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Math/Stat 341: Williams College: 5/1/2015



#### Some Issues for the Future

- World is rapidly changing powerful computing cheaply and readily available.
- What skills are we teaching? What skills should we be teaching?
- One of hardest skills: how to think / attack a new problem, how to see connections, what data to gather.

# **Goals of the Talk: Opportunities Everywhere!**

- Ask Questions! Often simple questions lead to good math.
- Gather data: observe, program and simulate.
- Use games to get to mathematics.
- Discuss implementation: Please interrupt!

Joint work with Cameron (age 8) and Kayla (age 6) Miller

My math riddles page:

Intro

http://mathriddles.williams.edu/

The M&M Game

## **Motivating Question**

Cam (4 years): If you're born on the same day, do
you die on the same day?

#### M&M Game Rules

Cam (4 years): If you're born on the same day, do
you die on the same day?





- (1) Everyone starts off with *k* M&Ms (we did 5).
- (2) All toss fair coins, eat an M&M if and only if head.



# Be active – ask questions!

What are natural questions to ask?

## Be active – ask questions!

#### What are natural questions to ask?

Question 1: How likely is a tie (as a function of k)?

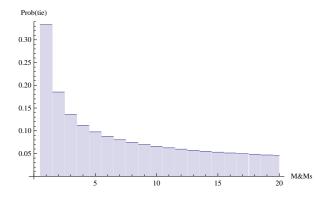
Question 2: How long until one dies?

Question 3: Generalize the game: More people? Biased coin?

Important to ask questions – curiousity is good and to be encouraged! Value to the journey and not knowing the answer.

Let's gather some data!

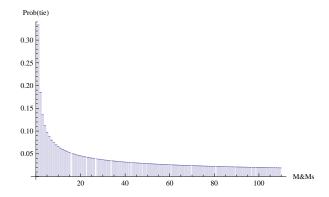
## Probability of a tie in the M&M game (2 players)



Prob(tie)  $\approx 33\%$  (1 M&M), 19% (2 M&Ms), 14% (3 M&Ms), 10% (4 M&Ms).

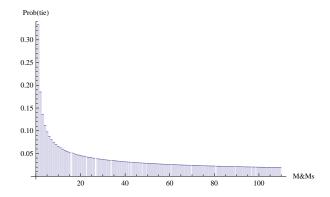
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# Probability of a tie in the M&M game (2 players)



Gave at a 110th anniversary talk....

## Probability of a tie in the M&M game (2 players)

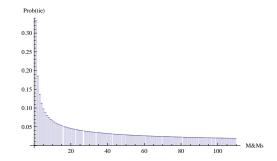


... asked them: what will the next 110 bring us? Never too early to lay foundations for future classes.

#### **Welcome to Statistics and Inference!**

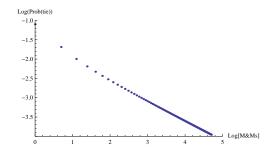
- Goal: Gather data, see pattern, extrapolate.
- Methods: Simulation, analysis of special cases.
- Presentation: It matters how we show data, and which data we show.

# **Viewing M&M Plots**



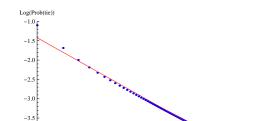
Hard to predict what comes next.

# **Viewing M&M Plots: Log-Log Plot**



Not just sadistic teachers: logarithms useful!

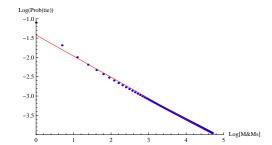
Log[M&Ms]



3

#### Best fit line:

 $\log (\text{Prob(tie})) = -1.42022 - 0.545568 \log (\#\text{M\&Ms}) \text{ or } \\ \text{Prob}(k) \approx 0.2412/k^{.5456}.$ 



#### Best fit line:

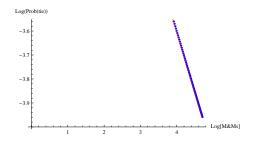
log (Prob(tie)) = -1.42022 - 0.545568 log (#M&Ms) or  $Prob(k) \approx 0.2412/k^{.5456}$ .

Predicts probability of a tie when k = 220 is 0.01274, but answer is 0.0137. What gives?

