

CS 109 Midterm Review

Emma Spellman, 2/8/2020

Slides from Julia Daniel's Fall 2018 review, Lisa Yan's 2019 slides, and Julie Wang's Fall 2019 review

Outline

- **Exam Logistics and Coverage**
- **General Strategies**
- **Counting and Events**
- **Probability Rules**
- **Random Variables**
- **Practice Problems!**



Logistics

- Midterm will be held on **Monday, February 10th from 7pm – 9pm** in Cubberley Auditorium
- Closed book, closed calculator, closed computer
- You may bring **three 8.5" x 11" pages, front and back** of notes to the exam.
 - Check out the midterm section on the [website](#) for some great notes and practice material
- Midterm is 20% of your final grade in the [course](#)
 - But what's most important is your own understanding of the material

Coverage

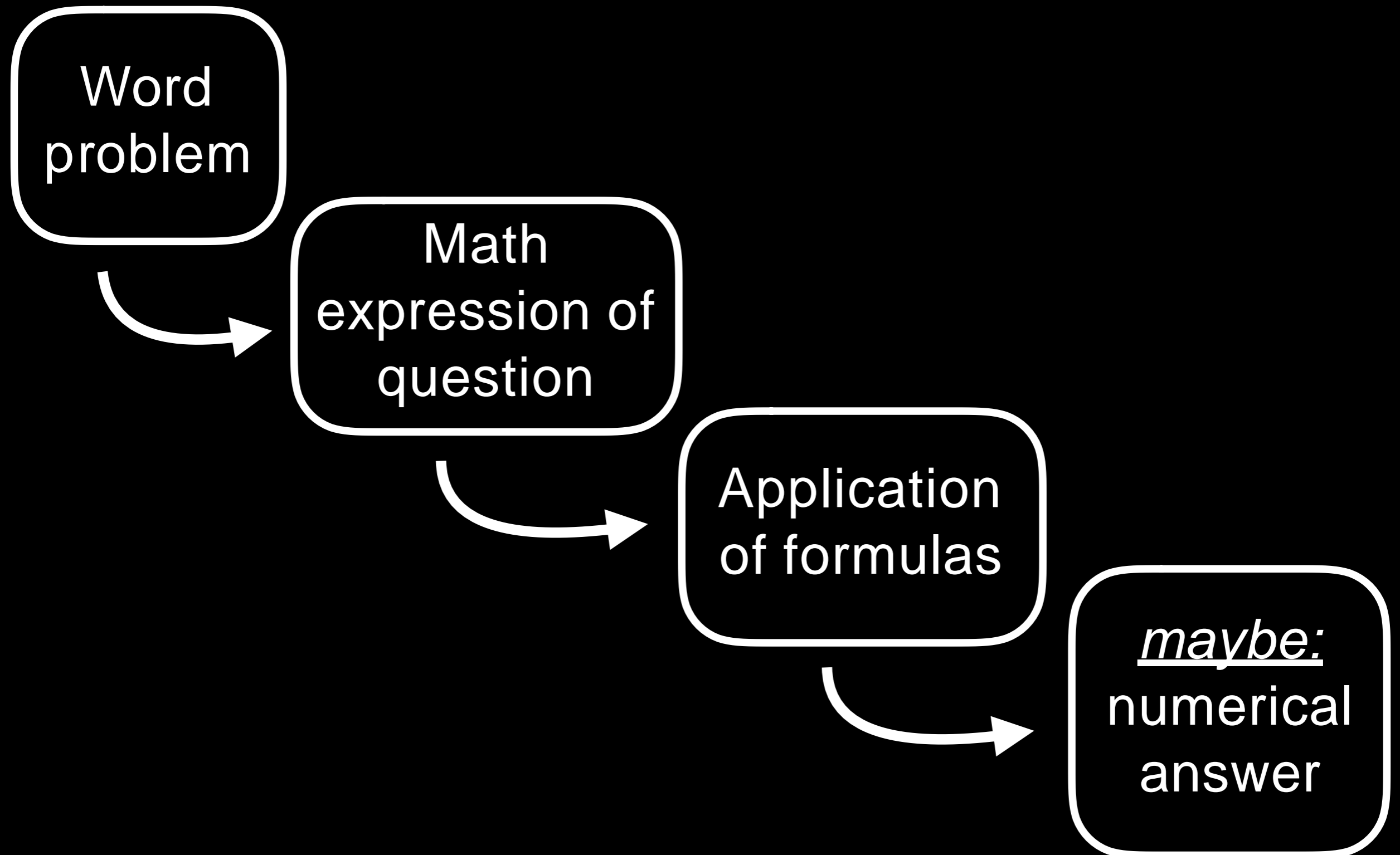
- Lecture Notes 1 – 11
- Counting
 - Sum Rule, Product Rule
 - Inclusion-Exclusion
 - Pigeonhole Principle
 - Permutations, Combinations, and Buckets
- Probability
 - Events Spaces and Sample spaces
 - Probability axioms
 - Conditional Probability
 - Bayes Theorem
 - Independence
- Random Variables
 - Discrete and Continuous
 - PMF's, PDF's, CDF's
 - Expectation and Variance
 - Bernoulli, Binomial, Poisson , Geometric, Negative Binomial, Exponential, Normal
- Multiple Random Variables
 - Joint Distributions
 - Discrete case only

