## 1. SEE HANDWRITTEN PAPER

2. Explanation: The recursive and iterative methods matched the pseudocode presented in lecture. For the matrix method, I implemented repeated squaring and stored the squared matrices of interest in an array and multiplied those which were needed to reach the nth Fibonacci number. The recursive method, naturally, slowed rapidly. But it's worth noting that the iterative method performed better than the matrix method until we reached a high threshold (also, the increased frequency of mod operations may have slowed the matrix method).

## My Benchmarked Results:

$\mathbf{n}$	Recursive	Iterative	Matrix
2	0.000001	0.000001	0.000011
10	0.000003	0.000001	0.000017
30	0.021920	0.000001	0.000012
40	1.973016	0.000003	0.000011
50	240.048973	0.000001	0.000013
1000	Too Long	0.000027	0.000013
10000	Too Long	0.000272	0.000017
50000	Too Long	0.001136	0.000011

```
#include <stdio.h>
#include <stdlib.h>
#include <stdbool.h>
#include <time.h>
#include <stdint.h>
#include <vector>
#include <cmath>
//fib1
int fib1(int n) {
    if (n == 0) {
        return 0;
    else if (n == 1) {
        return 1;
    }
    else {
        return (fib1(n-1)% 65536+fib1(n-2)% 65536)% 65536;
}
//fib2
int fib2(int n) {
    int fibarray[n+1];
```

```
fibarray[0] = 0;
   fibarray[1] = 1;
   for (int i = 2; i <= n; i++) {
       fibarray[i] = (fibarray[i-1]% 65536 + fibarray[i-2]% 65536)% 65536;
   return fibarray[n];
}
//fib3
struct matrix_holder
   int matrix[2][2];
};
// Implementation of naive matrix squaring
// resulting = mat1^2
// use pass by reference
void naivematrixsquaring(matrix_holder input, matrix_holder &result) {
   result.matrix[0][0] = (input.matrix[0][0] % 65536 *input.matrix[0][0] % 65536 + input
   result.matrix[0][1] = (input.matrix[0][0] % 65536 *input.matrix[0][1] % 65536 + input
   result.matrix[1][0] = (input.matrix[1][0] % 65536 *input.matrix[0][0] % 65536 + input
   result.matrix[1][1] = (input.matrix[1][0] % 65536 *input.matrix[0][1] % 65536 + input
}
void naivematrixmult(matrix_holder input1, matrix_holder input2, matrix_holder &result) {
   result.matrix[0][0] = (input1.matrix[0][0]% 65536 *input2.matrix[0][0]% 65536 + input
   result.matrix[0][1] = (input1.matrix[0][0]% 65536 *input2.matrix[0][1]% 65536 + input
   result.matrix[1][0] = (input1.matrix[1][0]% 65536 *input2.matrix[0][0]% 65536 + input
   result.matrix[1][1] = (input1.matrix[1][0]% 65536 *input2.matrix[0][1]% 65536 + input
}
int fib3(int n) {
   // don't want to deal with these base cases
   if (n == 0) {
       return 0;
   if (n == 1) {
       return 1;
```

```
int arraysize = floor(log2(n)+2);
matrix_holder base_matrix;
matrix_holder final_matrix;
matrix_holder identity_matrix;
matrix_holder intermediary_matrix;
// initialize matrices
for (int i = 0; i < 2; i++) {
    for (int j = 0; j < 2; j++) {
        base_matrix.matrix[i][j] = 0;
        final_matrix.matrix[i][j] = 0;
        identity_matrix.matrix[i][j] = 0;
    }
}
// fix the base matrix such that it is [0\ 1;\ 1\ 1]
base_matrix.matrix[0][0] = 0;
base_matrix.matrix[0][1] = 1;
base_matrix.matrix[1][0] = 1;
base_matrix.matrix[1][1] = 1;
final_matrix.matrix[0][0] = 1;
final_matrix.matrix[1][1] = 1;
identity_matrix.matrix[0][0] = 1;
identity_matrix.matrix[1][1] = 1;
matrix_holder repeated_squares_arrray[arraysize];
repeated_squares_arrray[0] = identity_matrix; // i.e., the identity (at this point)
repeated_squares_arrray[1] = base_matrix;
// populate all relevant repeating squares matrices
for (int i = 2; i < arraysize; i++) {</pre>
    naivematrixsquaring(repeated_squares_arrray[i-1], repeated_squares_arrray[i]);
for (int i = 1; i < arraysize+1; i++) {</pre>
    // and with one and then bit shift for comparison and determining whether we use
    if ((n & 1) == 1) {
        naivematrixmult(final_matrix, repeated_squares_arrray[i], intermediary_matrix
        final_matrix = intermediary_matrix;
    }
    n = n >> 1;
return final_matrix.matrix[0][1]% 65536;// % 65536;
```

