

This exam is **no book, no gadgets**. You may use **one sheet of notes** (letter size, two sides), which you submit with the exam. There are 30 questions, worth 62 points. Marks will be curved.

*This exam is my own work. I understand it is governed by the Emory Honor Code.*

Signature: \_\_\_\_\_

*Solutions (ignoring partial credit cases)*

**Fill in the Blank:** fill each blank appropriately. An answer could be a word, a phrase, or a formula.

### Recurrences, Divide and Conquer

- (2 pts) 1. Solve the recurrence  $T(n) = 7T(n/2) + n^3$ . (big-Oh)
1.  $O(n^3)$
- (2 pts) 2. Consider the recurrence  $T(n) = aT(n/b) + O(n^d)$ , with constants  $a > 0$ ,  $b > 1$ , and  $d \geq 0$ . What condition on  $a, b, d$  implies  $T(n) = \Theta(n^d \log n)$ ?
2.  $\log_b a = d, b^d = a$
- (2 pts) 3. Recall QuickSelect. It resembles QuickSort, but we only want to output one value (the  $k$ th). What recurrence did we find bounding  $T(n)$ , the expected running time of QuickSelect on an input of size  $n$ ?
3.  $T(n) = T(\frac{3}{4}n) + O(n)$
- (2 pts) 4. What algorithm did we associate with the recurrence  $T(n) = 3T(n/2) + O(n)$ ?
4. integer mult, Karatsuba
- (2 pts) 5. Given  $n$  numbers  $r_1, r_2, \dots, r_n$ , how much time did we need to compute the polynomial  $P(x) = (x - r_1)(x - r_2) \cdots (x - r_n)$ ? (homework, big-Oh)
5.  $O(n \lg^2 n)$
- (2 pts) 6. In the discrete Fourier transform, we are given a number  $\omega$  (with  $\omega^n = 1$ ) and a polynomial  $A(x) = a_0 + a_1x^1 + a_2x^2 + \cdots + a_{n-1}x^{n-1}$ . We want to compute the vector  $\vec{y} = (y_0, y_1, \dots, y_{n-1})$ , where  $y_j$  equals what?
6.  $A(\omega^j)$
- (2 pts) 7. In the FFT circuit, a single "butterfly" computes two values from two other values (it looks like  $\begin{bmatrix} \oplus \\ \ominus \end{bmatrix}$ ). How many butterflies are in an FFT circuit with  $n$  inputs and  $n$  outputs ( $n = 2^k$ )?
7.  $n/2, \frac{1}{2}n \lg n$

### Dynamic Programming (DP)

- (2 pts) 8. To compute the LCS (longest common subsequence) of two sequences of lengths  $m$  and  $n$ , we first spend  $O(mn)$  time computing a matrix of numbers. How much additional time do we need for backtracking, to find the actual sequence? (big-Oh)
8.  $O(m+n)$
- (2 pts) 9. Recall the algorithm for the chain matrix multiplication problem, finding the fastest way to multiply  $n$  matrices. What is the total space (words of memory) used by the algorithm? (big-Oh)
9.  $O(n^2)$

- (2 pts) 10. In our DP algorithm for the TSP, a subproblem is to compute  $C(S, j)$ , the cost of a shortest tour starting at 1, ending at  $j$ , and visiting the points of  $S \subseteq \{1, 2, \dots, n\}$  (so  $\{1, j\} \subseteq S$ ).  $d_{kj}$  is the distance from  $k$  to  $j$ . For  $|S| \geq 3$ , give the formula for  $C(S, j)$  in terms of smaller subproblems.

10.  $\min_{k \in S - \{1, j\}} (C(S - \{j\}, k) + d_{kj})$

- (2 pts) 11. We are given graph  $G$  with  $n$  vertices, and a tree decomposition of  $G$  with treewidth  $k$ , and  $N$  tree nodes. We want to decide whether  $G$  has a 3-coloring. In our dynamic programming approach, how many subproblems are there? (big-Oh, homework)

11.  $O(N \cdot 3^k), O(n \cdot 3^k)$

### Greed and Approximation

- (2 pts) 12. Suppose a boolean formula is an AND of clauses, each clause is an OR of literals, and each literal is either a positive variable or a negated variable. What additional property would make it a Horn formula?

12. at most one positive per clause

- (2 pts) 13. In the Set Cover problem, suppose there are  $n$  points to cover, and an optimal solution uses  $k$  sets. After  $t$  iterations of the greedy algorithm, at most how many points are still not covered?

13.  $n(1 - \frac{1}{k})^t$

- (2 pts) 14. "PTAS" is an acronym for what?