Outline

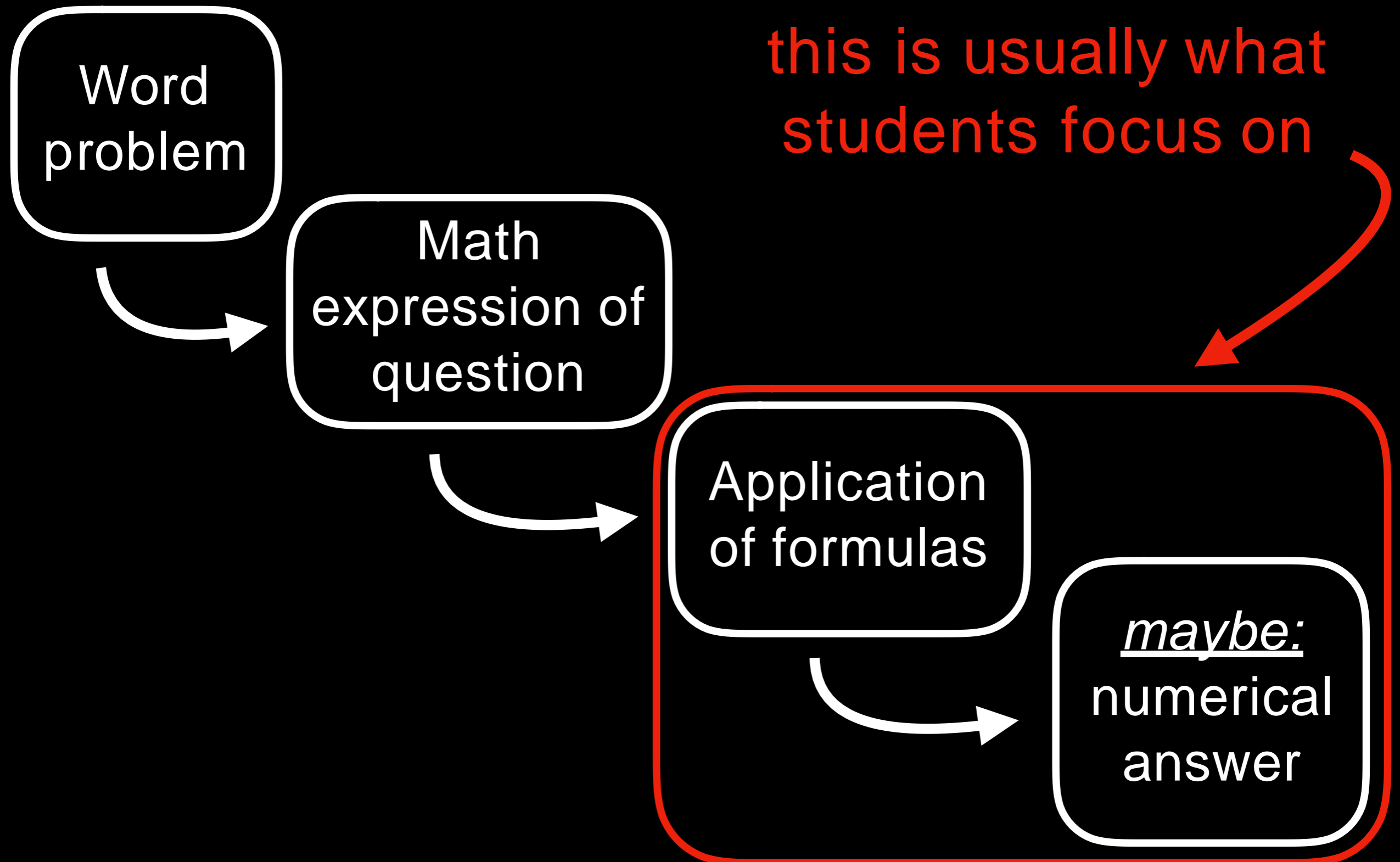
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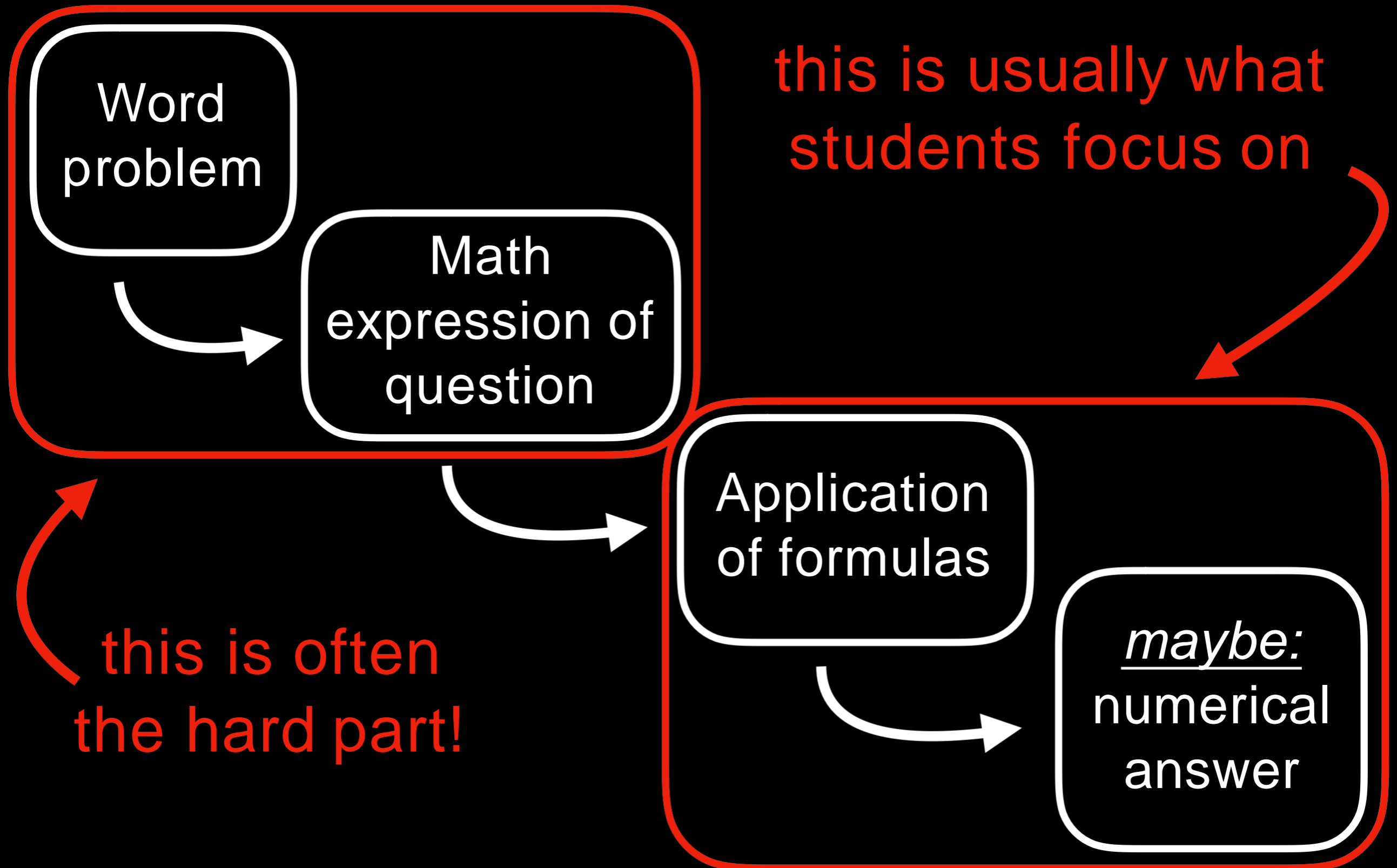
Solving a CS109 problem