#### Statistical Inference: Too Much Data Is Bad!

Small values can mislead / distort. Let's go from k = 50 to 110.

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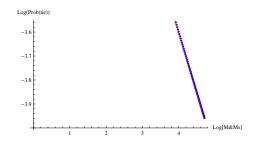


#### Best fit line:

log(Prob(tie)) = -1.58261 - 0.50553 log(#M&Ms) or $<math>Prob(k) \approx 0.205437/k^{.50553}$  (had  $0.241662/k^{.5456}$ ).

#### Statistical Inference: Too Much Data Is Bad!

Small values can mislead / distort. Let's go from k = 50 to 110.



#### Best fit line:

log (Prob(tie)) = -1.58261 - 0.50553 log (#M&Ms) or $<math>Prob(k) \approx 0.205437/k^{.50553}$  (had  $0.241662/k^{.5456}$ ).

Get 0.01344 for k = 220 (answer 0.01347); much better!

# **Simpler Game: Hoops**

Game of hoops: first basket wins, alternate shooting.



## **Simpler Game: Hoops: Mathematical Formulation**

Bird and Magic (I'm old!) alternate shooting; first basket wins.

- Bird always gets basket with probability p.
- Magic always gets basket with probability q.

Let x be the probability **Bird** wins – what is x?

Classic solution involves the geometric series.

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Break into cases:

Bird wins on 1<sup>st</sup> shot: p.

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- Bird wins on 1<sup>st</sup> shot: p.
- Bird wins on  $2^{nd}$  shot:  $(1-p)(1-q) \cdot p$ .

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- Bird wins on 1<sup>st</sup> shot: p.
- Bird wins on  $2^{nd}$  shot:  $(1-p)(1-q) \cdot p$ .
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- Bird wins on nth shot:

$$(1-p)(1-q)\cdot (1-p)(1-q)\cdots (1-p)(1-q)\cdot p.$$

Classic solution involves the geometric series.

Break into cases:

- Bird wins on 1<sup>st</sup> shot: p.
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- Bird wins on nth shot.

$$(1-p)(1-q)\cdot (1-p)(1-q)\cdots (1-p)(1-q)\cdot p.$$

Let r = (1 - p)(1 - q). Then

the geometric series.

Showed

$$x = \text{Prob}(Bird wins) = p(1 + r + r^2 + r^3 + \cdots);$$

will solve without the geometric series formula.

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$$\mathbf{x} = \text{Prob}(\mathbf{Bird} \text{ wins}) = \mathbf{p} + \mathbf{n}$$

Showed

$$x = \text{Prob}(Bird wins}) = p(1 + r + r^2 + r^3 + \cdots);$$

will solve without the geometric series formula.

$$x = \text{Prob}(\textbf{Bird wins}) = p + (1 - p)(1 - q)$$

Showed

$$x = \text{Prob}(Bird wins}) = p(1 + r + r^2 + r^3 + \cdots);$$

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$$x = \text{Prob}(\textbf{Bird wins}) = p + (1 - p)(1 - q)x$$

Showed

$$x = \text{Prob}(Bird wins) = p(1 + r + r^2 + r^3 + \cdots);$$

will solve without the geometric series formula.

$$\mathbf{x} = \text{Prob}(\mathbf{Bird} \text{ wins}) = p + (1 - p)(1 - q)\mathbf{x} = p + r\mathbf{x}.$$

Showed

$$x = \text{Prob}(\text{Bird wins}) = p(1 + r + r^2 + r^3 + \cdots);$$

will solve without the geometric series formula.

Have

$$\mathbf{x} = \text{Prob}(\mathbf{Bird} \text{ wins}) = p + (1 - p)(1 - q)\mathbf{x} = p + r\mathbf{x}.$$

Thus

$$(1-r)\mathbf{x} = \mathbf{p} \text{ or } \mathbf{x} = \frac{\mathbf{p}}{1-r}.$$

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$$x = \text{Prob}(Bird \text{ wins}) = p(1 + r + r^2 + r^3 + \cdots);$$

will solve without the geometric series formula.

Have

$$\mathbf{x} = \text{Prob}(\mathbf{Bird} \text{ wins}) = p + (1 - p)(1 - q)\mathbf{x} = p + r\mathbf{x}.$$

Thus

$$(1-r)x = p$$
 or  $x = \frac{p}{1-r}$ .

