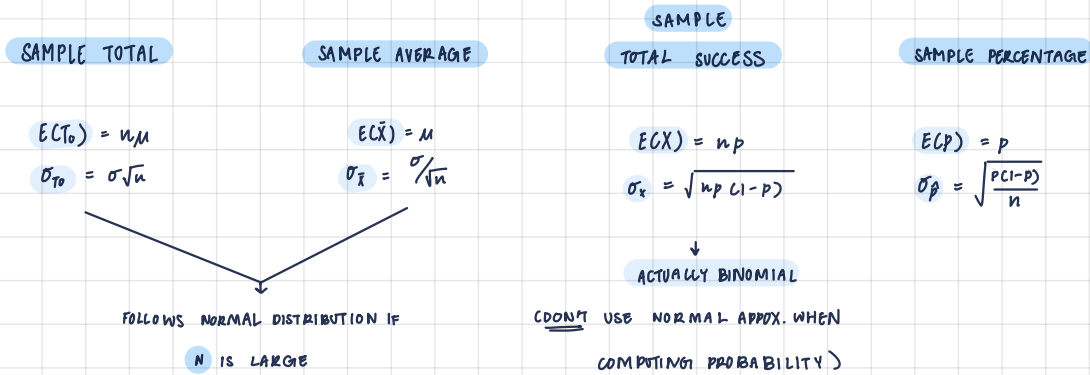


# ALL THE CLT'S



## EXAMPLE 1: FINDING TOTAL APPROXIMATION

THIRTY-SIX JETS WAIT TO TAKE OFF FROM AN AIRPORT. THE AVERAGE TAXI & TAKE-OFF TIME FOR EACH JET IS 8.5 MINUTES, WITH AN SD OF 2.5 MINUTES. WHAT IS THE PROBABILITY THAT THE TOTAL TAXI & TAKE OFF TIME FOR THE 36 JETS IS LESS THAN 320 MIN?

WHAT IS THE VARIABLE? TIME

WHAT DISTRIBUTION DOES IT FOLLOW? WE DON'T KNOW, BUT WE CAN FIND TOTAL  
IT IS CONTINUOUS

↓

TOTAL = SAMPLE SUM

$V_{tot} = \text{time (TAXI) + TAKE OFF}$

$T_0 = X_1 + X_2 + \dots + X_{36}$   
↑  
time per jet

$\mu = 8.5 \quad \sigma = 2.5 \quad n = 36$

$E(T_0) = \mu_{T_0} = 8.5 \cdot 36 = 306$   
 $= 306$

$SD(T_0) = \sigma_{T_0} = \sqrt{n} \sigma = \sqrt{36} \cdot 2.5 = 15$   
 $= 15$

WE KNOW TOTAL HAS NORMAL DISTRIBUTION

$P(T_0 < 320) = \text{normalcdf}(-1000, 320, 306, 15) \approx 0.8247$

## EXAMPLE 2:

THE COOKIE MACHINE AT CHIPS AHoy ADDS A RANDOM # OF CHIPS TO EACH COOKIE. THE NUMBER OF CHIPS IS A RANDOM # WITH AVERAGE 28.5 AND SD 5.3. FIND THE PROBABILITY THAT, IN A BAG OF 50 COOKIES, THE AVERAGE # OF CHIPS PER COOKIE IS AT LEAST 30.

WHAT IS THE VARIABLE? # OF CHIPS

WHAT DISTRIBUTION DOES IT FOLLOW? WE DON'T KNOW

IT IS DISCRETE THO.

$\mu = 28.5$

$\sigma = 5.3$

$n = 50$

each cookie is a sample

$E(\bar{X}) = \mu = 28.5$

$SD = \frac{\sigma}{\sqrt{n}} = \frac{5.3}{\sqrt{50}}$

$\bar{X} \sim \text{NORMAL } (28.5, \frac{5.3}{\sqrt{50}})$

$P(\bar{X} \geq 30) = \text{NORMALCDF}(30, 1000, 28.5, \frac{5.3}{\sqrt{50}})$   
 $= 0.0227$



PUT IN EXACT, NO ROUNDING ERROR

WK 8-1

## EXAMPLE 3: BINOMIAL SUCCESS

→ TALKING ABOUT POPULATION AS A WHOLE: PERCENTAGE / ONE PERSON: PROBABILITY

IT IS KNOWN THAT 40% OF PEOPLE IN THE CITY ARE INFECTED BY COVID-19 (SOME NO, SOME MILD, SOME SEVERE SYMPTOMS).

