

Admin

- Exam 2 graded!  
↳ regrades till 6/18 9pm
- XL exam 6/18 during class
- Second chance HW 6/18 9pm

Agenda

1. Expected run-time
2. Randomized Quicksort
3. Rand-Select

1. Expected Run-time

- ↳ run-time of an algorithm
- usually ...  $\Theta()$  upper band + lower band
- ↳ usually ... worst case scenario

Ex) Linear Search

- b.c.  $\Theta(1)$  first thing?  
w.c.  $\Theta(n)$  target not in array

Insertion Sort

- b.c.  $\Theta(n)$  sorted!  
w.c.  $\Theta(n^2)$  reverse sorted

Worst case algo, in b.c. or w.c. depending on

1. Luck
2. Adversary?

↳ can't avoid bad luck

instead, in w.c. scenario, make it luckier in insert

↳ now, compute run-time with a probabilistic model

How do we compute probabilistic run-time?

Expected run-time  $\approx$  Expected Value

$$EV[X] = \sum_i P_r(S_i) \cdot \frac{x_i}{\text{Prob of outcome}} \rightarrow \text{value of the outcome}$$

randomization

- ↳ how
- 1. shuffle input
- 2. randomize selection

$$EV[\text{Dep}] = \Pr(\text{right}) \cdot \text{bet} + \Pr(\text{wrong}) \cdot -\text{bet}$$

$$= (.8) \cdot 1000 + (.2)(-1000)$$

80% chance in algo category  
!!

↳ In run-time

$$EV[\text{algo}] = \Pr(\text{run-time}) \cdot \text{run-time} + \dots$$

$$= (.75)(n) + (.25)(n^2)$$

↳ 75% chance linear  
25% chance  $n^2$   $\rightarrow EV$  is real-world average!

↳ if  $EV$  better than w.c., we win!   (ve beat them)

## 2. Randomized Quicksort

```
QSORT(A, p, r)
  if p < r
    q = PART(A, p, r)
    QSORT(A, p, q-1)
    QSORT(A, q+1, r)
```

Choose  $A[r]$  as pivot  
 - smaller on left  
 - larger on right  
 - return position of pivot  
 (never moves again!)

(Always choose  $A[r]$  as pivot  
 arbitrary, but not random)

Best Case (lucky)

$$T(n) = T\left(\frac{n}{2}\right) + T\left(\frac{n}{2}\right) + C \cdot n$$



Worst Case 

$$T(n) = T(n-1) + T(0) + C \cdot n$$

$$= \Theta(n^2)$$



$\rightarrow = \Theta(n \lg n)$  split is  $\gamma_2, \gamma_2$  in best case

variation: split is  $2/3, 1/3$

$$T(n) = T\left(\frac{2}{3}n\right) + T\left(\frac{1}{3}n\right) + C \cdot n$$

$$= \Theta(n \lg n)$$

Variation: split is  $\frac{3}{4}n$ ,  $\frac{n}{4}$

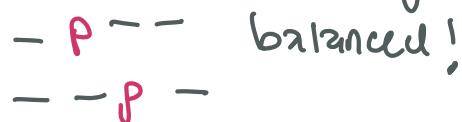
$$\begin{aligned} T(n) &= T\left(\frac{3}{4}n\right) + T\left(\frac{n}{4}\right) + C \cdot n \\ &= \Theta(n \lg n) \end{aligned}$$

## Tasks:

1. intro randomization  $\rightsquigarrow$  randomly choose pivot
2. decide on "good" split  $\rightsquigarrow$  balanced?

what is balance?

e.g. 4 elements in array



generalized ...

• balanced =  $p$  is between  $\frac{1}{4}n$  to  $\frac{3}{4}n$

• unbalanced =  $p$  is anywhere else



Balanced prob = 50%

Balanced split =  $T(n) = T\left(\frac{3}{4}n\right) + T\left(\frac{n}{4}\right) + C \cdot n$

Expected run-time:  $(.5)(\text{balanced}) + (.5)(\text{unbalanced})$

$$T(n) \leq \frac{1}{2} \left( T\left(\frac{3}{4}n\right) + T\left(\frac{n}{4}\right) + C \cdot n \right) + \frac{1}{2} (T(n) + C \cdot n)$$

$$\leq \frac{1}{2} T(n) + \frac{1}{2} Cn + \frac{1}{2} Cn + \frac{1}{2} T\left(\frac{3}{4}n\right) + \frac{1}{2} T\left(\frac{n}{4}\right)$$

$$\frac{1}{2} T(n) \leq C \cdot n + \frac{1}{2} T\left(\frac{3}{4}n\right) + \frac{1}{2} T\left(\frac{n}{4}\right)$$

$$T(n) \leq T\left(\frac{3}{4}n\right) + T\left(\frac{n}{4}\right) + 2Cn$$

$\hat{=} \Theta(n \lg n)$

### 3. Rand-Select

- given an array A
  - unsorted
  - length  $n$

• want:  $k^{\text{th}}$  smallest element in A

Brute force:

- sort A
- return value at position  $k$



• How would you use randomized-partition to solve in linear time?

① ↗ shuffle?  
② ↗ random pivot?

#### RANDSELECT

- shuffle A  
(any input equally likely)
- partition on left element  
 $A(p)$
- $g = \text{final position of pivot}$ 
  - $g = k$ ? done!
  - $g < k$ ? throw away left, recurse on right
  - $g > k$ ? throw away right, recurse on left

ex  $\underline{11}, 10, 8, 13, 9, 3$        $n=6$   
 $k=2$

partition

$10, 8, 9, 3 | \underline{11}, 13$       ↗ throw away

$\underline{10}, 8, 9, 3$   
partition

$8, 9, 3 | \underline{10}$       ↗ throw away

$\underline{8}, 9, 3$   
partition

$3, \underline{8} | 9$   
 $2 = *! \text{ done}$       return  $A[2] = 8$