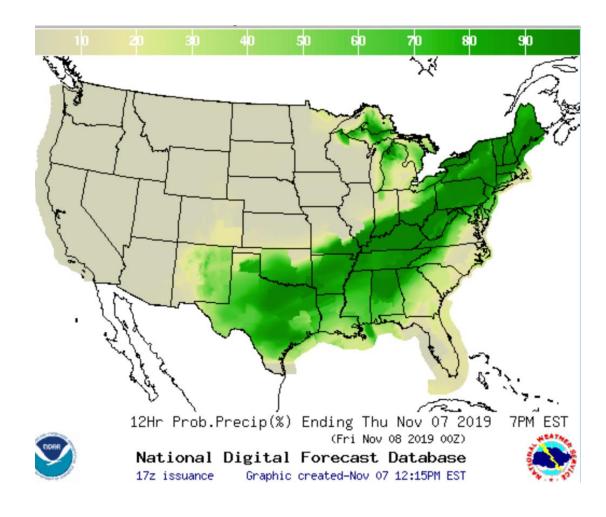
# What does it mean when the chance of rain is 60% in the next 12 hours?

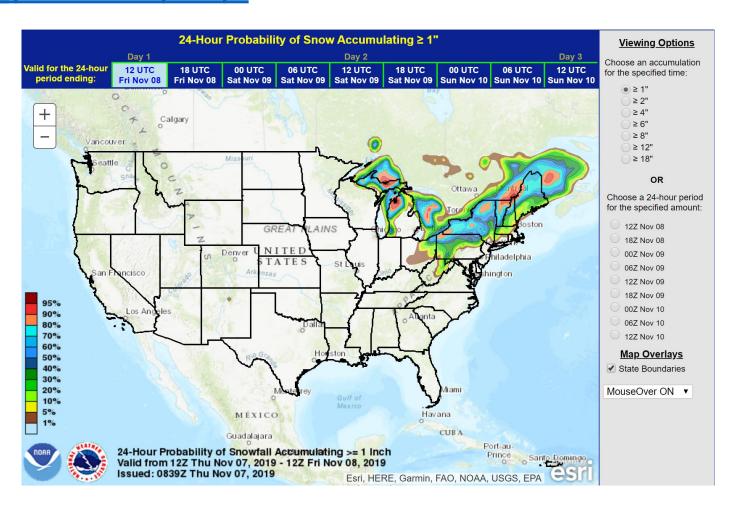
https://graphical.weat her.gov/sectors/conus .php?element=PoP12



# What does it mean when the chance of rain is 60% in the next 12 hours?

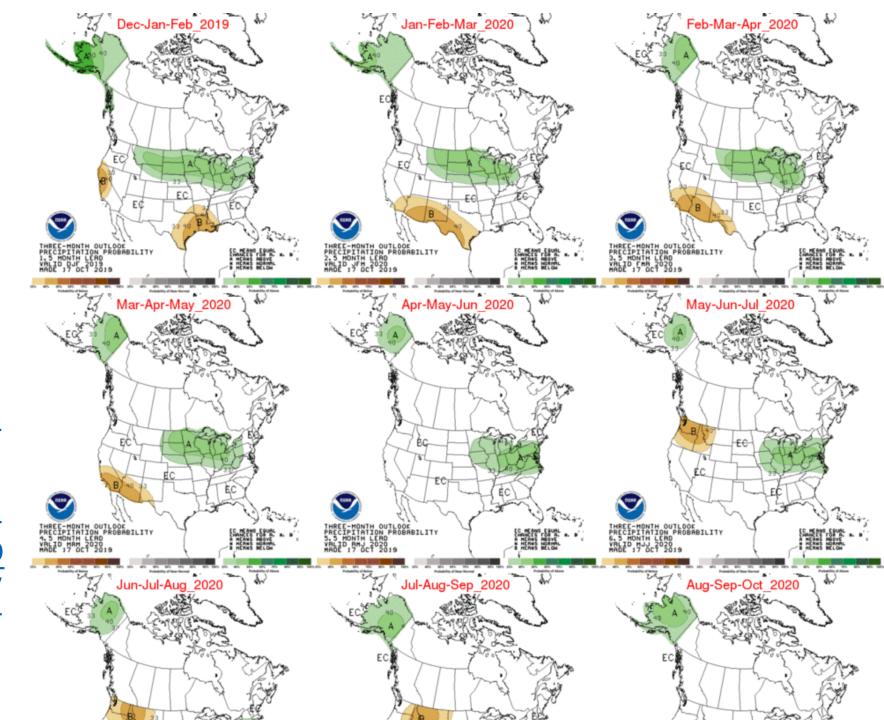
- There is a 60 percent chance that measurable precipitation (0.01 inch) will occur at any given point (grid box) in the area for which the forecast is made in the next 12 hours
- The complicated version that is not really that relevant:
- "Probability of Precipitation" (PoP) describes the chance of precipitation occurring at *any* point within an area.
- PoP =  $C \times A$ 
  - "C" = the confidence that precipitation will occur **somewhere** in the forecast area,
  - "A" = the percent of the area that will receive measureable precipitation, if it occurs at all.
- If the forecaster knows precipitation is sure to occur (confidence is 100%), then indicating that only 60% of the area will receive measurable (>0.01 inch) precipitation
- Or, if expecting precipitation everywhere (A=1), then confidence is only 60% that rain will fall
- But, usually the PoP is a combination of confidence and areal coverage: most of the time, the forecaster is expressing a combination of degree of confidence (say 75%) and areal coverage (80%)

