# Sp18 CS 61B Discussion 13

#### Welcome!

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#### Announcements

- Project 3 is due 4/18!
- HW 5 released 4/20 and due 4/25

#### **Quiz Instructions**

- If you haven't yet, please also neatly put your email address outside the name box if you want to be emailed!
- Bubble number 41.

#### Forms

- Want to meet with me specifically?
  - https://goo.gl/forms/3HyKxt0ZAWHKRmij2
- Want to meet with any TA (not me)? @3258
- Survey:
  - https://goo.gl/forms/qxZ8qzS47HB62wiE3

## Aside

- Question: How to sort 1 billion numbers?
  - Cannot fit in one machine's memory, but can fit on disk.
  - What's the algorithm?

- Split the input into memory-sized chunks.
- For each chunk, quicksort in memory, then write to disk.
- Okay, now we have N chunks of sorted numbers. What next?

- We do an n-way streaming merge-sort!
- Example: Memory can hold 4 blocks

```
• Output: [] [1, 4, 9, ...] [0, 1, 1, ...] [4, 5, 8, ...]
```

```
• Output: [] [1, 4, 9, ...] [0, 1, 1, ...] [4, 5, 8, ...]
```

```
Output: [0][1, 4, 9, ...][1, 1, ...][4, 5, 8, ...]
```

```
Output: [0]
[1, 4, 9, ...]
[1, 1, ...]
[4, 5, 8, ...]
```

```
Output: [0, 1][4, 9, ...][4, 5, 8, ...]
```

```
Output: [0, 1][4, 9, ...][4, 5, 8, ...]
```

```
Output: [0, 1, 1][4, 9, ...][4, 5, 8, ...]
```

Output: [0, 1, 1] -> Write out!
[4, 9, ...] [1, ...] [4, 5, 8, ...]

```
• Output: [] [4, 9, ...] [4, 5, 8, ...]
```

```
Output: [][4, 9, ...][4, 5, 8, ...]
```

```
Output: [1][4, 9, ...][4, 5, 8, ...]
```

```
• Output: [1]
[4, 9, ...] [...] [4, 5, 8, ...]
Read in!
```

```
• Output: [1]
[4, 9, ...] [8, 9, 9, ...] [4, 5, 8, ...]
Read in!
```

```
Output: [1][4, 9, ...] [8, 9, 9, ...] [4, 5, 8, ...]
```

```
Output: [1, 4][9, ...] [8, 9, 9, ...] [4, 5, 8, ...]
```

## External Sorting (CS 186)

You'll learn a more optimized version in CS 186!

#### External Sorting (CS 186)

 One quick optimization: Use N machines to quicksort each chunk!

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## Inversions

#### **Definition of Inversion**

- Given list A[1...N]:
  - o For every i:
    - For every j such that i < j:
      - Exist inversion if A[i] > A[j]

## Heapify

#### **Quick Visualization**

- Visualization
- Build heap bottom-up.
- At each sub-heap, find the smaller child, push up. Take the new child, and compare with its children.
- Runtime proof

#### Runtime Proof

3.4 Extra: Show that the running time of bottom-up heapify is  $\Theta(n)$ .

Some useful facts:

$$\sum_{i=0}^{\infty} x^i = \frac{1}{1-x}$$

Taking the derivative of both sides:

$$\sum_{i=0}^{\infty} ix^i = \frac{x}{(1-x)^2}$$

Running time of heapify is:

$$\begin{split} \sum_{i=0}^{\log n} i \frac{n}{2^{i+1}} &= \frac{n}{2} \left( \sum_{i=0}^{\log n} i \left( \frac{1}{2} \right)^i \right) \\ &\leq \frac{n}{2} \left( \sum_{i=0}^{\infty} i \left( \frac{1}{2} \right)^i \right) \\ &= \frac{n}{2} \frac{\frac{1}{2}}{(\frac{1}{2})^2} \\ &= \Theta(n) \end{split}$$

Essentially, the idea is just that each level roughly doubles the work, so the total runtime dependency on n is linear.

#### Extra: Is Heapsort Good?

- Is heapsort good?
  - Theta(N log N)!

#### Extra: Is Heapsort Good?

- In practice, it is bad for full sorts.
  - Quicksort is on average faster!
  - Unlike merge-sort, it is not stable!
  - Bad caching
  - Cannot parallelize heapsort easily to multiple machines.

## Quicksort Optimization

#### Minimize Memory

- Hoare Partitioning: in-place partition
  - v.s. Creating three arrays, smaller, equal, and bigger.

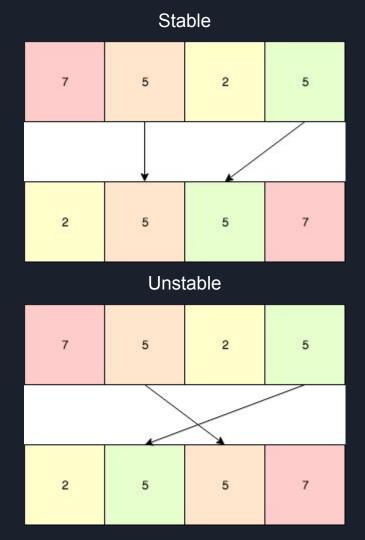
#### Minimize Runtime

- Median pivots or approximate medians
  - Avoid worst case
  - Quickselect: Linear time median picking.
  - Randomized approximate medians: Simply pick k random pivots, and run an O(k) median selection (k << n)</li>

# Stability

#### Sorting Stability

- Stable: Objects with the same value appear in the same order in the sorted output.
- We will see its power during radix sort!



## **Onto Discussion**