

Welcome to SIGma

SIGma



# Outline

Officers in No Particular Order

Computing Fibonacci



# Anakin

- Math Major
- SIGPwny Crypto<sup>1</sup> Gang + Admin team
- CA for CS 173 + CS 475
- Research with Sam

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<sup>1</sup>Not that one, the other one



# Sam

- Summer Amazon Intern
- CS Major
- Doing CS 374 Course Dev
- Doing Theory Research with Sariel Har-Peled
- Research with Anakin



# Lou

- CS Major
- Current CS 225 CA (past CS 125 and 374 CA)
- Senior, selling soul to finance after this semester



# Aditya

- ECE/Math double degree.
- Quantum error correction research w/Prof. Milenkovic.
- CA for ECE 391.
- Other interests: FP, PL, Crypto.



# Hassam

- Intern at Amazon over the summer
- CS Major (takes math classes for fun ???)
- SIGPwny Crypto Gang + Admin team + Infra lead
- CA for CS 233, CS 173
- Compiler research



# Phil

- CS/Ling Major, Senior
- CA for CS 233
- SIGecom - game theory, economics, and computation





## Section 2

### Computing Fibonacci



## Recursive

$$F_n = \begin{cases} 0 & n = 0 \\ 1 & n = 1 \\ F_{n-1} + F_{n-2} & n \geq 2 \end{cases}$$



## Recursive

$$F_n = \begin{cases} 0 & n = 0 \\ 1 & n = 1 \\ F_{n-1} + F_{n-2} & n \geq 2 \end{cases}$$

$F_0$	$F_1$	$F_2$	$F_3$	$F_4$	$F_5$	$F_6$	$F_7$	$F_8$	$F_9$	$F_{10}$	$F_{11}$	$F_{12}$	$F_{13}$
0	1	1	2	3	5	8	13	21	34	55	89	144	233



# Recursive Computation

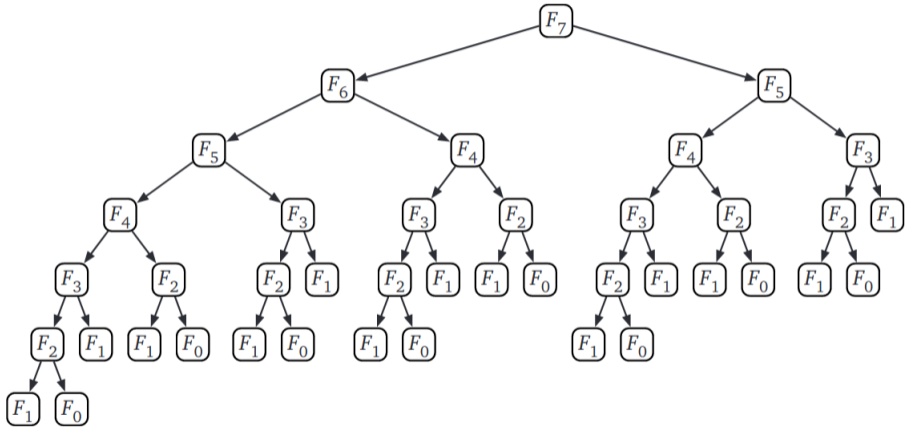


Figure: From [Eri19]



## Can We Do Better?

We can use 12 multiplications to compute  $x^{13}$  as follows:

$$x \rightarrow x^2 \rightarrow x^3 \rightarrow x^4 \rightarrow x^5 \rightarrow x^6 \rightarrow x^7 \rightarrow x^8 \rightarrow x^9 \rightarrow x^{10} \rightarrow x^{11} \rightarrow x^{12} \rightarrow x^{13}$$



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$$x^2 \leftarrow x \cdot x$$

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We can generalize this using binary

<b>1</b>	<b>1</b>	<b>0</b>	<b>1</b>
8	4	2	1





## Building an Algorithm

$$13 = 8 + 4 + 1 = \mathbf{1101}_2$$



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Step	Bit	Power	Result
0			1



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Step	Bit	Power	Result
0			1
1	<b>1</b>	<i>x</i>	<i>x</i>



## Building an Algorithm

$$13 = 8 + 4 + 1 = \mathbf{1101}_2$$

Step	Bit	Power	Result
0			1
1	<b>1</b>	$x$	$x$
2	<b>0</b>	$x^2$	$x$



## Building an Algorithm

$$13 = 8 + 4 + 1 = \mathbf{1101}_2$$

Step	Bit	Power	Result
0			1
1	<b>1</b>	$x$	$x$
2	<b>0</b>	$x^2$	$x$
3	<b>1</b>	$x^4$	$x^5$



## Building an Algorithm

$$13 = 8 + 4 + 1 = \mathbf{1101}_2$$

Step	Bit	Power	Result
0			1
1	<b>1</b>	$x$	$x$
2	<b>0</b>	$x^2$	$x$
3	<b>1</b>	$x^4$	$x^5$
4	<b>1</b>	$x^8$	$x^{13}$



POWER( $x, n$ ):

```
1:  curr ← 1
2:  for  $i \leftarrow 1 \dots n$  :
3:      curr ← curr *  $x$ 
4:  return curr
```



