

Quiz 2

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quiz

Design and Analysis of Algorithms
Massachusetts Institute of Technology
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6.046J/18.410J
Quiz 1

Quiz 1 62%

- Do not open this quiz booklet until you are directed to do so. Read all the instructions first.
- The quiz contains 7 problems, with multiple parts. You have 120 minutes to earn 120 points.
- This quiz booklet contains 12 pages, including this one.
- This quiz is closed book. You may use one double-sided letter ($8\frac{1}{2}'' \times 11''$) or A4 crib sheet. No calculators or programmable devices are permitted. Cell phones must be put away.
- Do not waste time deriving facts that we have studied. Just cite results from class.
- When we ask you to “give an algorithm” in this quiz, describe your algorithm in English or pseudocode, and provide a short argument for correctness and running time. You do not need to provide a diagram or example unless it helps make your explanation clearer.
- Do not spend too much time on any one problem. Generally, a problem’s point value is an indication of how many minutes to spend on it.
- Show your work, as partial credit will be given. You will be graded not only on the correctness of your answer, but also on the clarity with which you express it. Please be neat.
- Good luck!

Problem	Title	Points	Parts	Grade	Initials
1	True or False	40	10		60
2	Fast Fourier Transform	5	1		60
3	Yellow Brick Road	10	1		
4	Amortized Analysis	15	1		
5	Verifying Polynomial Multiplication	15	4		
6	Dynamic Programming	15	2		
7	Median of Sorted Arrays	20	3		60
Total		120		74	

Name: _____

~~10~~ - 12

Problem 1. True or False. [40 points] (10 parts)

Circle T or F for each of the following statements to indicate whether the statement is true or false and briefly explain why.

- (a) **T F** [4 points] With all equal-sized intervals, a greedy algorithm based on earliest start time will always select the maximum number of compatible intervals.

EFT will be optimal
 This can be proven inductively on size of set of intervals. BC: EFT selects only one \rightarrow optimal. TS: given optimal selection of set size n , consider $n+1$ case. \rightarrow EFT will select one more task, remaining can be solved by induction.

- (b) **T F** [4 points] The problem of weighted interval scheduling can be solved in $O(n \log n)$ time using dynamic programming.

① Sort by EFT $O(n \log n)$
 ② DP: subproblems: $PP[i..j] = \max(DP[i+1..j],$
 recursive $\lg n \text{ cost } + \text{optimal task } w(i) + DP[\text{next remaining case}]$

- (c) **T F** [4 points] If we divide an array into groups of 3, find the median of each group, recursively find the median of those medians, partition, and recurse, then we can obtain a linear-time median-finding algorithm.

$$T(n) = T(a/b) + O(1),$$

$b > 1$

- (d) **T F** [4 points] If we used the obvious $\Theta(n^2)$ merge algorithm in the divide-and-conquer convex-hull algorithm, the overall time complexity would be $\Theta(n^2 \log n)$.

More's Than

$n \lg n$
 $O(1)$
 $2T(n/2)$
 $O(n^{3/2})$

- 0) Sort on \times cost
- 1) Divide problem in half, build ft
- 2) Conquer
- 3) Combine

- (e) **T F** [4 points] Van Emde Boas sort (where we insert all numbers, find the min, and then repeatedly call SUCCESSOR) can be used to sort $n = \lg u$ numbers in $O(\lg u \cdot \lg \lg \lg u)$ time.

Trick question, has an extra \lg in there you bastard

$$\sqrt{n} \cdot \lg \lg n$$

? how long to code a VEB tree

s exchanges from $f(n) = \Theta(n^{c_{\text{crit}}})$ to it dominating.
here is 1
 $\Theta(n^2)$, therefore, we simply have $T(n) = O(f(n)) = O(n^2)$

- (f) T F [4 points] Van Emde Boas on n integers between 0 and $u - 1$ supports successor queries in $O(\lg \lg u)$ worst-case time using $O(n)$ space.

need $\Omega(n)$ space to
store bit vector

- A (g) T F [4 points] In the potential method for amortized analysis, the potential energy should never go negative.

otherwise ~~the potential~~ or

assumption that

$$\sum c_i \geq \sum c_j$$

~~which~~ is no longer guaranteed

- ★ (h) T F [4 points] The quicksort algorithm that uses linear-time median finding to run in worst-case $O(n \log n)$ time requires $\Theta(n)$ auxiliary space.