Solving a CS109 problem



Solving a CS109 problem



Step 1: Defining Your Terms

- **Counting:** What is distinct? Which orders do I care about? Can I come up with a generative process?
- **Probability:** Are events independent? Definition of conditional probability? Bayes? Law of total probability? What's a 'success'? What's the event space?
 - WRITE DOWN what your variables mean
- **Random variables:** What values does it take on? How is it distributed?
 - Make sure time intervals and units match - particularly important for Poisson and Exponential

Translating English to Probability

What the problem asks:	What you should immediately think:
“What’s the probability of _____”	$P(\quad)$
“_____ given _____”, “_____ if _____”	$\quad \quad$
“at least _____”	could we use what we know about everything less than _____?
“approximate _____.”	use an approximation!
“How many ways...”	combinatorics

these are **just a few**, but practicing is the best way to prepare for an exam!

Translating English to Probability

**People can have blue or brown eyes.
What's the probability John has blue eyes
if his mother has brown eyes?**

Translating English to Probability

**People can have blue or brown eyes.
What's the probability John has blue eyes
if his mother has brown eyes?**

- 1. What events are we given?**
- 2. What are we asked to solve?**

In case I haven't emphasized it
enough...

In case I haven't emphasized it
enough...

**Write down what you *know*
and what you *need***

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Counting

Sum Rule

$$\begin{aligned} \text{outcomes} &= |A| + |B| \\ \text{if } |A \cap B| &= 0 \end{aligned}$$

I can choose to dress up as one of 5 superheroes **or one of 4 farm animals. How many costume choices?**

Counting

Sum Rule	Inclusion-Exclusion Principle
$\text{outcomes} = A + B $ <p><i>if</i> $A \cap B = 0$</p>	$ A + B - A \cap B $ <p><i>for any</i> $A \cap B$</p>
I can choose to dress up as one of 5 superheroes or one of 4 farm animals. How many costume choices?	I can choose to dress up as one of 5 superheroes or one of 6 strong female movie leads. 2 of the superheroes are female movie leads. How many costume choices?

Counting

Product Rule

$$\text{outcomes} = |A| \times |B|$$

if all outcomes of B are possible
regardless of the outcome of A

I can choose to go to one of
3 parties **and** then trick-or-
treat in one of 5
neighborhoods. How many
different ways to celebrate?

Counting

Product Rule

$$\text{outcomes} = |A| \times |B|$$

if all outcomes of B are possible regardless of the outcome of A

I can choose to go to one of 3 parties and then trick-or-treat in one of 5 neighborhoods. How many different ways to celebrate?

Pigeonhole Principle

If m objects are placed into n buckets, then at least one bucket has at least $\text{ceiling}(m / n)$ objects.

If you have an infinite number of red, white, blue, and green socks in a drawer, how many must you pull out before being guaranteed a pair?

Combinatorics: Arranging Items

**Permutations
(ordered)**

**Combinations
(unordered)**

Distinct

$$n!$$

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

Indistinct

$$\frac{n!}{k_1!k_2!\dots k_n!}$$

$$\binom{n+r-1}{r-1}$$

the divider method!

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Probability basics

$$\text{Probability} = \frac{\text{Event space}}{\text{Sample space}}$$

if all outcomes are equally likely!
(use counting with distinct objects)

Axioms

(where S = sample space and E = event space)

