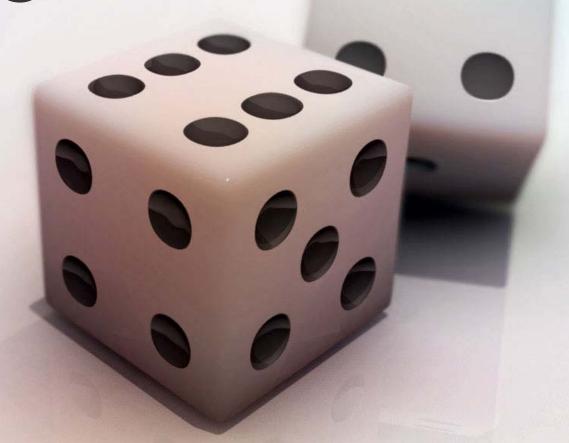


Factors and Primes Recursive division algorithm



## MA/CSSE 473 Day 05

- HW 2 due tonight, 3 is due Monday
- Student Questions
- Asymptotic Analysis example: summation
- Review topics I don't plan to cover in class
- Continue Algorithm Overview/Review
  - Integer Primality Testing and Factoring
  - Modular Arithmetic intro
  - Euclid's Algorithm



## Asymptotic Analysis Example

- Find a simple big-Theta expression (as a function of n) for the following sum
  - when 0 < c < 1
  - when c = 1
  - when c > 1
- $f(n) = 1 + c + c^2 + c^3 + ... + c^n$



Quick look at review topics in textbook

### **REVIEW THREAD**



## Textbook Topics I Won't Cover in Class

- Chapter 1 topics that I will not discuss in detail unless you have questions. They should be review For some of them, there will be review problems in the homework
  - Sieve of Eratosthenes (all primes less than n)
  - Algorithm Specification, Design, Proof, Coding
  - Problem types: sorting, searching, string processing, graph problems, combinatorial problems, geometric problems, numerical problems
  - Data Structures: ArrayLists, LinkedLists, trees, search trees, sets, dictionaries,

### Chapter 2

- Empirical analysis of algorithms should be review
- I believe that we have covered everything else in the chapter except amortized algorithms and recurrence relations
- We will discuss amortized algorithms
- Recurrence relations are covered in CSSE 230 and MA 375. We'll review particular types as we encounter them.

\*Unless you ask me to



- Chapter 3 Review
  - Bubble sort, selection sort, and their analysis
  - Sequential search and simple string matching



- Chapter 4 Review
  - Mergesort, quicksort, and their analysis
  - Binary search
  - Binary Tree Traversal Orders (pre, post, in, level)





- Chapter 5 Review
  - Insertion Sort and its analysis
  - Search, insertion, delete in Binary Tree
  - AVL tree insertion and rebalance



# Efficient Fibonacci Algorithm?

- Let X be the matrix  $\begin{pmatrix} 0 & 1 \\ 1 & 1 \end{pmatrix}$  Then  $\begin{pmatrix} F_1 \\ F_2 \end{pmatrix} = X \cdot \begin{pmatrix} F_0 \\ F_1 \end{pmatrix}$
- also  $\begin{pmatrix} F_2 \\ F_2 \end{pmatrix} = X \cdot \begin{pmatrix} F_1 \\ F_2 \end{pmatrix} = X^2 \cdot \begin{pmatrix} F_0 \\ F_1 \end{pmatrix}$ , and  $\begin{pmatrix} F_n \\ F_1 \end{pmatrix} = X^n \cdot \begin{pmatrix} F_0 \\ F_1 \end{pmatrix}$
- How many additions and multiplications of numbers are necessary to multiply two 2x2 matrices?
- If n = 2<sup>k</sup>, how many matrix multiplications does it take to compute X<sup>n</sup>?
  - O(log n), it seems.
- But there is a catch!

## Hidden because not ready for prime

- Refine T(n) calculations, (the time for computing the n<sup>th</sup> Fibonacci number) for each of our three algorithms
  - Recursive (fib1)
    - We originally had  $T(n) \in \Theta(F(n)) \approx \Theta(2^{0.694n})$
    - We assumed that addition was constant time.
    - Since each addition is  $\Theta(n)$ , the whole thing is  $\Theta(n \cdot F(n))$

#### Array (fib2)

- We originally had  $T(n) \in \Theta(n)$ , because of n additions.
- Since each addition is  $\Theta(n)$ , the whole thing is  $\Theta(n^2)$

#### Matrix multiplication approach (fib3)

- We saw that  $\Theta(\log n)$  2x2 matrix multiplications give us  $F_n$ .
- Let M(k) be the time required to multiply two k-bit numbers.  $M(k) \in \Theta(k^a)$  for some a with  $1 \le a \le 2$ .
- It's easy to see that T(n) ∈ O(MI(n) log n)
- Can we show that  $T(n) \in O(M(n))$ ?
  - Do it for a = 2 and  $a = \log_2(3)$
  - If the multiplication of numbers is better than O(n²), so is finding the n<sup>th</sup> Fibonacci number.