A RANDOM SAMPLE OF 50 PEOPLE ARE SELECTED.

SUCCESS = INFECTED (WHAT WE ARE INTERESTED IN)

a) WHAT IS THE PROBABILITY THAT BETWEEN 200 + 210 ARE INFECTED? (USE BINOMIAL THEN NORMAL APPROX. TO SEE HOW ACCURATE)

LOOKING FOR SAMPLE TOTAL SUCCESSES

WE CAN USE BINOMIAL + NORMAL  
↑  
ACCURATE      ↑  
APPROXIMATE

① BINOMIAL:

$X \sim X_1 + X_2 + \dots + X_{500}$

$X_i = \begin{cases} 1 & \text{success: infected by covid} \\ 0 & \text{failure: not infected} \end{cases}$

$X \sim \text{Binomial}(n=500, p=0.4)$

PROP ADDED INCLUSIVE

SHOULD BE FOLLOWED BY INCLUSIVE / NOT INCLUSIVE

bc DISCRETE

$P(200 \leq X \leq 210) = P(X \leq 210) - P(X \leq 199)$   
 $= \text{BINOMIAL}(500, 0.4, 210) - \text{BINOMIAL}(500, 0.4, 199)$

$\approx 0.3481$

WHEN DOING NORMAL + CLT WAY,

② NORMAL APPROXIMATION

IT WOULD BE CONTINUOUS DIST. +

USING CLT →  $X \sim \text{NORMAL CDF}, \sqrt{np(1-p)}$

WHEN WE DO THIS X BECOMES CONTINUOUS!

CLT  $\leq / <$  don't matter

$\text{normalcdf}(200, 210, 200, \sqrt{210})$

$\leq <$  DON'T MATTER

$np = .4(500) = 200 \quad \sqrt{np(1-p)} = \sqrt{500(.4 \cdot .6)} = \sqrt{120}$

$\approx 0.3193$

b) WHAT IS THE PROBABILITY THAT THE SAMPLE PROPORTION IS BETWEEN 39% AND 43%?

$\hat{p} = \frac{X_1 + X_2 + \dots + X_{500}}{500} \sim \text{normal}(p, \sqrt{\frac{p(1-p)}{n}})$   
↑  
0.4      ↑  
0.4 · 0.6

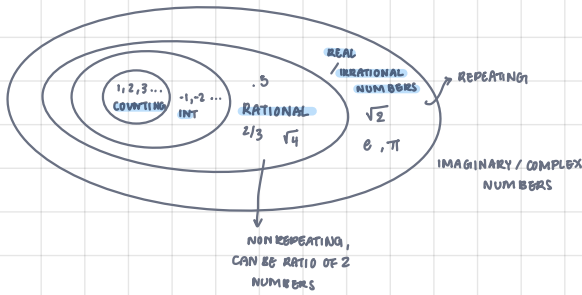
= PERCENTAGE

$\rightarrow P(0.39 \leq \hat{p} \leq 0.43) = \text{normalcdf}(.39, 0.43, 0.4, \sqrt{.24/500}) \approx 0.5905$

# QUIZ:

- ROUNDING  $\rightarrow$  UNDER 5 = ignore, over 5 = up  $\leftarrow$  ALWAYS DO REGULAR ROUNDING UNLESS SPECIFIED
  - ROUND UP  $\rightarrow$  always up (truncate &  $\oplus$ )
  - ROUND DOWN  $\rightarrow$  always down
  - TRUNCATE = JUST THROW AWAY THE DECIMALS
- $\frac{1}{3} = 0.3$  WRONG

## IRRATIONAL NUMBERS

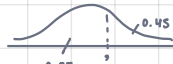


## EXAMPLE FOR HW6 #2 (4.18 d)

$$P(|X+B| \geq 2.89) = .45 \quad \mu_{EX} = -3 \quad \text{Var}(X) = 4 \quad \sigma_{SD} = 2$$

THE IDEA:

$$P(X > ?) = 0.45$$



$$\text{INV NORM C } 0.55, -3, 2$$

#3 THEY FIND THIS 2<sup>nd</sup>

PROF. EXPLAINS TEXTBOOK WAY:

#2 THEY USE  $X = \mu + \sigma Z$  FORMULA

BUT WE DON'T USE THIS.

o conceptual & calculation!