}

```
int main(int argc, char const *argv[])
    clock_t fib1_start_time, fib1_end_time, fib2_start_time, fib2_end_time, fib3_start_ti
    double fib1_cpu_time, fib2_cpu_time, fib3_cpu_time;
    int n = 50000;
    fib3_start_time = clock();
    int fib3ret = fib3(n);
    fib3_end_time = clock();
    fib3_cpu_time = ( (double) (fib3_end_time - fib3_start_time) ) / (double) CLOCKS_PER_
    printf("FIB3, %lf\n Fib3 returns: %i\n", fib3_cpu_time, fib3ret);
    fib2_start_time = clock();
    int fib2ret = fib2(n);
    fib2_end_time = clock();
    fib2_cpu_time = ( (double) (fib2_end_time - fib2_start_time) ) / (double) CLOCKS_PER_
    printf("FIB2, %lf\n Fib2 returns: %i\n", fib2_cpu_time, fib2ret);
    fib1_start_time = clock();
    int fib1ret = fib1(n);
    fib1_end_time = clock();
    fib1_cpu_time = ( (double) (fib1_end_time - fib1_start_time) ) / (double) CLOCKS_PER_
    printf("FIB1, %lf\n Fib1 returns: %i\n", fib1_cpu_time, fib1ret);
    return 0;
}
```

3.

A	B	O	o	Ω	$\omega$	Θ
$\frac{1}{\log n}$	$\log(n^2)$	Y	N	Y	N	Y
$\log(n!)$	$\log(n^n)$	Y	N	Y	N	Y
$-\sqrt[3]{n}$	$(\log n)^6$	N	N	Y	Y	N
$n^2 2^n$	$3^n$	Y	Y	N	N	N
$(n^2)!$	$n^n$	N	N	Y	Y	N
$\frac{n^2}{\log n}$	$n\log(n^2)$	N	N	Y	Y	N
$(\log n)^{\log n}$	$\frac{n}{\log(n)}$	N	N	Y	Y	N
$100n + \log n$	$(\log n)^3 + n$	Y	N	Y	N	Y

- 4. SEE HANDWRITTEN PROOFS
- 5. SEE HANDWRITTEN PROOFS

Milan Kamaprasad

Preface: I'm sorry for not

La Te X'ing this — didn't.

alot enough time to do so.

I will typeset all future psets

For #1, I had a different solution initially, but at Professor M's office hours, he recommended changing to a more efficient solution — it's messier (sorry.) [1:1]

6-sided biased die.

Take each side with probability, Pr.

We can generate unbiased coin flips (i.e., heads & tails) by using the following scheme:

Roll die twice.

- 1) If you roll a larger number then a smaller number, we will assign a coin flip of heads.
- (2) If you roll a smaller number then a larger number, the will assign a coin flip of tails.
- 3 If you roll the same number twice, restart.

P (heads) = P2 ·P, + P3 (P.+P2) + P4 (P.+P2+P3) + P5 (P.+P2+P3+P4) + P6 (P.+P2+P3+P4+P5)

Which we can rewrite:

P(neads) = P, P2+P, P3+P, P4+P, P5+P, P0+P2P4+P2P4+P2P6+P2P0+P3P4+P3P5+P3P6+P3P6+P4P6+P4P6+P4P6+P5P6

= P. (P2+P3+Pu+P5+P0)+ P2(P3+P4+P5+P6)+ P3(P4+P5+P6)+ P4(P5+P6)+ P5P6

P(tails) = P, (P2+P3+P4+P5+P0) + P2(P3+P4+P5+P0) + P3(P4+B+P0) + P4(P5+P0) + P5 P0

 $P(heads) = P(tails) \implies unbiased coin flip.$ 

Expected # die rolls until fair (unbiased) coin flip :

1,2

6-sided biased die.

Take each side with probability P. ... Pr We can generate an unbiased die roll by using the following scheme:

Roll the die three times :

D if any lall numbers repeat, roll again.