$$0 \leq P(E) \leq 1$$

$$P(E^C) = 1 - P(E)$$

$$P(S) = 1$$

Conditional Probability

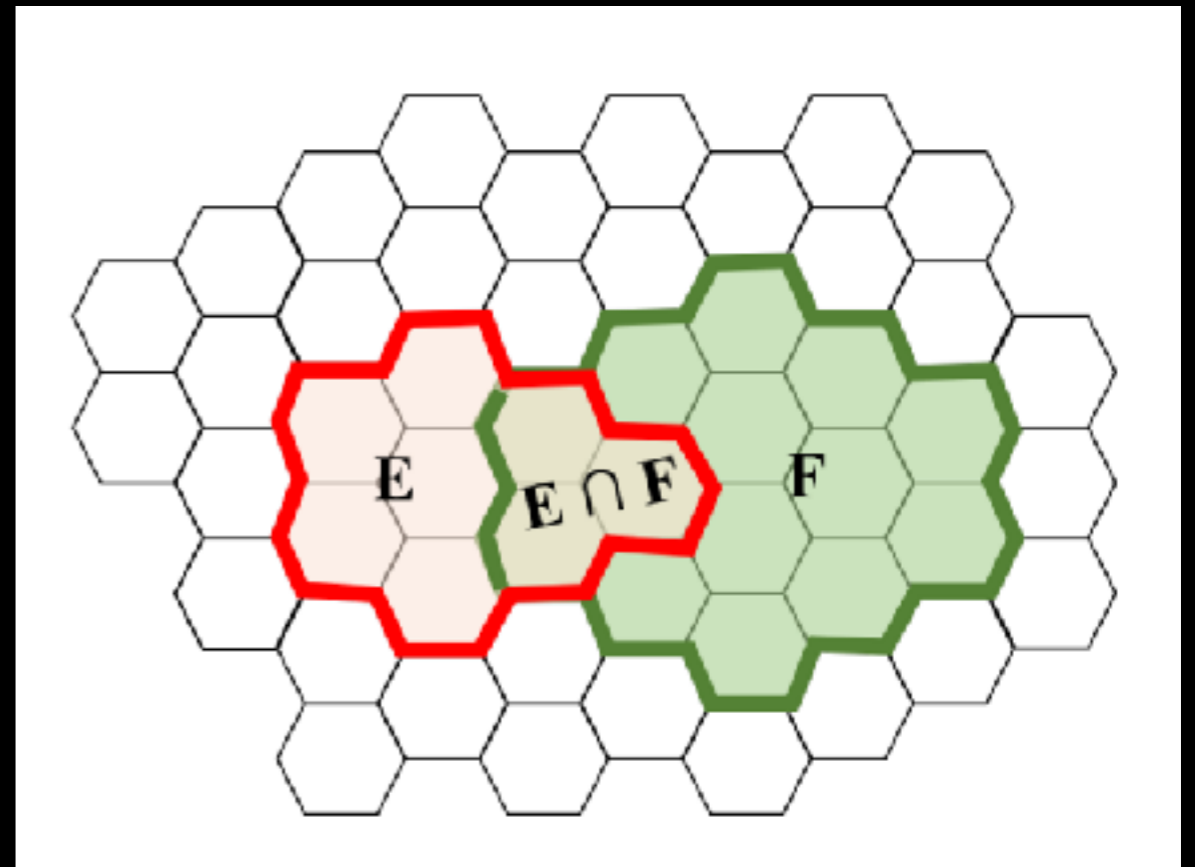
Definition:

$$P(A|B) = \frac{P(AB)}{P(B)}$$

Aka ... Chain Rule:

$$P(AB) = P(A|B)P(B)$$

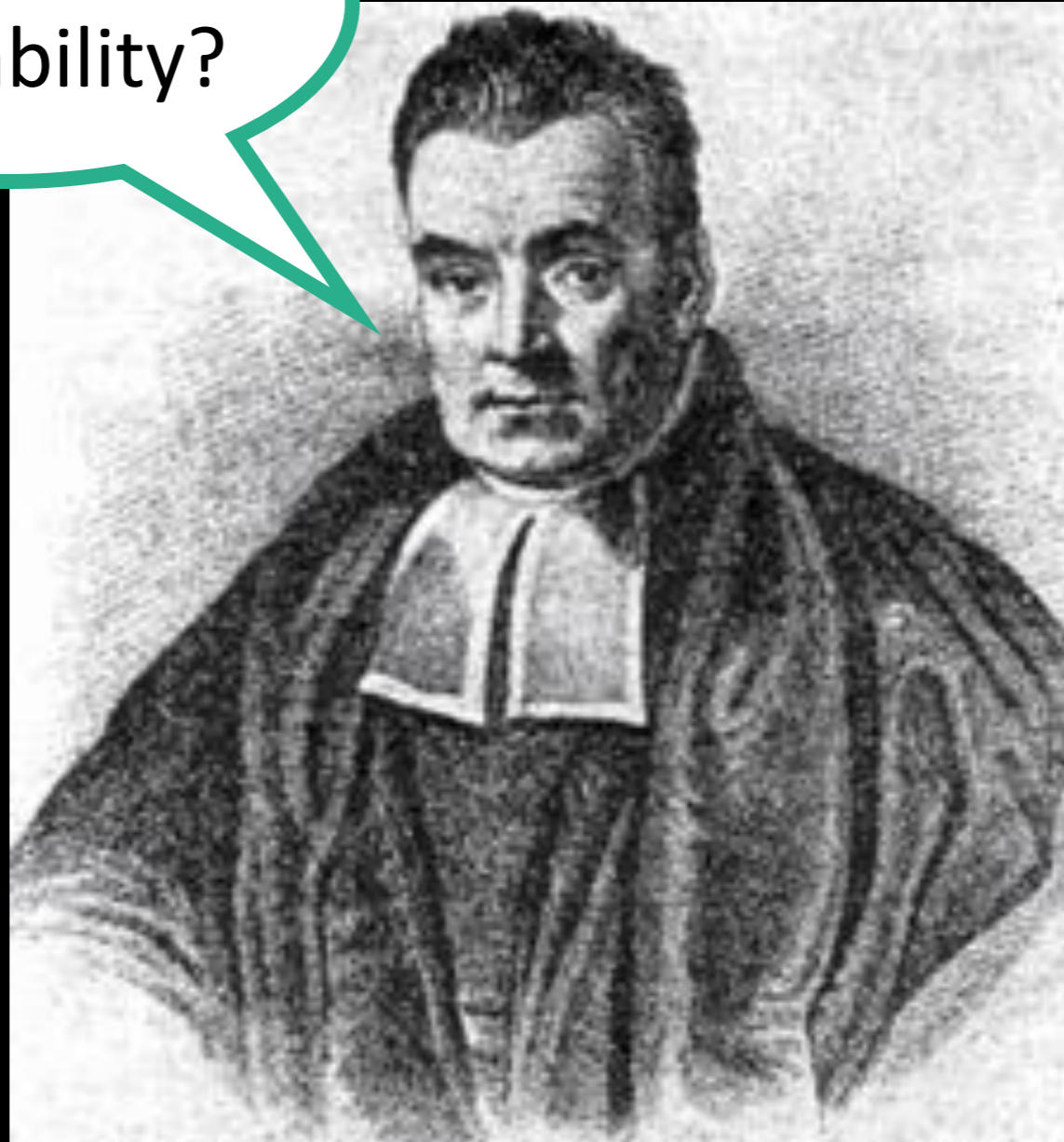
$$* P(EF) = P(E \cap F)$$



Law of Total Probability

$$P(A) = P(A|B)P(B) + P(A|B^C)P(B^C)$$

Conditional
Probability?



