Sorting

“I play K. 330 slowly and evenly, as if X-raying a mollusc. — Glenn Gould”
— Sam Tenka

The $n \lg n$ lower bound on comparison sorts allures me with its beauty. It goes like this: to identify a total order on a size- n set is to distinguish between $n!$ possibilities. Each interesting query to \leq has two possible outcomes and hence yields at most one bit of information. A sorting algorithm based only on comparisons thus requires at least $\lg(n!) \sim n \lg n$ many queries; merge sort realizes this bound.¹

This note discusses some lower bounds for related problems.

¹ We consider complexities up to \sim , where $f \sim g$ means $\lim f/g = 1$. We thus attend to constants but not to lower order terms. Here, $\lg = \log_2$.

Counting Queries

Decision Trees

The concept of *decision trees* abstracts our notion of algorithm to a level convenient for information-theoretic reasoning. An algorithm’s complexity is then its height as a tree. We’ll rely only on an intuitive understanding of such algorithms and their complexity; still, to fix terminology we give a formal definition here. We consider the problem of implementing a map $\text{TASK} : \mathcal{X} \rightarrow \mathcal{Z}$ in terms of queries — labeled by $q \in \mathcal{Q}$ — whose meanings are defined by $\text{ASK} : \mathcal{Q} \rightarrow \mathcal{X} \rightarrow \mathcal{A}$. (We’ll consider only finite $\mathcal{X}, \mathcal{Q}, \mathcal{A}, \mathcal{Z}$ s and surjective TASKS.) For a fixed problem $(\text{TASK}, \text{ASK})$, an algorithm of complexity c is a pair $(\text{NEXT} : \mathcal{A}^* \rightarrow \mathcal{Q}, \text{READ} : \mathcal{A}^{\times c} \rightarrow \mathcal{Z})$ that is correct on all inputs:

$$\begin{aligned} (\text{TASK}(x), x) &= ((\text{READ} \times \text{id}_{\mathcal{X}}) \circ \text{BODY}^{\circ c}) ([], x) \\ \text{BODY}(\ell, x) &= (\text{PUSH } \ell (\text{ASK}(\text{NEXT } \ell) x), x) \end{aligned}$$

Here, $\mathcal{A}^* = \bigsqcup_n \mathcal{A}^{\times n}$ is the type of \mathcal{A} -valued lists; its constructors are $[] : \mathcal{A}^*$ (the empty list) and $\text{PUSH} : \mathcal{A}^* \rightarrow \mathcal{A} \rightarrow \mathcal{A}^*$.

We’re interested in lower bounds on c for various problems. For example, we may model comparison sorting as the problem of computing the identity function $\text{TASK} = \text{id}_{\mathcal{X}}$ on the set \mathcal{X} of total orders on a size- n set \mathcal{S} by querying $\text{ASK} : (\mathcal{S}^2 \setminus$

diagonal) $\rightarrow \mathcal{X} \rightarrow \{\text{less, more}\}$. As another example, the field of *communication complexity* studies problems where $\text{TASK} : \text{Alice} \times \text{Bob} \rightarrow 2$ is a joint predicate and $\text{ASK} : (2^{\text{Alice}} \sqcup 2^{\text{Bob}}) \rightarrow \mathcal{X} \rightarrow 2$ is the canonical evaluation map.

A Basic Bound

Recall the $n \lg n$ argument we started with. We isolate its essence as follows. A probability distribution on \mathcal{X} induces (via TASK) a distribution on \mathcal{Z} and (for any fixed algorithm of complexity c) on $\mathcal{Q}^c, \mathcal{A}^c$. Let's abuse notation by writing T for the evident random variable of type T ; for instance, $H(\mathcal{Z})$ is the Shannon entropy of the random variable $z = \text{TASK}(x)$. When we choose \mathcal{X} 's distribution so that \mathcal{Z} 's distribution is uniform, the data processing inequality immediately gives the following complexity bound:

Lemma (Counting Bound). $c \lg |\mathcal{A}| \geq H(\mathcal{A}^c) \geq H(\mathcal{Z}) = \lg |\mathcal{Z}|$.

As is usual, each problem we consider is actually part of a natural-number indexed family of problems and thus induces a sequence $(c_n : n \in \mathbb{N})$ of complexities. We study these sequences up to the preorder $f \lesssim g$ defined by $\lim f/g \leq 1$. With this in mind, we plug in $|\mathcal{X}| = |\mathcal{Z}| = n!$ and $|\mathcal{A}| = 2$ to recover the $c \gtrsim n \lg n$ bound for comparison-based identification of total orders.

The counting bound gives some interesting results for related identification (i.e., $\text{TASK} = \text{id}_{\mathcal{X}}$ problems:

Puzzle (Merge). Let's merge two sorted lists of sizes m, n with $1 \ll k \ll n$. More precisely, we fix $\mathcal{S} = [k] \sqcup [n]$, set \mathcal{X} to the set of total orders on \mathcal{S} that restrict to the standard orders on $[k], [n]$, and let ASK compare distinct pairs in \mathcal{S}^2 . Show that $c \gtrsim n \lg(n/k)$ and that this bound is achieved. For example, if $k \sim n / \lg n$, then $c \sim n \lg \lg n / \lg n$ is optimal — strictly better than the “zip” or “search” strategies! This win-win prefigures *fractional cascading*.

Puzzle (Ballots). Let's sort potentially tied elements. So \mathcal{X} contains the ballots (a.k.a.: total preorders) on \mathcal{S} that have k equivalence classes. Here, ASK maps to $\{\text{less, tied, more}\}$. The counting bound says $c \gtrsim n \lg k / \lg 3$. Improve this bound to $c \gtrsim n \lg k$ and show that the latter is tight. Hint: a routine transformation gives for any complexity- c' algorithm a complexity- $c \leq c'$ algorithm that for any x makes fewer than n queries answered by “tied”.

Examples in Communication

Communicating an Equality.

Communicating a Comparison.

Convex Cohorts

Distinct Elements

Strictly Orderable.

Counterfeit Coins. We have n coins, some of which may be counterfeit. Not all of the coins are counterfeit. The counterfeit coins weigh $1 + \epsilon$ while the ordinary coins weigh 1 for $\epsilon < 1/n$. We have a balance that tells us for any two subsets of the n coins which, if any, is heavier. In how few comparisons may determine whether or not there are any counterfeit coins?

Now $\mathcal{X} = 2^n \setminus [n]$ and $\text{TASK } x$ indicates whether or not \mathcal{X} is empty. Now $\mathcal{Q} = \sum_k \binom{n}{k}^2$ and $\text{ASK } (a, b) \times$ indicates whether or not $|x \cap a| = |x \cap b|$. What sorts of lower bounds on c can we come up with?

Range

Minimum.

Range.

Constraints of no Consequence

Length

Bits

problem	counting	lower	upper	direct
Merge			$n \lg \lg n / \lg n$	
Ballots			$n \lg n / 2$	
Strictly			$n \lg n$	
Counterfeit			$2 \lg n / \lg \lg n$	
Minimum			n	
Range			$3n/2$	
Length			$(\lg n)^2 / 2$	
Bits			$O(n \lg \lg n)$	