2) If the numbers (i.e., of each of the 3 rolls) differ, assign as follows:

If you rolled the smallest of the three numbers first (we'll call this event S), then the middle of the three numbers second (we'll call this M), and finally the largest (L) of the three rolls last -> assign die roll of #1

Here are the ensuing possible permutations by this method:

(and assignments)

```
1.2 (continued)
         we show that the probabilities of each
      permutation are equivalent. ( 1 show P(1) = P(2) = P(3),
       but I assert it holds for all of my resulting die rolls.)
P(1) = P(s, M, L):
          P, (P2 (P3+P4+P5+P6) + P3 (P4+P5+P6) + P4 (P5+P6) + P5 P6)
           + P2 (P3 (P4+P3+P0) + P4 (P5+P0) + P5 P0)
               + P3 (P4 (Ps+P0) + Ps P6
                  + P4 (Ps Po)
P(2) = P(s, L, M):
          P, (P3 P2 + P4 (P2+P3) + P5 (P2+P3+P4) + P6 (P2+P3+P4+P5))
            + P2 (P4 P3 + P5 (P3+P4) + Pa (P3+P4+P5))
              + P3 ( ps p4 + p. (pu+ps))
                + P4 (p6ps)
                                   * When distributed | regrouped
 P(3) = P(M,S,L);
                                          P(1) = P(2) --- see appendix
           P2 (P1 (P3+P4+P6+P6))
           + P3 (p, (p++ps+po) + p2 (p++ps+po))
            + PH (P1 (P5+P0) + P2 (P5+P0) + P3 (P5+P0))
              + P5 (P, Po + P2Po + P3 Po + P4Po)
```

# when distributed/regrouped

P(1) = P(2) = P(3) → see appendix

Equally likely ... our scheme generates an unbiased die roll.

$$T = \frac{rolls/round}{P(sml) + P(slm) + P(msl) + P(lsm) + P(lms)} = \frac{3}{6P(sml)}$$

$$T = \frac{1}{2 P(SML)}$$

for the sake of both my sanity, as well as the sanity of the grader, I will not substitute P(SML), but it can be seen on the preceding page.

APPENDIX 1#1.2 expansion to prove equal probabilities.

SML expanded

SLM expanded

MSL expanded:  $P_1 \left( p_2 p_3 + p_2 p_4 + p_2 p_5 + p_2 p_4 \right)$   $+ P_1 \left( p_3 p_4 + p_3 p_5 + p_3 p_4 \right) + P_1 \left( p_4 p_5 + p_4 p_4 \right) + P_1 \left( p_5 p_4 \right)$   $+ P_2 \left( p_3 p_4 + p_3 p_5 p_5 p_3 p_4 \right) + P_2 \left( p_4 p_5 + p_4 p_4 \right) + P_2 \left( p_5 p_4 \right)$   $+ P_3 \left( p_4 p_5 + p_4 p_6 \right) + P_3 \left( p_5 p_4 \right)$   $+ P_4 P_5 P_6$   $\Rightarrow \text{same as prior 2}$   $\therefore \text{equal probabilities}$ 

```
4
```

take 
$$f_i$$
:  $n$ 

$$f_i(n) = n$$

$$f_i(2n) = 2n$$

$$f_{(2n)} \stackrel{?}{\leq} c \cdot f_{(n)}$$
, take  $c = 2$ 

$$f_1(2n) = 2n \leq 2 \cdot f_1(n) = 2 \cdot n$$

(2) 
$$f_2(2n)$$
 is not  $O(f_2(n))$  if there

$$f_2(2n) = (2n)^{2n} = (4n^2)^n$$

We cannot 
$$(4n^2)^n \leq c \cdot n^n \rightarrow \left(\frac{4n^2}{n}\right)^n \leq c$$

: 
$$\exists f_2(n) \ s.t. \ f_2(2n) \ is \ not \ O(f_2(n))$$

(3) By def'n if f(n) is O(g(n)),  $\exists c, N \quad s.t. \quad f(n) \subseteq c.g(n) \quad \forall n \geq N$ 

Similarly, if g(n) is O(h(n)),  $\exists C_2, N_2 \quad s.t. \quad g(n) \leq C_2 h(n) \quad \forall n \geq N_2$ 

We can take that multiplying both sides by a constant, c,  $C \cdot g(n) \subseteq C \cdot C_2 h(n)$   $\forall n \supseteq N_2$ 

does not change the inequality.

Given the previous and  $f(n) \leq c \cdot g(n)$ , . We can take

 $f(n) \leq c \cdot g(n) \leq c \cdot c_2 \cdot h(n) \qquad \forall n \geq \max \{ N, N_2 \}$   $\vdots \qquad f(n) \leq C \cdot h(n) \qquad , \quad C = c \cdot c_2 \cdot A \quad n \geq N_{max}$ 

which meets the defin : finis O(hin)

H (cont.)