## 4.6 ON HW:

$T_1, T_2, T_3$  PARALLEL

Total Time  $\rightarrow E(T)$

$$T = \text{TIME TO GET JOB TIME} = T_1 + T_2 + T_3$$

$$\text{Sol. 1: } E(T) = E(T_1) + E(T_2) + E(T_3) = 15 \quad \leftarrow \text{parallel, don't add!}$$

$$\text{Sol. 2: } T = T_i, \quad E(T) = E(T_i) = 5 \quad \leftarrow \text{THEY'RE RANDOM}$$

$$\text{Sol. 3: } T = \max\{T_1, T_2, T_3\}$$

$$E(T) = ? \quad (\text{A LOT OF MATH: DON'T WANT TO DO RIGHT NOW})$$

$$E(T) = 5, \text{ BUT THROUGH A LOT OF } \int \text{ AND } \frac{d}{dx}$$

THEY'RE PARALLEL, SO NOT GAMMA

$$X \sim \lambda e^{-\lambda x}, \quad x > 0$$

$$F(x) = \int_0^x \lambda e^{-\lambda t} dt = 1 - e^{-\lambda x}$$

$$T = \max\{T_1, T_2, T_3\}$$

$$F_T(x) = P(T < x) = P(T_1 < x) P(T_2 < x) P(T_3 < x)$$

$$= [F(x)]^3 = [1 - e^{-\lambda x}]^3$$

$$f_T(x) = \frac{d}{dx} [1 - e^{-\lambda x}]^3 = 3\lambda [e^{-\lambda x} \cdot 2e^{-2\lambda x} \cdot e^{-3\lambda x}]$$

$$E(T) = \int_0^\infty x \cdot 3\lambda [e^{-\lambda x} \cdot 2e^{-2\lambda x} \cdot e^{-3\lambda x}] dx$$

$$= \frac{1}{\lambda} = 5$$

# Ch. 6 STOCHASTIC PROCESSES

6.1 + 6.2

WE SKIP CHAPTER 5

→ THIS CHAPTER IS STILL COMPUTING PROBABILITY, JUST A DIFFERENT PROCESS

RANDOM VARIABLE AS A FUNCTION OF TIME!

## STOCHASTIC PROCESS

IS A RANDOM VARIABLE THAT ALSO DEPENDS ON TIME. IT IS WRITTEN AS  $X(t)$ .  $t \in T$  WITH  $T$  BEING A SET OF POSSIBLE TIMES,IN THE PAST:  $X = A.V.$ , USUALLY  $[0, \infty)$ ,  $(-\infty, \infty)$ ,  $\{0, 1, 2, 3\}$ , or  $\{.., -2, -1, 0, 1, 2, ..\}$ 

AND IT HAD A POSSIBLE

VALUE.

### STATES

POSSIBLE VALUES OF  $X(t)$ 

	$X$	0	1	2
$t=0$	$P(X)$	·	·	·
$t=1$	$X$	0	1	2
	$P(X)$	·	·	·
$t=2$	$X$	0	1	2
	$P(X)$	·	·	·

 $X$ 'S DISTRIBUTION  
CHANGES AT DIFFERENT TIMESNOW  $X(t)$ ,  $X$  IS A DIFF.

RANDOM VARIABLE AT

DIFFERENT TIMES.

### REALIZATION

/AKA SAMPLE PATH / TRAJECTORY OF A PROCESS OF  $X(t)$  = RECORDING OF WHAT HAPPENED IN THE PAST $X(t)$  IS A **DISCRETE-STATE** PROCESS IF:  $X$  IS DISCRETE FOR EACH TIME  $t$ A **CONTINUOUS STATE** PROCESS IF:  $X$  IS CONTINUOUS $X(t)$  IS A **DISCRETE-TIME** PROCESS IF THE SET OF TIME  $T$  IS DISCRETEIS A **CONTINUOUS-TIME** PROCESS IF  $T$  IS AN TIME INTERVALWE DON'T DO THE GENERAL STOCHASTIC PROCESS, JUST THE SPECIAL CASE **MARKOV** PROCESS/CHAINS↳ STOCHASTIC PROCESS IS MARKOV IF  $P(\text{FUTURE} | \text{PRESENT} + \text{PAST}) = P(\text{FUTURE} | \text{PRESENT})$ 