As 
$$x = p(1 + r + r^2 + r^3 + \cdots)$$
, find

$$1+r+r^2+r^3+\cdots=\frac{1}{1-r}$$
.

# **Lessons from Hoop Problem**

- Power of Perspective: Memoryless process.
- Can circumvent algebra with deeper understanding! (Hard)
- Depth of a problem not always what expect.
- Importance of knowing more than the minimum: connections.
- Math is fun!

The M&M Game

### Solving the M&M Game

Overpower with algebra: Assume *k* M&Ms, two people, fair coins:

Prob(tie) = 
$$\sum_{n=k}^{\infty} {n-1 \choose k-1} \left(\frac{1}{2}\right)^{n-1} \frac{1}{2} \cdot {n-1 \choose k-1} \left(\frac{1}{2}\right)^{n-1} \frac{1}{2}$$
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where

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

is a binomial coefficient.

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where

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is a binomial coefficient.

"Simplifies" to  $4^{-k} {}_{2}F_{1}(k, k, 1, 1/4)$ , a special value of a hypergeometric function! (Look up / write report.)

A look at your future classes, but is there a better way?

Where did formula come from? Each turn one of four equally likely events happens:

- Both eat an M&M.
- Cam eats and M&M but Kayla does not.
- Kayla eats an M&M but Cam does not.
- Neither eat.

Probability of each event is 1/4 or 25%.

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Each person has exactly k-1 heads in first n-1 tosses, then ends with a head.

$$Prob(tie) = \sum_{n=k}^{\infty} {n-1 \choose k-1} \left(\frac{1}{2}\right)^{n-1} \frac{1}{2} \cdot {n-1 \choose k-1} \left(\frac{1}{2}\right)^{n-1} \frac{1}{2}.$$



Use the lesson from the Hoops Game: Memoryless process!

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If neither eat, as if toss didn't happen. Now game is finite.

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Much better perspective: each "turn" one of three equally likely events happens:

- Both eat an M&M.
- Cam eats and M&M but Kayla does not.
- Kayla eats an M&M but Cam does not.

Probability of each event is 1/3 or about 33%

$$\sum_{n=0}^{k-1} \binom{2k-n-2}{n} \left(\frac{1}{3}\right)^n \binom{2k-2n-2}{k-n-1} \left(\frac{1}{3}\right)^{k-n-1} \left(\frac{1}{3}\right)^{k-n-1} \left(\frac{1}{3}\right)^{\frac{1}{3}}.$$

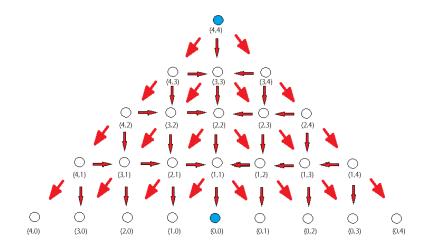


Interpretation: Let Cam have c M&Ms and Kayla have k; write as (c, k).

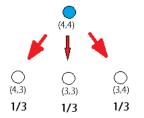
Then each of the following happens 1/3 of the time after a 'turn':

- $\bullet (c,k) \longrightarrow (c-1,k-1).$
- $\bullet (c,k) \longrightarrow (c-1,k).$
- $\bullet \ (c,k) \longrightarrow (c,k-1).$

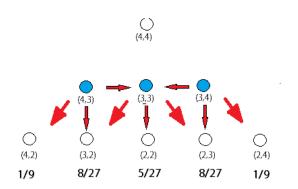




**Figure:** The M&M game when k = 4. Count the paths! Answer 1/3 of probability hit (1,1).



**Figure:** The M&M game when k = 4, going down one level.



**Figure:** The M&M game when k = 4, removing probability from the second level.

**4**0

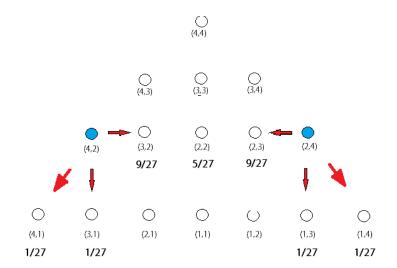


Figure: Pomoving probability from two outer on third lovel

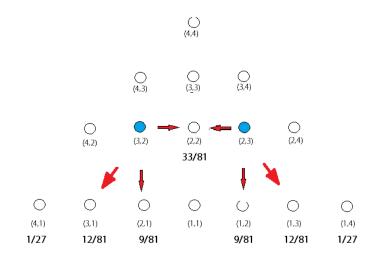


Figure: Removing probability from the (3,2) and (2,3) vertices.