# https://www.wpc.ncep.noaa.gov/pwpf/wwdaccum probs.php

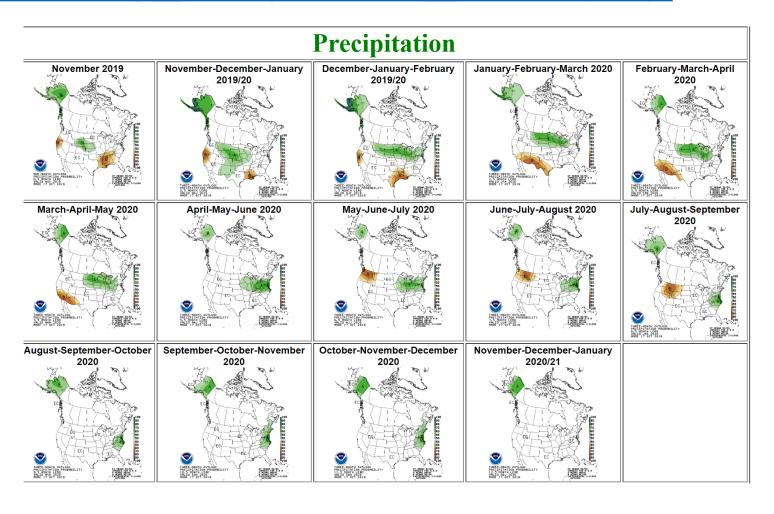


3 month outlooks 3 categories: above equal chance below

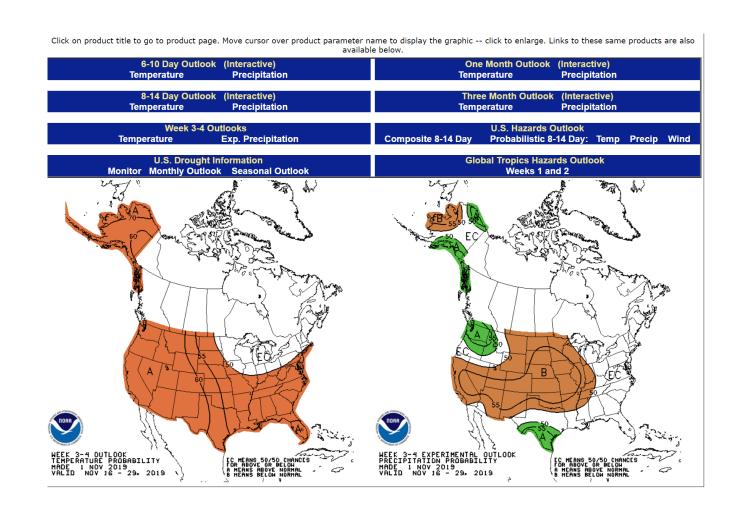
https://www.cpc.nc ep.noaa.gov/produ cts/predictions/mul ti season/13 seaso nal outlooks/color/ p.gif