→ PAST DOESN'T AFFECT FUTURE

## MARKOV CHAIN

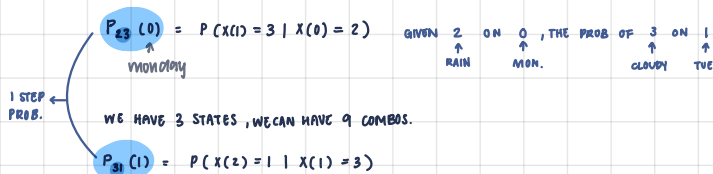
IS A DISCRETE-TIME, DISCRETE-STATE MARKOV STOCHASTIC PROCESS

 $T = \{0, 1, 2\}$ ,  $X(t)$  CAN BE WRITTEN AS A RANDOM SEQUENCE  $\{X(0), X(1), X(2) \dots\}$ SOMETIMES WE USE  $\{1, 2, \dots, N\}$  TO REPRESENT THE STATES,  $N$  COULD BE  $\infty$ 

## TRANSITION PROBABILITY

 $P_{ij}(t) = P(X(t+1) = j | X(t) = i)$  PROBABILITY MAKING A TRANSITION FROM STATE  $i$  TO STATE  $j$  AT TIME  $t$ 

	SUNNY		RAINY		CLOUDY			
STATE:	1		2		3	POSSIBLE VALUES OF RV		
TIME:	M	T	W	TH	F	S	SU	M
	0	1	2	3	4	5	6	7

DON'T NEED  $t, t$  DOES NOT AFFECT ANYTHING.

## HOMOGENEOUS

IF ALL TRANSITION PROBABILITIES ARE INDEPENDENT OF  $t$ .

$$P_{ij}(t) = P_{ij}, P_{ij}^{(n)}(t) = P_{ij}^{(n)}$$

THE DISTRIBUTION OF HOMOGENEOUS MARKOV CHAIN IS COMPLETELY

DETERMINED BY THE INITIAL DISTRIBUTION OF  $P_0$  + ONE-STEP TRANSITION PROB.  $P_{ij}$ 

$$P_{12}^{(2)} = P_{12}^{(1)} = P_{12}^{(0)} \dots$$

$$SO = P_{12}^{(2)}$$

## N-STEP TRANSITION PROBABILITY

 $P_{ij}^{(n)}(t) = P(X(t+n) = j | X(t) = i)$  PROBABILITY MAKING A TRANSITION FROM STATE  $i$  TO STATE  $j$  FROM TIME  $t$  TO TIME  $t+n$ 

MEANS  $P_{12}^{(3)}(1) = P(X(4) = 2 | X(1) = 1)$

↑ TWO STEPS ↑ ONE MORE DAY

WE WANT TO COMPUTE THE

① TRANSITION PROBABILITY MATRIX  $P$  ( $n$  by  $n$  matrix if  $n$  states w/ element  $p_{ij}$ )

↳ we represent the states through the matrix!

$$P = \begin{bmatrix} p_{11} & p_{12} & p_{13} \\ p_{21} & p_{22} & p_{23} \\ p_{31} & p_{32} & p_{33} \end{bmatrix}$$

sometimes this is given, sometimes it needs to be found

②  $n$ -step transition probability matrix  $P^{(n)}$  ( $n$  by  $n$  matrix w/ element  $p_{ij}^{(n)}$ )

③  $P_h$  the distribution at time  $h$  ( $1$  by  $n$  matrix)

④ limit of  $p_{ij}^{(n)} + P_h$  as  $n$  goes to infinite which is our long term forecast.

→ we are still finding probability

## EXAMPLE 1:

IN SOME TOWN, EACH DAY IS EITHER SUNNY OR RAINY. A SUNNY DAY IS FOLLOWED BY ANOTHER SUNNY DAY W/ PROBABILITY 0.7, WHEREAS A RAINING DAY IS FOLLOWED BY SUNNY DAY W/ A PROBABILITY OF 0.4

GIVEN IT RAINS ON MONDAY, MAKE FORECAST FOR TUESDAY, WEDNESDAY, & THURSDAY.

THE WEATHER IS HOMOGENEOUS MARKOV CHAIN W/ TWO STATES: 1 = SUNNY 2 = RAINY

$T = \{0, 1, 2, \dots\}$ ,  $X(0)$  = weather on monday,  $X(1)$  = weather on tuesday, ...