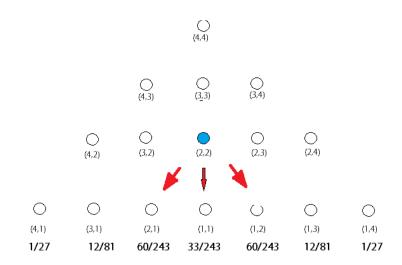


Figure: Removing probability from the (2,2) vertex.

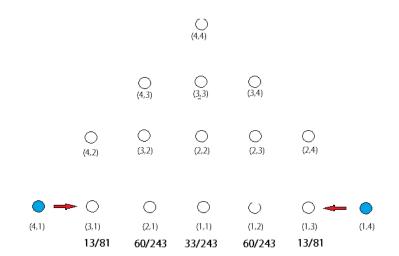


Figure: Removing probability from the (4,1) and (1,4) vertices.

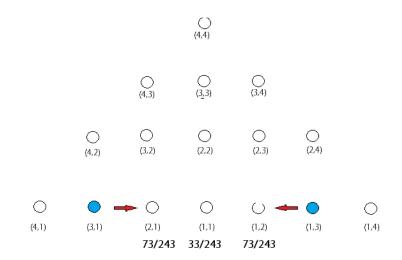
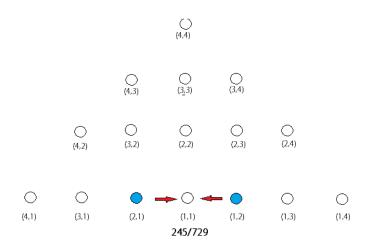


Figure: Removing probability from the (3,1) and (1,3) vertices.



**Figure:** Removing probability from (2,1) and (1,2) vertices. Answer is 1/3 of (1,1) vertex, or 245/2187 (about 11%).

#### Interpreting Proof: Connections to the Fibonacci Numbers!

Fibonaccis: 
$$F_{n+2} = F_{n+1} + F_n$$
 with  $F_0 = 0, F_1 = 1$ .

Starts 0, 1, 1, 2, 3, 5, 8, 13, 21, . . . .

http://www.youtube.com/watch?v=kkGeOWYOFoA.

Binet's Formula (can prove via 'generating functions'):

$$F_n = \frac{1}{\sqrt{5}} \left( \frac{1+\sqrt{5}}{2} \right)^n - \frac{1}{\sqrt{5}} \left( \frac{1-\sqrt{5}}{2} \right)^n.$$

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M&Ms: For  $c, k \ge 1$ :  $x_{c,0} = x_{0,k} = 0$ ;  $x_{0,0} = 1$ , and if  $c, k \ge 1$ :

$$x_{c,k} = \frac{1}{3}x_{c-1,k-1} + \frac{1}{3}x_{c-1,k} + \frac{1}{3}x_{c,k-1}.$$

Reproduces the tree but a lot 'cleaner'.

What if we didn't see the 'simple' recurrence?

$$x_{c,k} = \frac{1}{3}x_{c-1,k-1} + \frac{1}{3}x_{c-1,k} + \frac{1}{3}x_{c,k-1}.$$

### **Interpreting Proof: Finding the Recurrence**

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Obtain 'simple' recurrence by algebra: subtract  $\frac{1}{4}x_{c,k}$ :

$$\frac{3}{4}x_{c,k} = \frac{1}{4}x_{c-1,k-1} + \frac{1}{4}x_{c-1,k} + \frac{1}{4}x_{c,k-1}$$
therefore  $x_{c,k} = \frac{1}{3}x_{c-1,k-1} + \frac{1}{3}x_{c-1,k} + \frac{1}{3}x_{c,k-1}$ .

$$x_{c,k} = \frac{1}{3}x_{c-1,k-1} + \frac{1}{3}x_{c-1,k} + \frac{1}{3}x_{c,k-1}.$$

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• 
$$x_{0,0} = 1$$
.