# https://www.cpc.ncep.noaa.gov/products/predictions/long range/two class.php



## https://www.cpc.ncep.noaa.gov/



### Probability Definitions

- Event- possible uncertain outcomes
- Null event- can't happen
- Elementary event- can't be decomposed into other events
- Compound event- decomposable into 2 or more elementary events
- S- sample or event space- all possible elementary events
- Mutually exclusive- two events that can't occur at same time
- MECE- Mutually exclusive and collectively exhaustive- no more than 1 event can occur and at least one event will occur

#### More Definitions

- E- Event
- Pr{E}- probability of Event E; 0≤ Pr{E} ≤ 1
- Pr{E} = 0, event does not occur
- Pr{E} = 1 event occurs

Temperature below	Temperature above
Precipitation below	Precipitation below
Temperature below	Temperature above
Precipitation above	Precipitation above

Figure 4.2. MECE possibilities for seasonal forecasts temperature and precpitation anomalies for a specifilocation.

# Two Statistical Frameworks: Frequency vs. Bayesian

- Frequency- probability of an event is its relative frequency after many trials
- a- number of occurrences of E
- n- number of opportunities for E to take place
- a/n- relative frequency of E occurring
- $Pr\{E\} \rightarrow a/n \text{ as } n \rightarrow \infty$

# Two Statistical Frameworks: Frequency vs. Bayesian

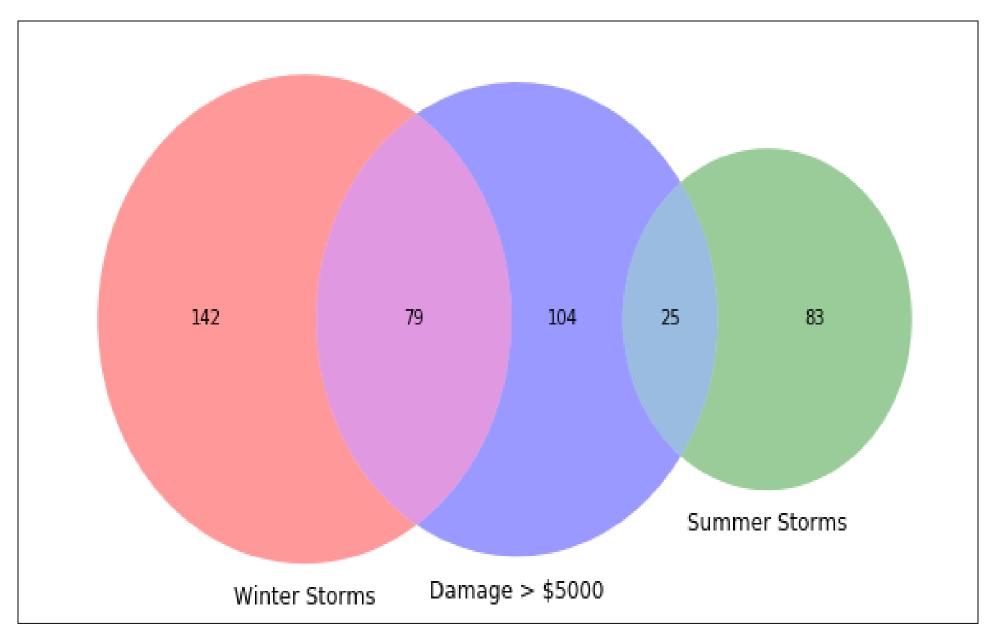
- Bayesian- probability represents the degree of belief of an individual about an outcome of an uncertain event
- Some events occur so rarely that there is no long-term relevant probability
- Two individuals can have different probabilities for same outcome
- Bookies are Bayesian
  - Super Bowl odds 2019: Heavy Patriots money had sportsbooks rooting for Rams