NEW WAY TO COMPUTE: USE MATRIX

TRANSITION MATRIX  $P$ :

$$\begin{bmatrix} p_{11} & \dots & p_{1n} \\ \vdots & \ddots & \vdots \\ p_{n1} & \dots & p_{nn} \end{bmatrix}$$

$$p_{11} + p_{12} + \dots + p_{1n} = 1$$

$n$ -STEP TRANSITION MATRIX:  $P^{(n)}$

$$\begin{bmatrix} p_{11}^{(n)} & \dots & p_{1n}^{(n)} \\ \vdots & \ddots & \vdots \\ p_{n1}^{(n)} & \dots & p_{nn}^{(n)} \end{bmatrix}$$

$$P^{(n)} = P^n$$

$n$ -step trans. prob. TRANS. MATRIX raised to power of  $n$

$$P_h = P_0 P^{(h)}$$

prob. dist. of  $X(h)$  =  $1 \times n$  matrix      INITIAL PROB. DIST.  $1 \times n$  matrix

→ SOLUTION W/ MATRIX

$$P = \begin{bmatrix} p_{11} & p_{12} \\ p_{21} & p_{22} \end{bmatrix} = \begin{bmatrix} 0.7 & 0.3 \\ 0.4 & 0.6 \end{bmatrix} = \text{INITIAL DISTRIBUTION}$$

$$P_0 = [0 \quad 1] \rightarrow \begin{array}{c|cc} X & 1 & 2 \\ \hline P(X) & 0 & 1 \end{array}$$

OLD WAY TO COMPUTE: FORECAST 4 WEDNESDAY = USE LAW OF TOTAL PROB.

$$P\{X(2) = 1\} =$$

USING TUB. TO FIND WED.

$$P\{X(2) = 1 | X(1) = 1\} P\{X(1) = 1\} +$$

$$P\{X(2) = 1 | X(1) = 2\} P\{X(1) = 2\} =$$

$$P_h \cdot 0.4 + P_{21} \cdot 0.6 = 0.52$$

$$P\{X(2) = 2\} = 1 - 0.52 = 0.48$$

FORECAST ON THURSDAY:

$$P\{X(3) = 1\} = P\{X(3) = 1 | X(2) = 1\} P\{X(2) = 1\} +$$

USE WED. TO CALCULATE THURSDAY

$$P\{X(3) = 1 | X(2) = 2\} P\{X(2) = 2\}$$

$$= P_{11} \cdot 0.52 + P_{21} \cdot 0.48 = 0.5556$$

$$P\{X(3) = 2\} = 1 - 0.556 = 0.444$$

## USING THE TI-84 TO OPERATE W/ MATRICES!

• MATRIX: EDIT → OPERATE

•  $X^{-1}$ : FIND INVERSE MATRIX

• MATH > ENTER TO CONVERT DEG → FRACTION

TUESDAY:

$$P_1 = P_0 P^{(1)} = [0 \quad 1] \begin{bmatrix} 0.7 & 0.3 \\ 0.4 & 0.6 \end{bmatrix} = [0.4 \quad 0.6]$$

WEDNESDAY:

$$P_2 = P_0 P^{(2)} = [0 \quad 1] \begin{bmatrix} 0.7 & 0.3 \\ 0.4 & 0.6 \end{bmatrix}^2 = [0 \quad 1] \begin{bmatrix} 0.61 & 0.39 \\ 0.52 & 0.48 \end{bmatrix} = [0.52 \quad 0.48]$$

THURSDAY:

$$P_3 = P_0 P^{(3)} = [0 \quad 1] \begin{bmatrix} 0.7 & 0.3 \\ 0.4 & 0.6 \end{bmatrix}^3 = [0.556 \quad 0.444]$$

## MINI LIN ALG REVIEW:

$$\begin{cases} 2x_1 - 3x_2 = 1 \\ x_1 + 2x_2 = -1 \end{cases} \rightarrow \begin{bmatrix} 2 & -3 \\ 1 & 2 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} = \begin{bmatrix} 1 \\ -1 \end{bmatrix} \Rightarrow AX = B$$

$$X = A^{-1}B = \begin{bmatrix} -1/7 \\ -3/7 \end{bmatrix}$$

$$\begin{cases} 2x_1 - 3x_2 = 1 \\ x_1 + 2x_2 = -1 \\ 3x_1 - x_2 = 0 \end{cases} \rightarrow \begin{bmatrix} 2 & -3 \\ 1 & 2 \\ 3 & -1 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} = \begin{bmatrix} 1 \\ -1 \\ 0 \end{bmatrix}$$

$$A = \begin{bmatrix} 2 & -3 & 1 \\ 1 & 2 & -1 \\ 3 & -1 & 0 \end{bmatrix} \quad X = \text{PROF}(A) = \begin{bmatrix} -1/7 \\ -3/7 \end{bmatrix}$$

↑  
BUTTON IN  
MATRIX > MATH