POWER( $x, n$ ):

```
1:  $curr \leftarrow 1$   
2: for  $i \leftarrow 1 \dots n$  :  
3:      $curr \leftarrow curr * x$   
4: return  $curr$ 
```

SQUAREMULTPOWER( $x, n$ ):

```
1:  $res \leftarrow 1$   
2:  $power \leftarrow x$   
3: for bit in BINARY( $n$ ):  
4:     if bit = 1:  
5:          $res \leftarrow res * power$   
6:          $power \leftarrow power * power$   
7: return  $res$ 
```





# Matrices

We have the following two linear equations

$$F_n = F_{n-1} + F_{n-2}$$
$$F_{n-1} = F_{n-1}$$



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$$\begin{aligned}F_n &= F_{n-1} + F_{n-2} \\ F_{n-1} &= F_{n-1}\end{aligned}$$

We can represent this as follows using matrices

$$\begin{bmatrix} F_n \\ F_{n-1} \end{bmatrix} = \begin{bmatrix} 1 & 1 \\ 1 & 0 \end{bmatrix} \begin{bmatrix} F_{n-1} \\ F_{n-2} \end{bmatrix}$$



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We can use SQUAREMULTPOWER to compute this!

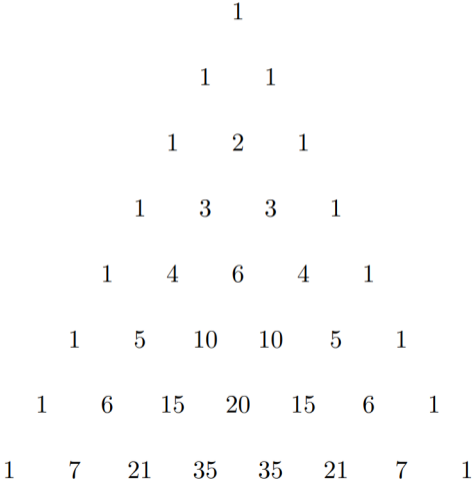


# Combinatorics

This semester is going to be mainly focused on combinatorics. So let's look at one of the most beautiful combinatorial objects in all of mathematics: **Pascal's Triangle**



# Pascal's Triangle



# Binomial Coefficients and Pascal's Triangle

- Blaise Pascal first discussed his triangle in his *Traité du Triangle Arithmétique* [Pas65]
  - ▶ One of the first works on probability theory



# Binomial Coefficients and Pascal's Triangle

- Blaise Pascal first discussed his triangle in his *Traité du Triangle Arithmétique* [Pas65]
  - ▶ One of the first works on probability theory
- Binomial coefficients were first discussed in detail in India in the tenth-century [Knu97]





## Binomial Coefficients

- “The number of ways to choose  $k$  items from  $n$  distinct items”

$$\binom{n}{k} = \frac{n!}{k!(n-k)!}$$



## Binomial Coefficients

- “The number of ways to choose  $k$  items from  $n$  distinct items”

$$\binom{n}{k} = \frac{n!}{k!(n-k)!}$$

- “The number of ways to **not** choose  $n - k$  from  $n$  distinct items”

$$\binom{n}{k} = \binom{n}{n-k}$$



# Pascal's Triangle

$$\begin{array}{c} \binom{0}{0} \\ \binom{1}{0} \quad \binom{1}{1} \\ \binom{2}{0} \quad \binom{2}{1} \quad \binom{2}{2} \\ \binom{3}{0} \quad \binom{3}{1} \quad \binom{3}{2} \quad \binom{3}{3} \\ \binom{4}{0} \quad \binom{4}{1} \quad \binom{4}{2} \quad \binom{4}{3} \quad \binom{4}{4} \end{array}$$



# Pascal's Triangle

		$\binom{0}{0}$							1				
		$\binom{1}{0}$	$\binom{1}{1}$						1	1			
		$\binom{2}{0}$	$\binom{2}{1}$	$\binom{2}{2}$					1	2	1		
		$\binom{3}{0}$	$\binom{3}{1}$	$\binom{3}{2}$	$\binom{3}{3}$				1	3	3	1	
	$\binom{4}{0}$	$\binom{4}{1}$	$\binom{4}{2}$	$\binom{4}{3}$	$\binom{4}{4}$				1	4	6	4	1



## A Pattern in the Triangle

1

1 1

1 2 1

1 3 3 1

1 4 6 4 1

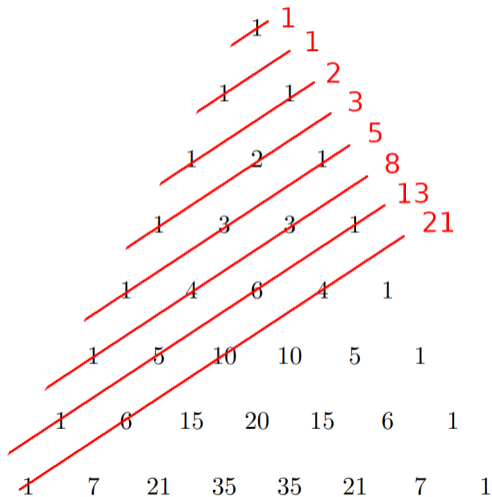
1 5 10 10 5 1

1 6 15 20 15 6 1

1 7 21 35 35 21 7 1



## A Pattern in the Triangle



## Proving the Pattern

Claim:

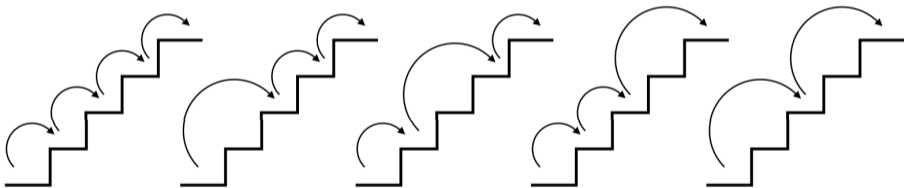
$$\sum_{k=0}^{\lfloor \frac{n}{2} \rfloor} \binom{n-k}{k} = F_{n+1}$$

We are going to prove this by a combinatorial argument



## Staircases

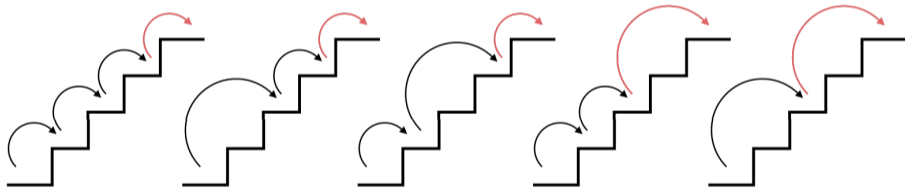
Question: How many ways are there to climb a staircase going one or two steps at a time?





## Staircases

**Question:** How many ways are there to climb a staircase going one or two steps at a time?



We can think of this recursively!



## Steps to Compute Steps

- Let the starting step be step 0. Assuming we are on step  $n \geq 2$ , how did we get here?



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  - ▶ Either we took a single step from step  $n - 1$



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  - ▶ Or we took two steps from step  $n - 2$



## Steps to Compute Steps

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  - ▶ Either we took a single step from step  $n - 1$
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- Combining the number of ways to get to step  $n - 1$  with the number of ways to get to step  $n - 2$  yields the number of ways to get to step  $n$



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- $S_n = S_{n-1} + S_{n-2}$



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- $S_n = S_{n-1} + S_{n-2}$ 
  - ▶ How many ways are there to get to step 0? **Exactly 1** ( $S_0 = 1$ )



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  - ▶ How many ways are there to get to step 1? **Exactly 1** ( $S_1 = 1$ )





## Steps to Compute Steps

- Let the starting step be step 0. Assuming we are on step  $n \geq 2$ , how did we get here?
  - ▶ Either we took a single step from step  $n - 1$
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- Combining the number of ways to get to step  $n - 1$  with the number of ways to get to step  $n - 2$  yields the number of ways to get to step  $n$
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  - ▶ How many ways are there to get to step 0? **Exactly 1** ( $S_0 = 1$ )
  - ▶ How many ways are there to get to step 1? **Exactly 1** ( $S_1 = 1$ )
- $S_n = F_{n+1}$



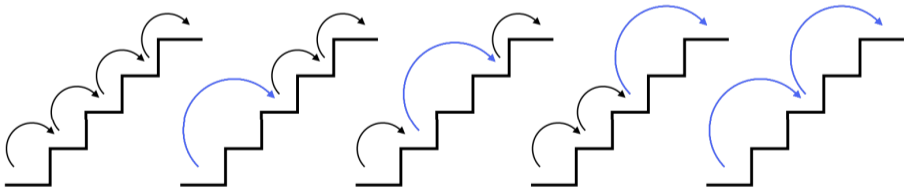
## Making Choices

- There is another angle to the staircase problem



## Making Choices

- There is another angle to the staircase problem
- We can just choose which steps to take two steps from, and fill the rest with single steps



## Placing Steps

- We have to choose where to place our steps of size 2
- If we have  $n$  steps, how many ways can we place  $k$  steps of size 2?



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$$\left\lfloor \frac{n}{2} \right\rfloor$$



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- How many possible values of  $k$  are there?

$$\left\lfloor \frac{n}{2} \right\rfloor$$

$$\text{Thus, } \sum_{k=0}^{\left\lfloor \frac{n}{2} \right\rfloor} \binom{n-k}{k} = S_n = F_{n+1}$$





Questions?



*[Combinatorics] has a relation to almost every species of useful knowledge that the mind of man can be employed upon.*

— JAMES BERNOULLI, *Ars Conjectandi* (“The Art of Conjecturing”) (1713)



# Bibliography



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*The Art of Computer Programming, Vol. 1: Fundamental Algorithms.*

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Blaise Pascal.

*Traité du triangle arithmétique , avec quelques autres petits traitez sur la mesme matière. Par Monsieur Pascal.*

G. Desprez, 1665.