#### Deck of Cards

• If don't look at cards, then the odds of getting any specific card when dealt cards is the same as if you only were dealt one card: they are independent events

Pr{ace}	Pr{10-K}	Pr{2-9}	Pr{21}
7.7	30.8	61.5	4.8

	Tally of	Total	Tally of	Total # of	Observed	Expected	Expected
	occurrences	number of	opportunities	opportunities	probability	Probability	number of
		occurrences	(2 x number	(n)	a/n *100	from Part 1	outcomes if n
		(a)	of hands)		(%)	(%)	opportunities
ace				20		7.7	1.5
10-K				20		30.8	6
2-9				20		61.5	12
21				10		4.8	.5



Number of Opportunities: 2340 (180 days \* 13 years)

### More concepts

- {E}<sup>c</sup>- complement of {E}, event does not occur
- $Pr\{E\}^c = 1-\{E\}$
- $Pr\{E_1 \cap E_2\}$  joint probability that  $E_1 \& E_2$  occur
- $Pr\{E_1 \cap E_2\} = 0$  if  $E_1 \& E_2$  are mutually exclusive
- Pr{E<sub>1</sub> U E<sub>2</sub>}- probability that E<sub>1</sub> OR E<sub>2</sub> occur
- $Pr\{E_1 \cup E_2\} = Pr\{E_1\} + Pr\{E_2\} Pr\{E_1 \cap E_2\}$

### Conditional Probability

- Conditional probability: probability of {E<sub>2</sub>} given that {E<sub>1</sub>} has occurred
- $Pr\{E_2 \mid E_1\} = Pr\{E_1 \cap E_2\} / Pr\{E_1\}$
- E<sub>1</sub> is the conditioning event
- If  $E_1$  and  $E_2$  are independent of each other, then  $Pr\{E_2 \mid E_1\} = Pr\{E_2\}$  and  $Pr\{E_1 \mid E_2\} = Pr\{E_1\}$
- Fair coin- Pr{heads} = 0.5
  - chance of getting heads on second toss is independent of the first Pr{heads | heads} = 0.5
     Pr{heads} twice = 0.5 \* 0.5 = .25

## Bayes Theorem

- $Pr\{E_2 \mid E_1\} = Pr\{E_1 \cap E_2\} / Pr\{E_1\}$
- E<sub>1</sub> is the conditioning event
- What is the advantage? Probability of conditioning event E<sub>1</sub> only computed once
- $Pr\{E_1 \mid E_2\} = Pr\{E_2 \mid E_1\} * Pr\{E_1\} / Pr\{E_2\}$
- $Pr\{E_1 \cap E_2\} = Pr\{E_2 \mid E_1\} * Pr\{E_1\}$
- $Pr\{E_1 \cap E_2\} = Pr\{E_1 \mid E_2\} * Pr\{E_2\}$  then

Bayesian Application: how you should respond to "evidence"

	Pos Test	Neg Test	TOTAL
DRUG USER	0.495%	0.005%	0.5%
NOT DRUG USER	.995%	98.505%	99.5%
TOTAL	1.49%	98.51%	1

How many drug users test positive? 99%
Out of a ten thousand people, how many drug users do they catch? .00495\*10000=~50

What are odds of falsely accusing non drug user?

E₁ – not drug user

E<sub>2</sub> - positive test

 $Pr\{E_1\} - 99.5\%$ 

 $Pr\{E_2\} - 1.49\%$ 

 $Pr\{E_2 \mid E_1\} - .995\%$ 

 $Pr\{E_1 \mid E_2\} = Pr\{E_2 \mid E_1\} * Pr\{E_1\} / Pr\{E_2\} = 0.995 * 99.5 / 1.49 = 68\%$ 

- If you are a non drug user, you have a 68% chance of getting a "false positive"
- How many non-drug users get falsely accused?.00995\*10000=~100

Conclusion: always always ask for second opinion if clean and test positive

# Application of Bayes theorem: how to be rational responding to probabilities

	Pos Test	Neg Test	TOTAL
DRUG USER	0.495%	0.005%	0.5%
NOT DRUG USER	.995%	98.505%	99.5%
TOTAL	1.49%	98.51%	1

What are odds of a drug user skating?