Quicksort
PC of
 $\Omega(n^2)$

QS Aux

- ★ (i) T F [4 points] Searching in a skip list takes $\Theta(\log n)$ time with high probability, but could take $\Omega(2^n)$ time with nonzero probability.

Search
hard-cap height, not if "next move"

SL

- (j) T F [3 points] The following collection $\mathcal{H} = \{h_1, h_2, h_3\}$ of hash functions is universal, where each hash function maps the universe $U = \{A, B, C, D\}$ of keys into the range $\{0, 1, 2\}$ according to the following table:

x	A	B	C	D
$h_1(x)$	1	0	1	1
$h_2(x)$	0	1	0	1
$h_3(x)$	2	2	1	0

$$\Pr(h(A) = h'(A)) \leq 1/3$$

not universal
wrt mapping for keys C and D

$|H| = 3, m = 3$

For any pair of keys, hash functions that have a collision must be bounded by $|H| / m = .$ bounded by 1

B: collide on h3

C: collide on h1, h2

D: collide on h1

C: 0

D: 1 collide

D: 1 collide

X

Problem 2. Fast Fourier Transform (FFT). [5 points] (1 part)

5

Ben Bitdiddle is trying to multiply two polynomials using the FFT. In his trivial example, Ben sets $a = (0, 1)$ and $b = (0, 1)$, both representing $0 + x$, and calculates:

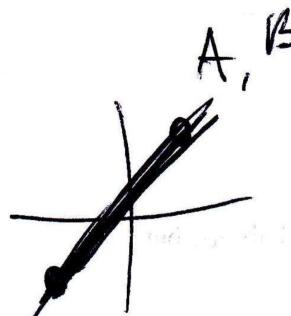
$$A = \mathcal{F}(a) = B = \mathcal{F}(b) = (1, -1), \quad \text{FFT}$$

$$C = A * B = (1, 1), \quad \text{Conv}$$

$$c = \mathcal{F}^{-1}(C) = (1, 0). \quad \text{IFFT}$$

So c represents $1 + 0 \cdot x$, which is clearly wrong. Point out Ben's mistake in one sentence; no calculation needed. (Ben swears he has calculated FFT \mathcal{F} and inverse FFT \mathcal{F}^{-1} correctly.)

We need enough samples to recover a 2^*N degree polynomial, so for polynomials of $d=1$, we need to have 4 samples each (regardless of the actual value),

A, B


For a basic FFT package, this can be achieved by simply padding trailing zeros in the coeff vector

It will detect $d'=3$ for A' and B'

and generate

sample points at

$X = \{1, -1, i, -1\}$

$$(1, 1)$$

$$(-1, 1)$$

polynomial of size

done correctly

FFT is expected to generate
In samples!

Fourier Transform Expected to
generate two samples
each

Problem 3. Yellow Brick Road. [10 points] (1 part)

Prof. Gale is developing a new Facebook app called "Yellow Brick Road" for maintaining a user's timeline, here represented as a time-ordered list e_0, e_1, \dots, e_{n-1} of n (unchanging) events. (In Facebook, events can never be deleted, and for the purposes of this problem, don't worry about insertions either.) The app allows the user to mark an event e_i as **yellow** (important) or **grey** (unimportant); initially all events are grey. The app also allows the user to jump to the next yellow event that comes after the event e_i currently on the screen (which may be yellow or grey). More formally, you must support the following operations:

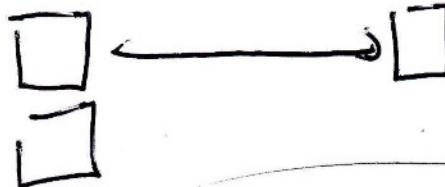
1. MARK-YELLOW(i): Mark e_i yellow.
2. MARK-GREY(i): Mark e_i grey.
3. NEXT-YELLOW(i): Find the smallest $j > i$ such that e_j is yellow.

Give the fastest data structure you can for this problem, measured according to *worst-case time*. The faster your data structure, the better.

