CS311H

Prof: Peter Stone

Department of Computer Science The University of Texas at Austin

Good Morning, Colleagues



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Are there any questions?



• Final: Sat., Dec. 14, 7pm-10pm, JGB 2.216



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 - Think about what you've learned...

• Propositional logic and Satisfiability



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- Predicates, and Quantifiers



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- Basic proof techniques,



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- (*) Proving program correctness
- (*) Undecidability



• Just a start to jog your memory



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- Will go through some of these quickly



- Just a start to jog your memory
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- Continue on your own for the next 9 days!



True or False?

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Answer: Under rational domain, the predicate is false because for all x, y where x < y there always exists $z = \frac{x+y}{2}$ which satisfies that condition that x < z < y. So for all x, such y doesn't exist. which means the predicate is false.



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- Domain: rational numbers
- Domain: integers

Answer: Under rational domain, the predicate is false because for all x, y where x < y there always exists $z = \frac{x+y}{2}$ which satisfies that condition that x < z < y. So for all x, such y doesn't exist. which means the predicate is false. Under integer domain, there exists y = x + 1 such that no integer z exists such that x < z < y. Thus the predicate is true.



 Assume the following fact: "Every integer larger than 1 is either prime or can be written as a product of primes"



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5. If m is prime, it is bigger than all of $p_1, ..., p_n$, and therefore not equal to any of them. Contradiction.



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- be a remainder of 1.
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6. If m is not prime, it is a product of primes. Let q be one of these primes.



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- 3. For every prime p_i , m is not divisible by p_i since there will be a remainder of 1.
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- 5. If m is prime, it is bigger than all of $p_1, ..., p_n$, and therefore not equal to any of them. Contradiction.
- 6. If m is not prime, it is a product of primes. Let q be one of these primes.
- 7. Then m is divisible by q.
- 8. Since m is not divisible by any p_i , prime q is not equal to any of p_i . Contradiction.



Infinite sets

• Prove that the cardinality of the prime numbers is the same as the cardinality of the integers by defining a bijection from the integers to the primes.



Call the primes in order starting from 2 as p_1, p_2, p_3, \ldots



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- Proof: uses Eurlerian circuits





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- $\frac{6!}{2} = 360$
- 360 5! = 360 120 = 240



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Note we have

$$a^n = \underbrace{a \times a \dots a}_n$$

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$$n! = n \times (n-1)...2 \times 1$$
 When $a \leq 1$, we have $C = 1, k = 1$.



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The University of Texas at Austin

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Thus we have C = 1, $k = \max(1, 2a^2)$ such that for all x > k, $a^n < Cn!$. So we have $a^n = O(n!)$. Proof completed.



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Other problem types

- DeMorgan's laws and other propositional logic
- Induction
- Planar graphs
- Graph coloring
- Recurrences
- Master theorem
- Proving program correctness
- Undecidability



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- See you Dec. 14th