Bayes' Rule

$$P(E|F) = \frac{P(F|E)P(E)}{P(F)}$$

Bayes' Rule

posterior

likelihood


prior

$$P(E|F) = \frac{P(F|E)P(E)}{P(F)}$$

normalization constant

Detailed description: The image shows the Bayes' Rule equation with four orange annotations. An arrow labeled 'posterior' points to the left side of the equation, $P(E|F)$. An arrow labeled 'likelihood' points to the term $P(F|E)$ in the numerator. An arrow labeled 'prior' points to the term $P(E)$ in the numerator. An arrow labeled 'normalization constant' points to the term $P(F)$ in the denominator.

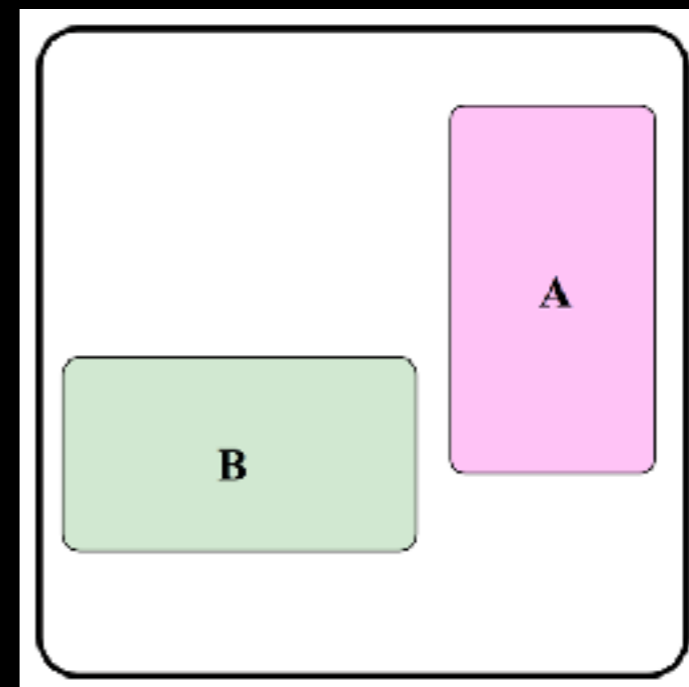
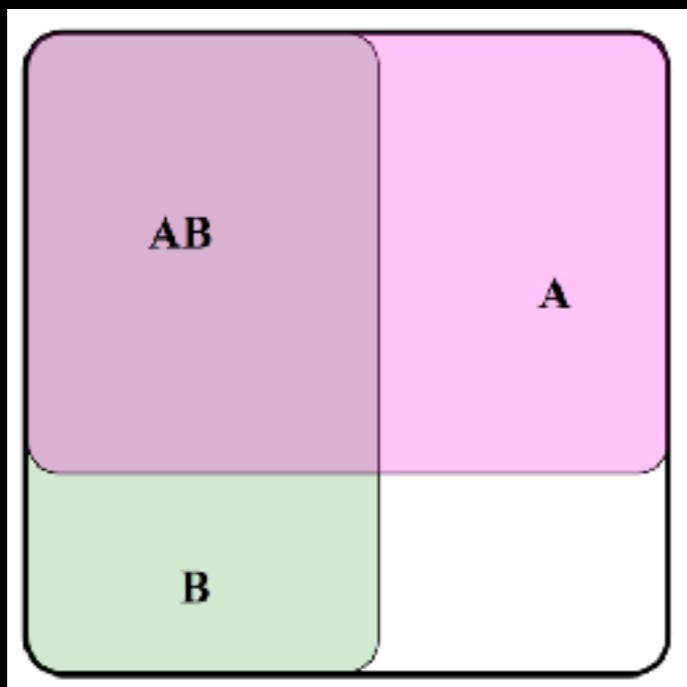
Bayes' Rule

$$P(E|F) = \frac{P(F|E)P(E)}{P(F)}$$

$$P(F|E)P(E) + P(F|E^C)P(E^C)$$

divide the event F into all the possible ways it can happen; use LoTP

Independence + Mutual Exclusion

Independence	Mutual Exclusion
$P(EF) = P(E)P(F)$	$ E \cap F = 0$
“AND”	“OR”



Notes for last slide

- Two events can be independent, but not mutually exclusive.
 - E.g. What is the probability that it's raining and I am eating a pomegranate? Both events are independent, but they can both occur simultaneously. Sometimes it's raining, sometimes I'm eating a pomegranate, and sometimes it's raining and I'm eating a pomegranate.
- Two sets of events can be mutually exclusive but not necessarily independent.
 - I am either studying or sleeping, these are mutually exclusive events. However, how much I study affects how much I sleep, so therefore they are not necessarily independent.
- Call back to your definitions whenever trying to prove independence.

Independence of events

Independence	Conditional Independence
$P(EF) = P(E)P(F)$	$P(EF G) = P(E G)P(F G)$
$P(E F) = P(E)$	$P(E FG) = P(E G)$

If E and F are independent.....

.....that does not mean they'll be independent if another event happens!

& vice versa

Independence of Events - Example

Normally, the event that I am carrying a large bag of candy on me (E) and that I am in front of a large group of people (F) are independent events.

- $P(\text{bag of candy}) = .001$
- $P(\text{in front of people}) = .2$

What is the probability that I have candy and I'm in front of a large group of people?

- $P(\text{candy and in front of people}) = p(\text{candy}) * p(\text{in front of people}) = .0002$

However, given that it is Review Day (G), I have the following conditional probabilities:

- $P(\text{candy} \mid \text{Review Day}) = .2$
- $P(\text{in front of people} \mid \text{Review Day}) = 1$
- $P(\text{candy and in front of people} \mid \text{Review Day}) = 1$

Are these events, having candy and being in front of people, independent events? $1 \neq (.2 * 1)$, so no!