### **Solving the Recurrence**

$$x_{c,k} = \frac{1}{3}x_{c-1,k-1} + \frac{1}{3}x_{c-1,k} + \frac{1}{3}x_{c,k-1}.$$

- $x_{0.0} = 1$ .
- $x_{1,0} = x_{0,1} = 0$ .
- $\mathbf{x}_{1,1} = \frac{1}{3}\mathbf{x}_{0,0} + \frac{1}{3}\mathbf{x}_{0,1} + \frac{1}{3}\mathbf{x}_{1,0} = \frac{1}{3} \approx 33.3\%.$

## Solving the Recurrence

$$x_{c,k} = \frac{1}{3}x_{c-1,k-1} + \frac{1}{3}x_{c-1,k} + \frac{1}{3}x_{c,k-1}.$$

- $x_{0.0} = 1$ .
- $\bullet$   $x_{1,0} = x_{0,1} = 0.$
- $x_{1,1} = \frac{1}{2}x_{0,0} + \frac{1}{2}x_{0,1} + \frac{1}{2}x_{1,0} = \frac{1}{2} \approx 33.3\%$ .
- $\bullet$   $x_{2,0} = x_{0,2} = 0.$
- $\mathbf{x}_{2,2} = \frac{1}{3}\mathbf{x}_{1,1} + \frac{1}{3}\mathbf{x}_{1,2} + \frac{1}{3}\mathbf{x}_{2,1} = \frac{1}{9} + \frac{1}{27} + \frac{1}{27} = \frac{5}{27} \approx 18.5\%.$

Try and find an easier problem and build intuition.

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Walking from (0,0) to (k,k) with allowable steps (1,0), (0,1) and (1,1), hit (k,k) before hit top or right sides.

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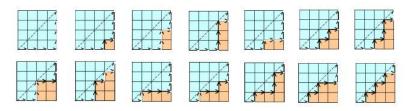
Walking from (0,0) to (k,k) with allowable steps (1,0), (0,1) and (1,1), hit (k,k) before hit top or right sides.

Generalization of the Catalan problem. There don't have (1,1) and stay on or below the main diagonal.

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Generalization of the Catalan problem. There don't have (1,1) and stay on or below the main diagonal.



Interpretation: Catalan numbers are valid placings of ( and ).

Young Saul, a budding mathematician and printer, is making himself a fake ID. He needs it to say he's 21. The problem is he's not using a computer, but rather he has some symbols he's bought from the store, and that's it. He has one 1, one 5, one 6, one 7, and an unlimited supply of + - \*/ (the operations addition, subtraction, multiplication and division). Using each number exactly once (but you can use any number of +, any number of -, ...) how, oh how, can he get 21 from 1,5, 6,7? Note: you can't do things like 15+6=21. You have to use the four operations as 'binary' operations: ((1+5)\*6)+7. Problem submitted by ohadbp@infolink.net.il, phrasing by yours truly.

Solution involves valid sentences: ((w + x) + y) + z, w + ((x + y) + z), ....

For more riddles see my riddles page: http://mathriddles.williams.edu/.

## **Examining Probabilities of a Tie**

When k = 1, Prob(tie) = 1/3.

When k = 2, Prob(tie) = 5/27.

When k = 3, Prob(tie) = 11/81.

When k = 4, Prob(tie) = 245/2187.

When k = 5, Prob(tie) = 1921/19683.

When k = 6, Prob(tie) = 575/6561.

When k = 7, Prob(tie) = 42635/531441.

When k = 8, Prob(tie) = 355975/4782969.

Appendix: Generating Fns

# **Examining Ties: Multiply by** $3^{2k-1}$ **to clear denominators.**

When k = 1, get 1.

When k = 2, get 5.

When k = 3, get 33.

When k = 4, get 245.

When k = 5, get 1921.

When k = 6, get 15525.

When k = 7, get 127905.

When k = 8, get 1067925.

#### **OEIS**

Get sequence of integers: 1, 5, 33, 245, 1921, 15525, ....

OEIS: http://oeis.org/.

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Get sequence of integers: 1, 5, 33, 245, 1921, 15525, ....

OEIS: http://oeis.org/.

Our sequence: http://oeis.org/A084771.