Integer Division

Modular arithmetic

Euclid's Algorithm

Heading toward Primality Testing

### **ARITHMETIC THREAD**



### **FACTORING** and **PRIMALITY**

### Two important problems

- FACTORING: Given a number N, express it as a product of its prime factors
- PRIMALITY: Given a number N, determine whether it is prime

#### Where we will go with this eventually

- Factoring is hard
  - The best algorithms known so far require time that is exponential in the number of bits of N
- Primality testing is comparatively easy
- A strange disparity for these closely-related problems
- Exploited by cryptographic algorithms

### More on these problems later

First, more math and computational background...



## Recap: Arithmetic Run-times

- For operations on two k-bit numbers:
- Addition: Θ(k)
- Multiplication:
  - Standard algorithm:  $\Theta(k^2)$
  - "Gauss-enhanced":  $\Theta(k^{1.59})$ , but with a lot of overhead.
- Division (We won't ponder it in detail, but see next slide): Θ(k²)



# Algorithm for Integer Division

```
def divide(x, y):
    """ Input: Two non-negative integers x and y, where y>=1.
        Output: The quotient and remainder when x is divided by y."""
    if x == 0:
        return 0, 0
    q, r = divide(x // 2, y)  # max recursive calls:
    q, r = 2 * q, 2 * r  # number of bits in x
    if x % 2 == 1:
        r = r + 1
    if r >= y:  # note that all of the multiplications
        q, r = q + 1, r - y  # and divisions are by 2:
    return q, r  # simple bit shifts
```

Let's work through divide(19, 4).

Analysis?



### Modular arithmetic definitions

- x modulo N is the remainder when x is divided by N. l.e.,
  - If x = qN + r, where  $0 \le r < N$  (q and r are unique!),
  - then x modulo N is equal to r.
- x and y are congruent modulo N, which is written as x≡y (mod N), if and only if N divides (x-y).
  - i.e., there is an integer k such that x-y = kN.
  - In a context like this, a divides b means "divides with no remainder", i.e. "a is a factor of b."
- Example:  $253 \equiv 13 \pmod{60}$



# Modular arithmetic properties

- Substitution rule
  - If  $x \equiv x' \pmod{N}$  and  $y \equiv y' \pmod{N}$ , then  $x + y \equiv x' + y' \pmod{N}$ , and  $xy \equiv x'y' \pmod{N}$
- Associativity
  - $x + (y + z) \equiv (x + y) + z \pmod{N}$
- Commutativity
  - $xy \equiv yx \pmod{N}$
- Distributivity
  - $x(y+z) \equiv xy + yz \pmod{N}$



# Modular Addition and Multiplication

- To add two integers x and y modulo N (where k = log N (the number of bits in N), begin with regular addition.
  - x and y are in the range\_\_\_\_\_, so x + y is in range \_\_\_\_\_
  - If the sum is greater than N-1, subtract N.
  - Run time is  $\Theta$  ( )
- To multiply x and y modulo N, begin with regular multiplication, which is quadratic in k.
  - The result is in range \_\_\_\_\_ and has at most \_\_\_\_\_ bits.
  - Compute the remainder when dividing by N, quadratic time. So entire operation is Θ( )

## Modular Addition and Multiplication

- To **add** two integers x and y modulo N (where  $k = \lceil \log N \rceil$ , begin with regular addition.
  - x and y are in the range 0 to N-1,
     so x + y is in range 0 to 2N-1
  - If the sum is greater than N-1, subtract N.
  - Run time is  $\Theta(\mathbf{k})$
- To multiply x and y, begin with regular multiplication, which is quadratic in n.
  - The result is in range 0 to (N-1)<sup>2</sup> and has at most 2k bits.
  - Then compute the remainder when dividing by N, quadratic time in k. So entire operation is  $\Theta(k^2)$

# **Modular Exponentiation**

- In some cryptosystems, we need to compute x<sup>y</sup> modulo N, where all three numbers are several hundred bits long. Can it be done quickly?
- Can we simply take x<sup>y</sup> and then figure out the remainder modulo N?
- Suppose x and y are only 20 bits long.
  - $x^y$  is at least  $(2^{19})^{(2^{19})}$ , which is about 10 million bits long.
  - Imagine how big it will be if y is a 500-bit number!
- To save space, we could repeatedly multiply by x, taking the remainder modulo N each time.
  - If y is 500 bits, then there would be 2<sup>500</sup> bit multiplications.
  - This algorithm is exponential in the length of y.
  - Ouch!

# Modular Exponentiation Algorithm

```
def modexp(x, y, N):
    if y==0:
        return 1
    z = modexp(x, y/2, N)
    if y%2 == 0:
        return (z*z) % N
    return (x*z*z) % N
```

- Let k be the maximum number of bits in x, y, or N
- The algorithm requires at most \_\_\_\_ recursive calls
- Each call is Θ( )
- So the overall algorithm is Θ( )



# Modular Exponentiation Algorithm

```
def modexp(x, y, N):
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    return (x*z*z) % N
```

- Let n be the maximum number of bits in x, y, or N
- The algorithm requires at most k recursive calls
- Each call is Θ(k²)
- So the overall algorithm is Θ(k³)