Extending our Rules to Multiple Events

For any events A, B, and E, you can condition consistently on E, and all formulas still hold:

Axiom 1

$$0 \leq P(A|E) \leq 1$$

Corollary 1 (complement)

$$P(A|E) = 1 - P(A^c|E)$$

Transitivity

$$P(AB|E) = P(BA|E)$$

Chain Rule

$$P(AB|E) = P(B|E)P(A|BE)$$

Bayes' Theorem

$$P(A|BE) = \frac{P(B|AE)P(A|E)}{P(B|E)}$$



Independence relationships can change with conditioning.

A and B independent

does NOT necessarily mean

A and B independent given E.

Notice that A, B, and E can be any events

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But first, a minute break.

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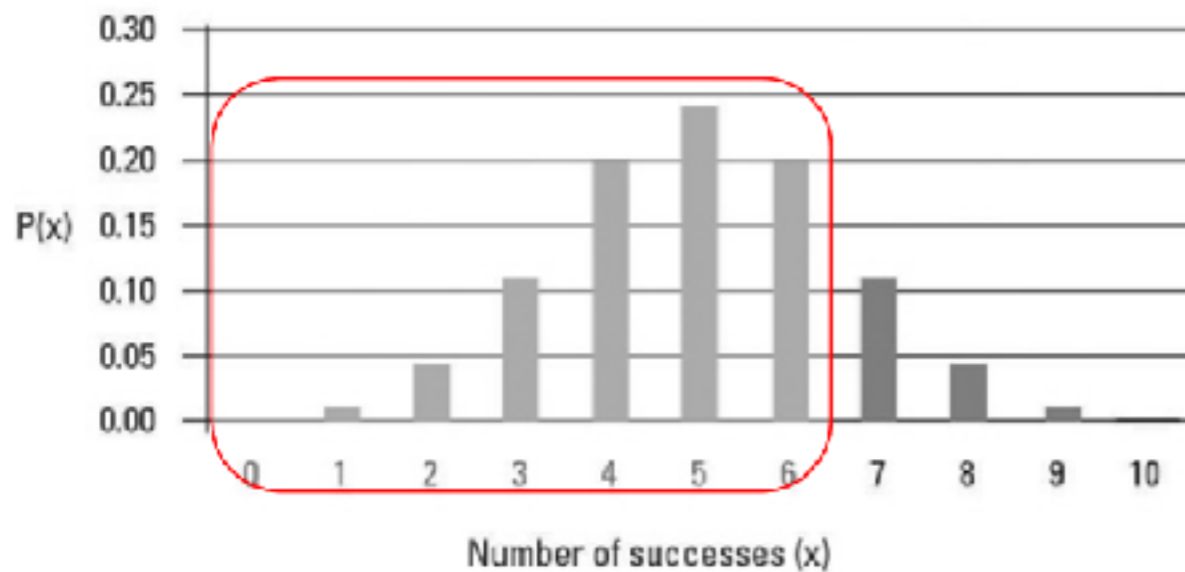


Probability Distributions

Discrete

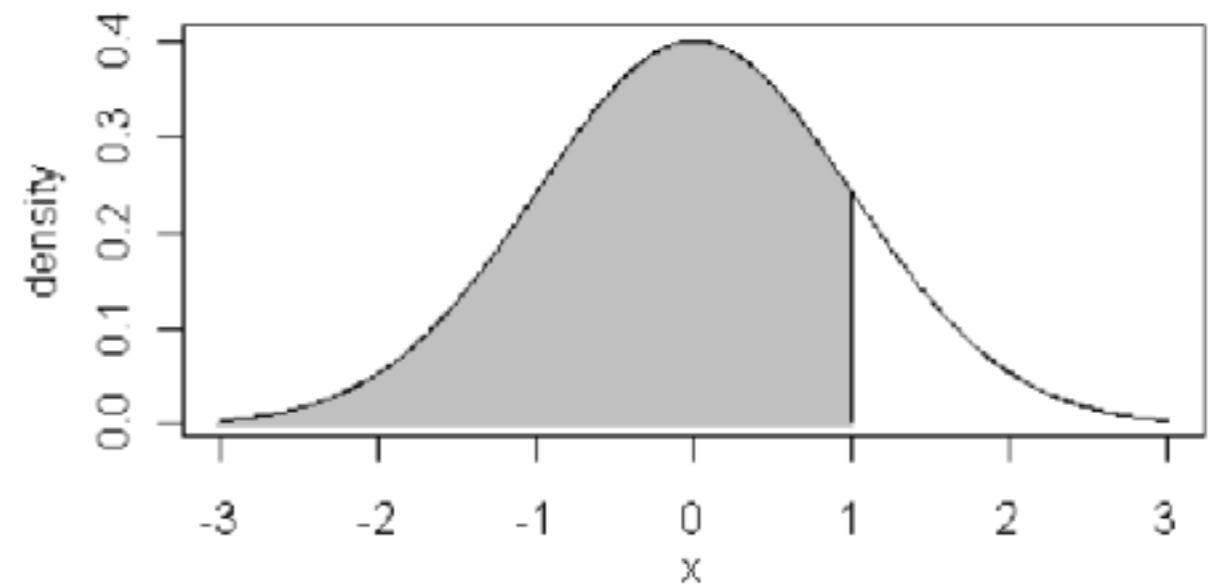
CDF:

Binomial Distribution
 $n = 10, p = 0.5$



Continuous

CDF:



Expectation & Variance

Discrete definition

$$E[X] = \sum_{x:P(x)>0} x * p(x)$$

Continuous definition

$$E[X] = \int_x x * f(x) dx$$

Expectation & Variance

Discrete definition

$$E[X] = \sum_{x:P(x)>0} x * p(x)$$

Continuous definition

$$E[X] = \int_x x * f(x)dx$$

Properties of Expectation

$$E[X + Y] = E[X] + E[Y]$$

$$E[aX + b] = aE[X] + b$$

$$E[g(X)] = \sum_x g(x) * p_X(x)$$

Properties of Variance

$$Var(X) = E[(X - \mu)^2]$$

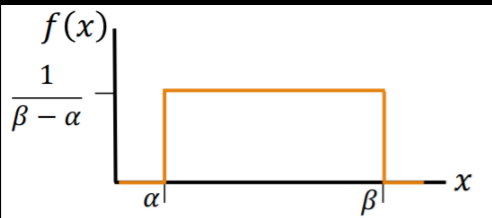
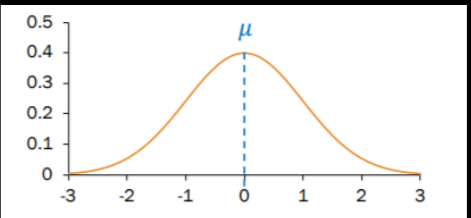
$$Var(X) = E[X^2] - E[X]^2$$

$$Var(aX + b) = a^2 Var(X)$$

All our (discrete) friends

Ber(p)	Bin(n, p)	Poi(λ)	Geo(p)	NegBin(r, p)
$P(X) = p$	$\binom{n}{k} p^k (1-p)^{n-k}$	$\frac{\lambda^k e^{-\lambda}}{k!}$	$(1-p)^{k-1} p$	$\binom{k-1}{r-1} p^r (1-p)^{k-r}$
$E[X] = p$	$E[X] = np$	$E[X] = \lambda$	$E[X] = 1/p$	$E[X] = r/p$
$\text{Var}(X) = p(1-p)$	$\text{Var}(X) = np(1-p)$	$\text{Var}(X) = \lambda$	$\frac{1-p}{p^2}$	$\frac{r(1-p)}{p^2}$
1 experiment with prob p of success	n independent trials with prob p of success	Number of success over experiment duration, λ rate of success	Number of independent trials until first success	Number of independent trials until r successes

All our (continuous) friends

Uni(α, β)	Exp(λ)	N(μ, σ^2)
$f(x) = \frac{1}{\beta - \alpha}$	$f(x) = \lambda e^{-\lambda x}$	$f(x) = \frac{1}{\sigma\sqrt{2\pi}} e^{-\frac{(x-\mu)^2}{2\sigma^2}}$
$P(a \leq X \leq b) = \frac{b - a}{\beta - \alpha}$	$F(x) = 1 - e^{-\lambda x}$	$F(x) = \Phi\left(\frac{x - \mu}{\sigma}\right)$
$E(x) = \frac{\alpha + \beta}{2}$	$E[x] = 1 / \lambda$	$E[x] = \mu$
$Var(x) = \frac{(\beta - \alpha)^2}{12}$	$Var(x) = \frac{1}{\lambda^2}$	$Var(x) = \sigma^2$
	<p>Duration of time until success occurs. λ is rate of success</p>	

Approximations

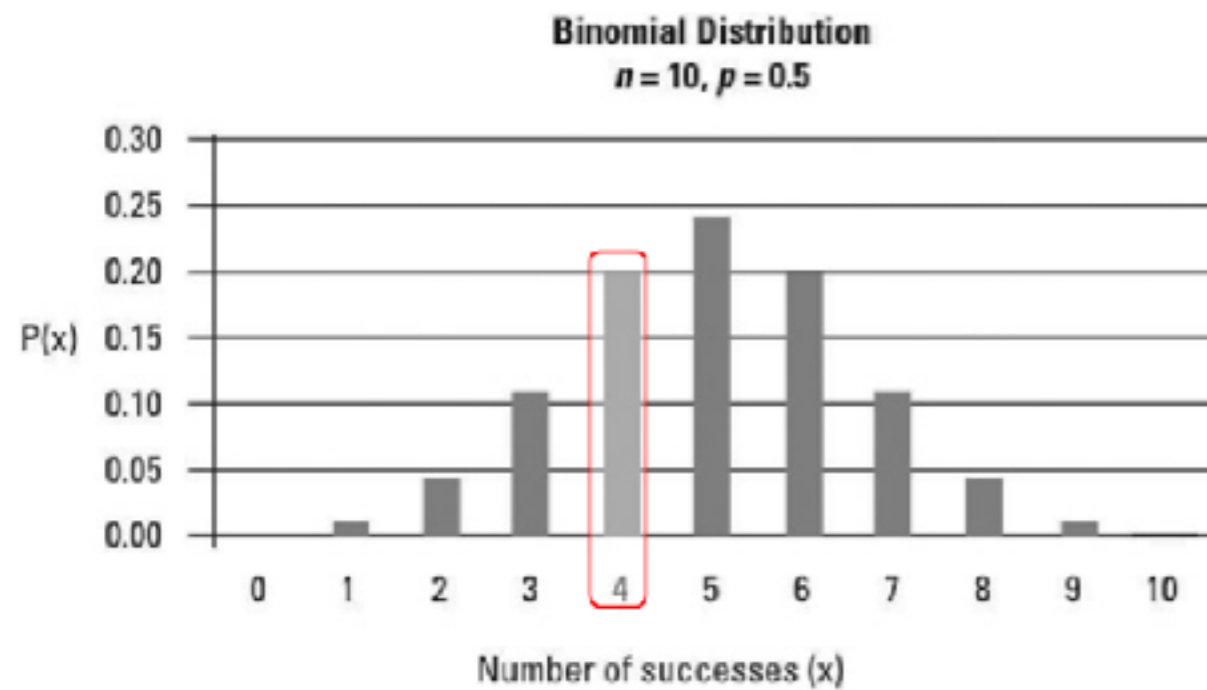
When can we **approximate a binomial?**

- **Poisson**
 - $n > 20$
 - p is small
 - $\lambda = np$ is moderate
 - $n > 20$ and $p < 0.05$
 - $n > 100$ and $p < 0.1$
 - Slight dependence ok
- **Normal**
 - $n > 20$
 - p is moderate
 - $np(1-p) > 10$
 - Independent trials