14. polynomial time approx. scheme

- (2 pts) 15. Baker's algorithm reduces the  $(1 - \epsilon)$ -approximate MIS problem in planar graphs, to the exact MIS problem in bounded treewidth graphs. What was the treewidth bound in terms of  $\epsilon$ ? (Include leading constant.)

15.  $3/\epsilon \pm O(1)$

- (2 pts) 16. We saw two different 2-approximation algorithms for VC (minimum vertex cover). What is an advantage of the algorithm using LP relaxation?

16. allows weights

- (2 pts) 17. What is a minimization problem, other than vertex cover, for which we saw a 2-approximation algorithm?

17.  $k$ -center, TSP

**MaxFlow:** Here  $G$  is a flow network with  $n = |V|$  vertices,  $m = |E|$  edges, and each edge  $e$  has capacity  $c(e)$ .

- (2 pts) 18. Suppose we run Ford-Fulkerson, always picking a shortest augmenting path from  $s$  to  $t$ . What was our bound on the number of augmenting paths needed? (big-Oh, slides)

18.  $O(nm), O(VE)$

- (2 pts) 19. Suppose Ford-Fulkerson has stopped. We have a flow  $f$ , and we cannot find a path from  $s$  to  $t$  in the residual network  $G_f$ . How can we find a min-cut  $S$ ? (It should have  $s \in S$  and  $t \in V - S$ .)

19.  $\{v : s \rightarrow v \text{ in } G_f\}$

- (2 pts) 20. Suppose  $f$  is a max-flow and  $(S, V - S)$  is a min-cut ( $s \in S, t \in V - S$ ). What can we say about  $f(e)$ , the flow on an edge  $e$  from  $S$  to  $V - S$ ?

20.  $f(e) = c(e)$

(2 pts) 21. Given a flow  $f$  in  $G$ , we can decompose  $f$  into at most how many path flows? (homework)

21.  $m, |E|$

**Duality:** Suppose we have dual LP's:  $\text{MAX} = \max\{c \cdot x : Ax \leq b, x \geq 0\}$  and  $\text{MIN} = \min\{b \cdot y : A^t y \geq c, y \geq 0\}$ .

(2 pts) 22. Suppose  $x$  and  $y$  are feasible points for the two LP's (not necessarily optimal points). What relation do we know between  $c \cdot x$  and  $b \cdot y$ ?

22.  $c \cdot x \leq b \cdot y$

(2 pts) 23. Suppose feasible vectors  $x^*$  and  $y^*$  achieve  $\text{MAX} = \text{MIN}$ . What condition on the constraints of  $x^*$  would imply that  $y_1^*$  (the first value in  $y^*$ ) must be zero?

23. first not tight,  
 $(Ax^*)_1 < b_1$

(2 pts) 24. Suppose we modify the MAX LP, allowing its first variable  $x_1$  to be any real value (possibly negative). How should we modify the MIN LP, to maintain duality?

24. first becomes equality,  
 $(A^t y^*)_1 = c_1$

### Other Stuff

(2 pts) 25. We saw a simple reduction from the boolean circuit value problem (CVP) to linear programming (LP). What did this imply about LP?

25. P-complete,  
probably not in NC

(2 pts) 26. What algorithm (a named algorithm from linear algebra) did we use as a "separation oracle" for the convex domain of the MAXCUT' problem?

26. Cholesky (factorization or decomposition)

(2 pts) 27. Suppose  $\vec{v}_1$  and  $\vec{v}_2$  are two unit vectors in our MAXCUT' solution, with angle  $\alpha$  between them (so  $0 \leq \alpha \leq \pi$ ). What is the probability that edge  $\{1, 2\}$  is cut, when we randomly round to a MAXCUT solution?

27.  $\alpha/\pi$

(2 pts) 28. To do branch-and-bound for a minimization problem, the book required three routines: "choose" (picking the next subproblem from a list), "expand" (replacing a subproblem by smaller subproblems), and what?

28. lowerbound

(2 pts) 29. We want to find  $s$  minimizing  $\text{cost}(s)$ . We try simulated annealing, at temperature  $T$ . In one iteration, we first pick a random neighbor  $s'$  of our current  $s$ . What is the probability that we then replace  $s$  with  $s'$ ?

29.  $\min(1, e^{-\frac{\text{cost}(s') - \text{cost}(s)}{T}})$   
or  $\Delta$

**Short Answer** (you may use the back!)

(4 pts) 30. State the "minimax theorem".

In a two-player matrix game with mixed strategies, it does not matter which player announces strategy first.  
(P.C. for other "min/max" theorems.)