Hint: Use a data structure you have seen in either 6.006 or 6.046 as a building block.

use a deterministic skip list.
skip list

van emde boas tree's, we did it baby!



vb free can do all ops
in lgln time using
a bit vector to report yellowness.

regular st vector on work list
w/ our cost on next yellow

delete it) <= summation(amortized

Problem 5. Verifying Polynomial Multiplication. [15 points] (4 parts)

This problem will explore how to check the product of two polynomials. Specifically, we are given three polynomials:

$$p(x) = a_n x^n + a_{n-1} x^{n-1} + \dots + a_0,$$

$$q(x) = b_n x^n + b_{n-1} x^{n-1} + \dots + b_0,$$

$$r(x) = c_{2n} x^{2n} + c_{2n-1} x^{2n-1} + \dots + c_0.$$

We want to check whether $p(x) \cdot q(x) = r(x)$ (for all values x). Via FFT, we could simply compute $p(x) \cdot q(x)$ and check in $O(n \log n)$ time. Instead, we aim to achieve $O(n)$ time via randomization.

- 3 (a) [5 points] Describe an $O(n)$ -time randomized algorithm for testing whether $p(x) \cdot q(x) = r(x)$ that satisfies the following properties:

1. If the two sides are equal, the algorithm outputs YES.
2. If the two sides are unequal, the algorithm outputs NO with probability at least $\frac{1}{2}$.

*(choose x at random among the n roots of unity
we evaluate $p(x), q(x), r(x)$)*

*(generate \sqrt{n} samples for each fn.
of cost $O(\sqrt{n})$)*

Pick a single sample, randomly, from a set of values between 1 and 4^*n .

Evaluate for all polynomials, and then check the products are equal.

$O(n)$ to eval poly's individual. Convolution and checks are $O(1)$ after that.

- (b) [2 points] Prove that your algorithm satisfies Property 1.

(use convolution; $p(x) \cdot q(x) = r(x)$)

(\forall checks \exists x_0 s.t. $p(x_0) \cdot q(x_0) = r(x_0)$)

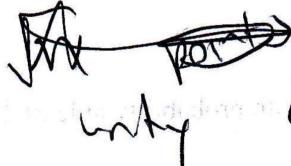
(all checks will pass!)

3

- (c) [3 points] Prove that your algorithm satisfies Property 2.

Hint: Recall the Fundamental Theorem of Algebra: A degree- d polynomial has (at most) d roots.

b/c
degree

~~any polynomial is defn.~~
 d -degree poly can be defn in $d+1$ points.
 (case 2 condition) $\Rightarrow \exists$ at least one of the
 n points in n^{th} roots of unity disagree.

Using birthday principle, by sampling \sqrt{n} of n^{th} roots of unity, we have at least a chance to "discover" the bad pt.

- (d) [5 points] Design a randomized algorithm to check whether
- $p(x) \cdot q(x) = r(x)$
- that is correct with probability at least
- $1 - \varepsilon$
- . Analyze your algorithm in terms of
- n
- and
- $1/\varepsilon$
- .

- 5

Rp:

or the
no-detection
cost?

Key Idea: if they don't match and you check a random sample, it's almost impossible that you don't detect it. Worst case in the universe is $d/|\text{range of values you're checking}|$

Key insight: an equality check can be "re-organized" to a new fn that evaluates to zero for a "pass" $p \cdot q == r$, can be rephrased to $s = p \cdot q - r == 0$.

s some degree 2^d polynomial with at most 2^d roots. i.e., 2^d potential values it can be zero.

That means at BEST, if all roots are within that weird range, $\Pr(s(a) == 0) \leq 0.5$

- 2 sides are unequal
- however, the thing is some polynomial, so worst case we might hit a bunch of zero's by sheer luck.

We have at least a 50% detection rate every unique sample.

For correctness up to $1 - \epsilon$, we require $1 - \left(\frac{1}{2}\right)^m$ checks

$$\epsilon = (1/2)^m = 2^{-m}$$

$$m = -\lg(\epsilon)$$

We require $\lg(m)$ iterations at cost $O(n)$

Total cost of $O(n * \lg(m))$

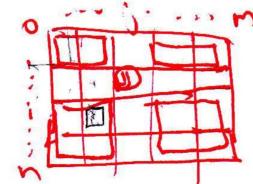
Problem 6. Dynamic Programming. [15 points] (2 parts)

Prof. Child is cooking from her garden, which is arranged in grid with n rows and m columns. Each cell (i, j) ($1 \leq i \leq n, 1 \leq j \leq m$) has an ingredient growing in it, with *tastiness* given by a positive value $T_{i,j}$. Prof. Child doesn't like cooking "by the book". To prepare dinner, she will stand at a cell (i, j) and pick one ingredient from each quadrant relative to that cell. The tastiness of her dish is the product of the tastiness of the four ingredients she chooses. Help Prof. Child find an $O(nm)$ dynamic programming algorithm to maximize the tastiness of her dish.