Continuity correction

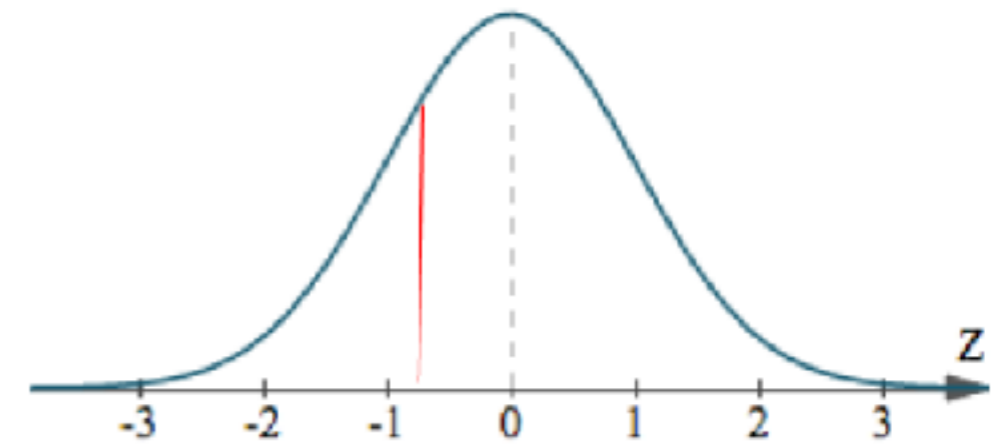
Discrete

PMF:



Continuous

PDF:



Continuity correction

If $P(X=n)$ use $P(n - 0.5 < X < n + 0.5)$

If $P(X > n)$ use $P(X > n + 0.5)$

If $P(X \leq n)$ use $P(X < n + 0.5)$

If $P(X < n)$ use $P(X < n - 0.5)$

If $P(X \geq n)$ use $P(X > n - 0.5)$

Joint Distributions – Discrete

$$p_{x,y}(a, b) = P(X = a, Y = b)$$

$$P_x(a) = \sum_y P_{x,y}(a, y)$$

$$F_{X,Y}(a, b) = \sum_{x \leq a} \sum_{y \leq b} p_{X,Y}(x, y)$$

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Practice Problems

- My friend Katie hates integrating. However, she has to do integrals for psets and for exams. When she's in an exam, she finishes an integral 75% of the time. When she's doing a pset, she finishes an integral 40% of the time. She's a big stem gal so the likelihood she's working on a pset is 0.8. Exams are much rarer – the likelihood she's in an exam is 0.05.
- What's the likelihood Katie finishes an integral?

Practice Problems

- Law of Total Probability!
 - Only integrating on psets and exams
- $P(\text{finishes})$
 - $= P(\text{finishes} \mid \text{exam})P(\text{exam}) + P(\text{finishes} \mid \text{pset})P(\text{pset})$
 - $= (0.75)(0.05) + (0.4)(0.8)$
 - $= 0.3575$

Disclaimer: she finishes her integrals with a much higher probability in real life (although she still hates it)



Working on CS 109 circa 2018

Practice Problems

- There are 8 Harry Potter films, but I only want to watch 3. Since I've seen them all so many times, I can watch any 3 in any order (for example, if I chose movies A, B, and C, I could watch them ordered as ABC or CBA etc.) – how many ways are there for me to watch 3 Harry Potter Movies?

Practice Problems

- $\binom{8}{3}$ ways to choose 3 movies
- $3!$ ways to order the 3 I choose
- $\binom{8}{3} * 3! = 336$

Practice problems

I fly a lot, and the last three times I've flown, I walked through the metal detector and been randomly selected to be searched by the machine. I asked the TSA officer, and he said the probability that the machine dings is $.06$. It has no knowledge of who you are and goes off randomly.

Given that I fly 10 times in a year, what is the probability that I get dinged exactly 3 times? Also, what is the probability that I get dinged exactly 3 times and they are all in a row?

Practice problems

Probability that I get dinged exactly 3 times in the 10 times I fly?

Model as a binomial with $n = 10$, $k = 3$.

$$(10 \text{ choose } 3) * .06^3 * .94^7 = .0168$$

Probability that I get dinged exactly 3 times and they're all in a row (in the 10 times I fly)?

Let's group the 3 times I get dinged into a single unit, then I need to arrange the 7 other times I don't get dinged around it. You can view this as 8 slots, and I need to pick the slot where the times I get dinged happen. That is (8 choose 1). Then, calculate the probability of 3 dings and 7 non dings, and get:

$$(8 \text{ choose } 1) * .06^3 * .94^7 = .00112$$

This makes sense, I'm less likely to get dinged three times in a row as opposed to 3 times in any arrangement.

Practice Problems

- 500 year flood planes (“a previous exam” on website)
 - The Huffmeister floodplane in Houston has historically been estimated to flood at an average rate of 1 flood for every 500 years.
- What is the probability of observing at least 3 floods in 500 years?
- What is the probability that a flood will occur within the next 100 years?
- What is the expected number of years until the next flood?

Practice Problems

- What is the probability of observing at least 3 floods in 500 years?
 - Poisson with $\lambda = 1$ (flood per 500 years)
 - $P(X \geq 3) = 1 - P(X < 3) = 1 - (\text{sum of } P(X=i) \text{ from } 0 \text{ to } 2)$
 - $1 - 5/2e$
- What is the probability that a flood will occur within the next 100 years?
 - Exponential with $\lambda = 1/500$
 - $F(100) = 1 - e^{-0.2}$
- What is the expected number of years until the next flood?
 - Expectation for an exponential RV is $1/\lambda = 500$

You Monday
night (with all
your integrals
solved)



Post midterm ~glow~



Good Luck!!!