E₄ – drug user

E<sub>3</sub> - negative test

 $Pr{E_3} - 98.51\%$ 

 $Pr\{E_4\} - 0.5\%$ 

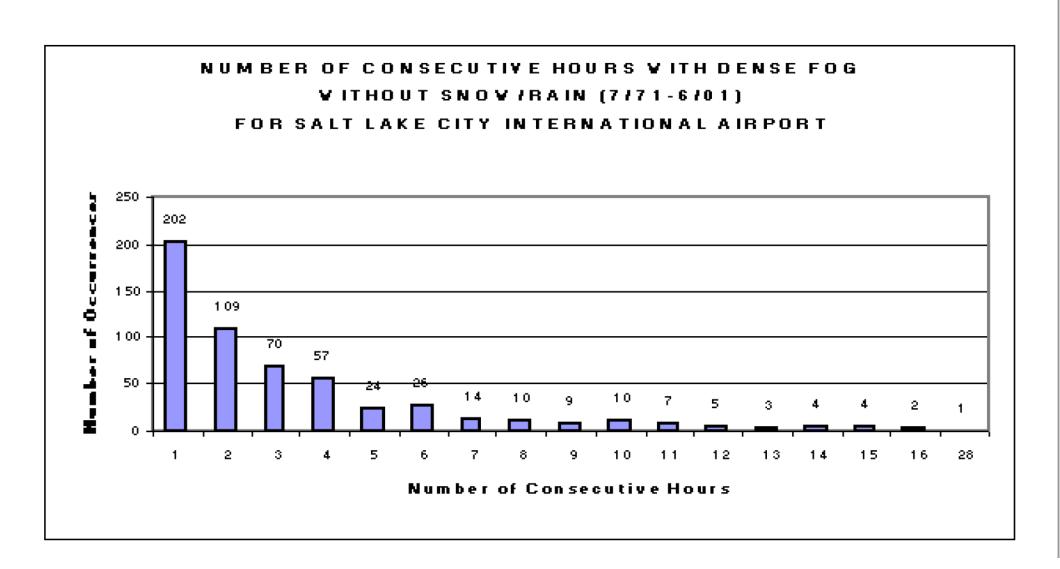
 $Pr\{E_3 \cap E_4\} - .005\%$ 

 $Pr{E_4 | E_3} = Pr{E_4 \cap E_3} / Pr{E_3} = 0.005 / 98.51 = .0051\%$ 

Out of 10000 people, maybe 1 drug user will test negative Conclusion: people who give drug tests are more interested in making sure drug users are caught than worrying about innocent people being falsely accussed

#### Olympic Fog Climatology

When phenomena are persistent, then "odds" are higher once an event is underway



#### **Forecast Verification**

- What is your reason for doing it?
- (Brier and Allen 1951; Compendium of Meteorology)
  - Administrative: who's blowing the forecasts?
  - Scientific: why do errors happen?
  - Economic: what's the impact of forecast errors?

# What you should be doing

- Read Chapter 2 & 3a Notes
- Assignment 4 due November 8. Finish it today
- Assignment 5 Extra Credit . Due Nov. 15

## Measures oriented: "give me a number!"

Distill set of forecasts and observations into small # of metrics

		Observed	Observed	Forecast marginal totals
		Yes	No	
Forecast	Yes	а	b	a+b
Forecast	No	С	d	c+d
	Observed marginal totals	a+c	b+d	n=a+b+c+d sample size

• PC = percent correct = 
$$\frac{a+d}{n}$$

• FAR = false alarm ratio = 
$$\frac{b}{a+b}$$

• TS = CSI = 
$$\frac{a}{a+b+c}$$

• POD = HR = 
$$\frac{a}{a+c}$$

# What if it just happened by chance?

		Observed	Observed	Forecast marginal totals
		Yes	No	
Forecast	Yes	а	b	a+b
Forecast	No	С	d	c+d
	Observed marginal totals	a+c	b+d	n=a+b+c+d sample size