Here the four **quadrants** relative to a cell (i, j) are defined as follows:

In books
thus

- top-left** = {all cells $(a, b) \mid a < i, b < j\}$,
- bottom-left** = {all cells $(a, b) \mid a > i, b < j\}$,
- top-right** = {all cells $(a, b) \mid a < i, b > j\}$,
- bottom-right** = {all cells $(a, b) \mid a > i, b > j\}$.



Because Prof. Child needs all four quadrants to be non-empty, she can only stand on cells (i, j) where $1 < i < n$ and $1 < j < m$.

A red line drawing consisting of two main parts: a horizontal line segment on the left and a more complex, curved shape on the right.

(a) [10 points] Define $TL_{i,j}$ to be maximum tastiness value in the top-left quadrant of cell (i, j) : $TL_{i,j} = \max\{T_{a,b} \mid 1 \leq a \leq i, 1 \leq b \leq j\}$. Find a dynamic programming algorithm to compute $TL_{i,j}$, for all $1 < i < n$ and $1 < j < m$, in $O(nm)$ time.

We use a bottom up DP algorithm with

with subgradients, $TL_{i,j}$ corresponding to max value of testiness in TL quadrant.

reason: $TL_{i,j} = \max(TL_{i-1,j}, TL_{i,j-1})$ | $i > 1, j > 1$

correct: subscribers are
already connected when

run time: nested for loop $O(mn)$ time

run time: nested for loop $O(mn)$ time

1

$i = 1$ or $j = 1$

for $i = 1$ to n : $T[i] = 0$

For $j=1$ to n .
 $i=1$ to T $L_{i,j} = 0$

For $i = 2$ to n .

For insertion.

$$T_{Li,j} = \max(T_{i-1}, j-1, \\ T_{Li,j}, \\ T_{Li,j-1})$$

(b) [5 points] Use the idea in part (a) to obtain an $O(nm)$ algorithm to find the tastiest dish.

PC:
- Use DP to compute & store quadrant values for TL, BL, TR, and BR.



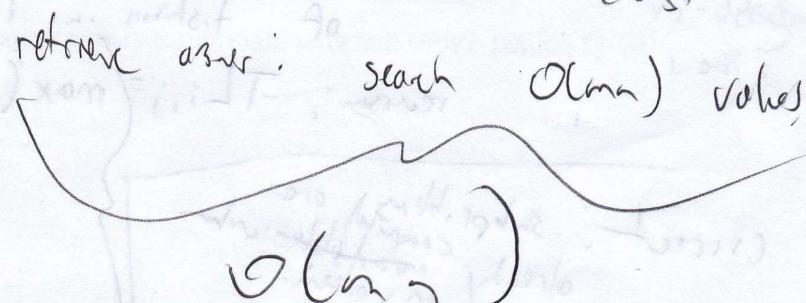
Use this information to get score for each location. Take max.

Because DP uses it from diagonals to be non-local, we can only send one cell (i, j)

(a) [10 points] Define $T_{i,j}$ to be maximum tastiness value in the top-left diagonal of Time Analysis. $\text{DP} : 4. O(nm) = O(nm)$

calculate sum: $O(mn) \cdot O(1)$

locations calculation cost



$O(nm)$

Problem 7. Median of two sorted arrays. [20 points] (3 parts)

Finding the median of a sorted array is easy: return the middle element. But what if you are given two sorted arrays A and B , of size m and n respectively, and you want to find the median of all the numbers in A and B ? You may assume that A and B are disjoint.