(4) Counterexample

√n ? n sin n

Say f: In

these do not share a big-O relationship because nsin(n), though bounded by o and n, it oscillates between the two.

(5) If f is o (q(n)),  $\lim_{n \to \infty} \frac{f(n)}{g(n)} = 0$ 

Given the formal defin of a limit to a we can say  $\forall \ \epsilon$ , where  $\epsilon > 0$ ,  $\exists$  N > 0 s.t.

 $\left|\frac{f(n)}{g(n)}\right| \angle \epsilon$  for n > N

thereby find < egin) for n > N

Which matches (though more strictly) the defin for f(n) is O(g(n)):  $f(n) \leq c \cdot g(n)$  for some  $c \cdot N$ and  $V \cdot n > N$ and we can take  $c = \varepsilon$ . [We can arbitrarity Choose  $\varepsilon$  (which is synonymous with c) so long as  $\varepsilon > 0$ .] :. f(n) is  $o(g(n)) \implies f(n)$  is O(g(n)).

By guess & check + graphing
We find exact sol'n

We prove a base case, using given T(1)=0, T(2)=1

Sol'n using recurrence.

Now that we've established a base case lets assume our formula holds true for all  $n \leq N$ 

Let's show that our formula holds true for N+1

case 1: N+1 is a power of 2

i.e., N+1 = 2"

because we assume our sol'n holds true  $n \leq N$   $+ \left(\frac{N+1}{2}\right) \text{ using our formula also holds true}.$ 

Then: 
$$T(N+1) = T(\lceil \frac{N+1}{2} \rceil) + T(\lfloor \frac{N+1}{2} \rfloor) + (N+1)-1$$

because N+1 is a power of 2, it's evenly divisible by 2, so we can drop the  $\Gamma T$  and L L L L, and since  $T \left( \frac{N+1}{2} \right)$  holds true given our induction hypothesis, we can substitute:

 $T(N+1) = 2T(\frac{N+1}{2}) + (N+1)-1$   $= 2(Tlog_2(\frac{N+1}{2})) - 2^{Tlog_2(\frac{N+1}{2})} + 1 + N$   $= 2(Tlog_2(\frac{N+1}{2})) - 2^{Tlog_2(\frac{N+1}{2})} + 1 + N$   $= 2(K-1)(\frac{N+1}{2}) - 2^{K-1} + 1 + N$ 

= (K-1)(N+1) -2.2 1-1 +2+N

=  $(N+1)k - (N+1) - 2k + 1 = (N+1) - 2^{(N+1)} + 1$ =  $(N+1) - 2k + 1 = (N+1) - 2^{(N+1)} + 1$  Case 2: assume N+1 even - i.e., N+1 = 2j - but not a power of Z

$$T(N+1) = T(\lceil \frac{2i}{2} \rceil) + T(\lceil \frac{2i}{2} \rceil) + (N+1) - 1$$

$$= 2T(i) + N+1 - 1$$

$$= 2T(\frac{N+1}{2}) + N$$

ble Ind. Hyp assumes true Vn = N and N+1 ZN We SUBSE.

to the state of th

= 2 ( [10g2 (N+1) - 10g227 (N+1)

this equals what we expect from our original form what we wanted to a how

let's once more assume that our formula holds true  $\forall$   $n \subseteq N$  and we hope to show that the sol'n holds for N+1 Where N+1 is odd i.e.,  $N+1=2J+1 \implies N=2J$ ,  $J \in \mathbb{Z}$  let us also take  $\exists$  k s.t.  $2^{k-1} \angle N+1 \angle 2^k$  non inclusive, again, because (N+1) is odd.

Using the RECURRENCE GEN. FORM?

$$T(N+1) = T(\lceil \frac{N+1}{2} \rceil) + T(\lfloor \frac{N+1}{2} \rfloor) + (N+1) - 1$$

$$= T(\lceil \frac{2j+1}{2} \rceil) + T(\lfloor \frac{2j+1}{2} \rfloor) + (N+1) - 1$$

$$= T(\lceil \frac{1}{2} + \frac{1}{2} \rceil) + T(\lfloor \frac{2j+1}{2} \rfloor) + (N+1) - 1$$

$$= T(\lfloor \frac{1}{2} + \frac{1}{2} \rceil) + T(\lfloor \frac{1}{2} + \frac{1}{2} \rceil) + (N+1) - 1$$

because we take (via Ind. Hyp) our solin as true  $\forall n \leq N$  and  $\exists +1 = \frac{N}{2} + 1 \geq N$  and  $\exists = \frac{N}{2} + N$ , we can use our found solin taken as true for  $T(\exists +1)$  and  $T(\exists)$ , substituting:

$$= \left\lceil \log_{2} (J+1) \right\rceil (J+1) - 2^{\left\lceil \log_{2} (J+1) \right\rceil} + 1 + \left\lceil \log_{2} J \right\rceil (J) - 2^{\left\lceil \log_{2} J \right\rceil} + 1 + N+1-1$$

$$= \left\lceil \log_{2} \left( \frac{N}{2} + 1 \right) \right\rceil \left( \frac{N}{2} + 1 \right) - 2^{\left\lceil \log_{2} \left( \frac{N}{2} + 1 \right) \right\rceil} + 1 + \left\lceil \log_{2} \frac{N}{2} \right\rceil \left( \frac{N}{2} \right) - 2^{\left\lceil \log_{2} N \right\rceil} + 1 + N$$

$$= \left( \left\lceil \log_{2} \left( \frac{N+2}{2} \right) \right\rceil - 1 \right) \left( \frac{N+2}{2} \right) - 2^{\left( \left\lceil \log_{2} \left( \frac{N+2}{2} \right) \right\rceil - 1 \right)} + 1 + \left( \left\lceil \log_{2} N \right\rceil - 1 \right) \left( \frac{N}{2} \right) - 2^{\left\lceil \log_{2} N \right\rceil - 1} + 1 + N$$

Case 3 (cont.)

Now, given our initial bounds  $2^{K-1} < N+1 < 2^{K}, \qquad N+2 \text{ is always} \leq 2^{K}$   $\vdots \qquad \lceil \log_2(N+2) \rceil \equiv K$ but  $N \geq 2^{K-1}$ , so  $\lceil \log_2 N \rceil = \{K-1, K\}$ let's take the case where  $N > 2^{K-1} \Rightarrow \lceil \log_2 N \rceil \equiv K$ returning to egn:  $T(N+1) = (K-1)(\frac{N+2}{2}) - 2^{K-1} + 1 + (K-1)(\frac{N}{2}) - 2^{K-1} + 1 + N$ 

$$T(N+1) = (K-1)(\frac{N+2}{2}) - 2^{K-1} + 1 + (K-1)(\frac{N}{2}) - 2^{K-1} + 1 +$$

$$= (K-1)(\frac{N}{2} + \frac{N}{2} + 1) - 2 \cdot 2^{K-1} + 2 + N$$

$$= (K-1)(N+1) - 2^{K} + 2 + N$$

$$= K(N+1) = M-1 - 2^{K} + 2 + M = K(N+1) - 2^{K} + 1$$
Returning to the stipulation made @ start (2^{K-1} \( \text{ N} + 1 \) \( 2^{K} \) \( \text{ We can Say} \) \( K \equiv \left[ \log\_2(N+1) \right] \)
$$T(N+1) = \left[ \log_2(N+1) \right] (N+1) - 2^{\left[ \log_2(N+1) \right]} + 1$$

1

case 3 (cont.)

finally, let's take the case where 
$$N = 2^{K-1}$$
 (but N+2 still  $\leq 2^{K}$ );

$$\lceil \log_2(N+2) \rceil = K$$
,  $\lceil \log_2 N \rceil = K-1$ 

returning to egn.

$$T(N+1) = (k-1)(\frac{N+2}{2}) - 2^{k-1} + 1 + (k-1-1)(\frac{N}{2}) - 2^{k-1-1} + 1 + N$$

Some algebraic manipulation shown on next page.

$$(k-1)(\frac{N+2}{2}) - 2^{k-1} + 1 + (k-1-1)(\frac{N}{2}) - 2^{k-1-1} + 1 + N$$
  
 $f = k-1$ 

$$f\left(\frac{N+2}{2}\right) - 2^{f} + 1 + (f-1)\left(\frac{N}{2}\right) - 2^{f-1} + 1 + N$$

$$f\frac{N}{2} + f - 2^{f} + 1 + (f\frac{N}{2}) - \frac{N}{2} = 2^{f-1} + 1 + N$$

$$-2^{f} \cdot 2^{-1}$$

$$fN + f - 2^{f}\left(1 + \frac{1}{2}\right) + 1 + 1 + \frac{N}{2}$$

$$(k-1)(N+1) - 2^{k-1}(\frac{3}{2}) + 2 + \frac{12}{2}$$

$$(N+1)k-N-1-2^{k-2}\cdot 3+2+\frac{N}{2}$$

$$(N+1)k - \frac{2^{k-1}}{2} + 1 - 2^{k-1}(\frac{3}{2})$$

\* N= 2 k-1 in this case

so I substitute.