The web exists! Use it to build conjectures, suggest proofs....

```
A084771
             Coefficients of 1/sqrt(1-10*x+9*x^2); also, a(n) is the central coefficient of (1+5*x+4*x^2)\(^n\).
   1, 5, 33, 245, 1921, 15525, 127905, 1067925, 9004545, 76499525, 653808673, 5614995765,
   48416454529, 418895174885, 3634723102113, 31616937184725, 275621102802945,
   2407331941640325, 21061836725455905, 184550106298084725 (list; graph; refs; listen; history; text; internal
   format)
   OFFSET
                0.2
   COMMENTS
                Also number of paths from (0,0) to (n,0) using steps U=(1,1), H=(1,0) and
                  D=(1,-1), the U steps come in four colors and the H steps come in five
                  colors. - N-E. Fahssi, Mar 30 2008
                Number of lattice paths from (0,0) to (n,n) using steps (1,0), (0,1), and
                  three kinds of steps (1,1). [Joerg Arndt, Jul 01 2011]
                Sums of squares of coefficients of (1+2*x)^n. [Joerg Arndt, Jul 06 2011]
                The Hankel transform of this sequence gives A103488 . - Philippe DELEHAM,
                   Dec 02 2007
   REFERENCES
                Paul Barry and Acife Hennessy, Generalized Naravana Polynomials, Riordan
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**Takeaways** 

#### Lessons

- Always ask questions.
- Many ways to solve a problem.
- Experience is useful and a great guide.
- Need to look at the data the right way.
- Often don't know where the math will take you.
- Value of continuing education: more math is better.
- ◆ Connections: My favorite quote: If all you have is a hammer, pretty soon every problem looks like a nail.

**Generating Functions** 

#### Generating Function (Example: Binet's Formula)

#### **Binet's Formula**

$$F_1 = F_2 = 1; \ F_n = \frac{1}{\sqrt{5}} \left[ \left( \frac{1+\sqrt{5}}{2} \right)^n - \left( \frac{-1+\sqrt{5}}{2} \right)^n \right].$$

• Recurrence relation: 
$$\boldsymbol{F}_{n+1} = \boldsymbol{F}_n + \boldsymbol{F}_{n-1}$$
 (1)

• Generating function:  $g(x) = \sum_{n>0} F_n x^n$ .

(1) 
$$\Rightarrow \sum_{n\geq 2} \mathbf{F}_{n+1} x^{n+1} = \sum_{n\geq 2} \mathbf{F}_n x^{n+1} + \sum_{n\geq 2} \mathbf{F}_{n-1} x^{n+1}$$
  
 $\Rightarrow \sum_{n\geq 3} \mathbf{F}_n x^n = \sum_{n\geq 2} \mathbf{F}_n x^{n+1} + \sum_{n\geq 1} \mathbf{F}_n x^{n+2}$   
 $\Rightarrow \sum_{n\geq 3} \mathbf{F}_n x^n = x \sum_{n\geq 2} \mathbf{F}_n x^n + x^2 \sum_{n\geq 1} \mathbf{F}_n x^n$   
 $\Rightarrow g(x) - \mathbf{F}_1 x - \mathbf{F}_2 x^2 = x(g(x) - \mathbf{F}_1 x) + x^2 g(x)$   
 $\Rightarrow g(x) = x/(1 - x - x^2).$ 

#### Partial Fraction Expansion (Example: Binet's Formula)

- Generating function:  $g(x) = \sum_{n>0} \mathbf{F}_n x^n = \frac{x}{1-x-x^2}$ .
- Partial fraction expansion:

$$\Rightarrow g(x) = \frac{x}{1 - x - x^2} = \frac{1}{\sqrt{5}} \left( \frac{\frac{1 + \sqrt{5}}{2}x}{1 - \frac{1 + \sqrt{5}}{2}x} - \frac{\frac{-1 + \sqrt{5}}{2}x}{1 - \frac{-1 + \sqrt{5}}{2}x} \right).$$

**Coefficient of**  $x^n$  (power series expansion):

$$\boldsymbol{F}_n = \frac{1}{\sqrt{5}} \left[ \left( \frac{1+\sqrt{5}}{2} \right)^n - \left( \frac{-1+\sqrt{5}}{2} \right)^n \right]$$
 - Binet's Formula! (using geometric series:  $\frac{1}{1-r} = 1 + r + r^2 + r^3 + \cdots$ ).