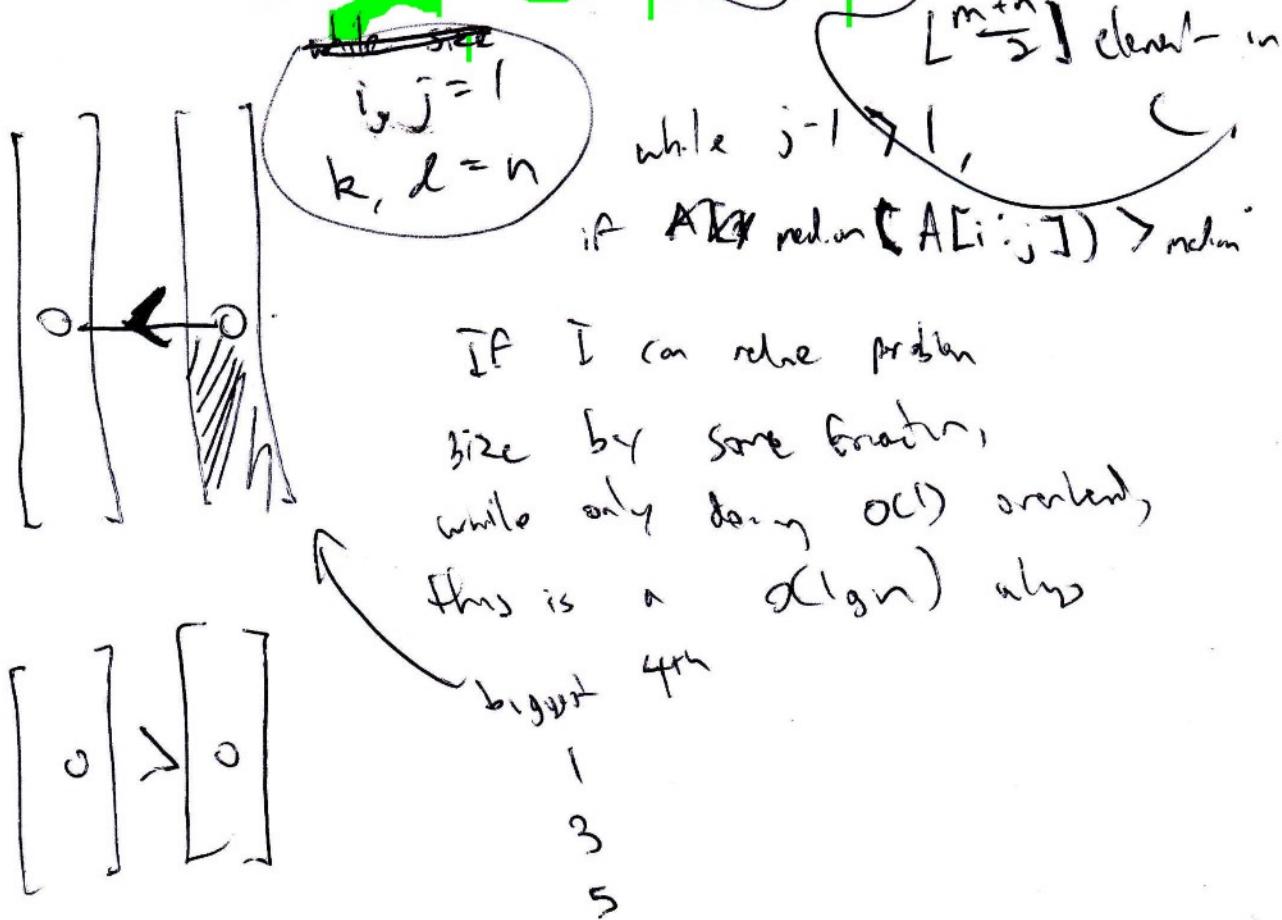
- (a) [3 points] Give a naïve algorithm running in $\Theta(m + n)$ time.

```

target_rank = (m+n)/2
current_rank = 0, i=0, j=0
while current_rank < target_rank:
    if A[i] < B[j]:
        current_rank += 1
        i += 1
    else:
        j += 1
    last = A[i]
return last

```

- (b) [10 points] If $m = n$, give an algorithm that runs in $\Theta(\lg n)$ time.



- (c) [7 points] Give an algorithm that runs in $O(\lg(\min\{m, n\}))$ time, for any m and n .
Don't spend too much time on this question!

Some algorithm,
except when one
array reduces to empty array,
the median of remaining
nonempty arrays

The first element of the big array is smaller than $m-1$ elements
however, the median element must be smaller than exactly
 $(m+n)/2 - 1$ elements and no more.

in the case $n < m$, this element is definitely fucked.

In fact, the $(m-n)/2$ is fucked because it's smaller than $m/2+n/2$ elements. which it shouldn't be.