- Random correct yes forecast by chance =  $\frac{(a+b)}{n} \frac{(a+c)}{n}$
- Random correct no forecast by chance =  $\frac{(b+d)}{n} \frac{(c+d)}{n}$
- $SS = \frac{(correct forecasts random correct forecasts)}{(total forecasts random correct forecasts)}$

$$\bullet \quad HSS = \frac{2(ad-bc)}{(a+c)(b+d)+(a+b)(b+d)}$$

### Verifying wind forecasts

		Observed	Observed	Forecast Marginal totals
		≥ 5m/s	<5 m/s	
Forecast	≥ 5m/s	11	6	17
Forecast	<5 m/s	16	44	60
	Observed Marginal totals	27	50	77

PC= 71.4%; FAR= 35.3%; TS= 33.3%; and POD = 40.7%

randomly correct yes forecast: 7.7%

randomly correct no forecast: 50.1%

HSS= 31.4%

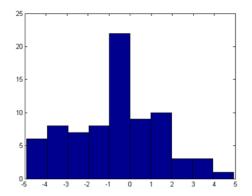
#### Distributions oriented: "how close am I?"

- Assessing the characteristics of joint distribution of errors
- Categorize errors: which errors are smallest, which are biggest as a function of the range of values?
- Relies heavily on conditional probabilities
- http://meso1.chpc.utah.edu/jfsp/

#### Forecast Verification

- http://meso1.chpc.utah.edu/jfsp/
- Select Wildfires by WFO
- Select SLC
- Look at over all years, then focus on wildfires in Utah in 2016
- Then follow along in class

#### Assessing Forecast Accuracy



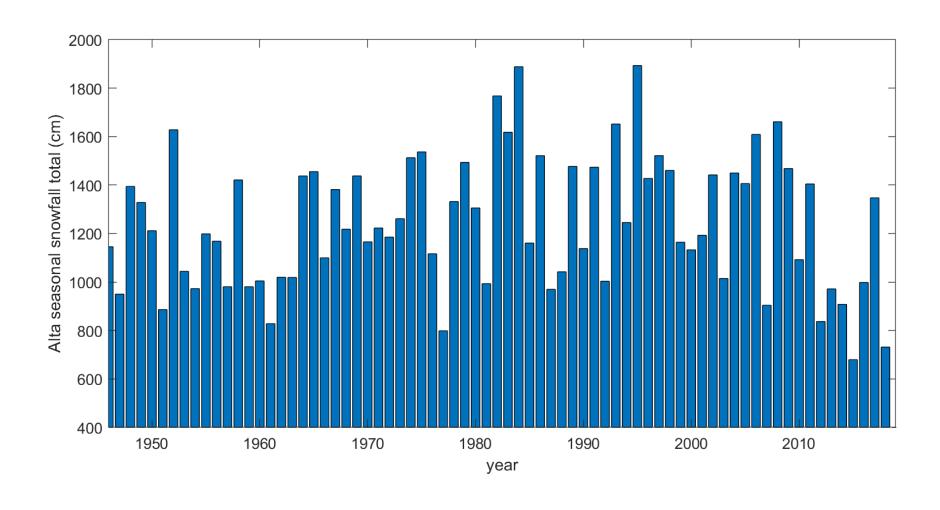
		Observed	Observed	Observed	Error Marginal totals
		≤3 m/s	3-6 m/s	≥6 m/s	
Error	≤ -2 m/s	0	10	11	21
Error	± 2 m/s	22	20	7	49
Error	> 2 m/s	0	7	0	7
	Observed Marginal totals	22	37	18	77

- 26% of the forecasts were within 2 m/s when the wind speeds were between 3 and 6 m/s (20/77)
- Given that the observed wind speed is greater than 6 m/s: (Pr{E<sub>1</sub>} = 18/77= 23.4%)
- Probability that the forecasters predict strong winds to be too light  $Pr\{E_2 \mid E_1\}$ :  $Pr\{E_2 \mid E_1\} = Pr\{E_1 \cap E_2\} / Pr\{E_1\} = ((11/77)/(18/77)) = 64.7\%$

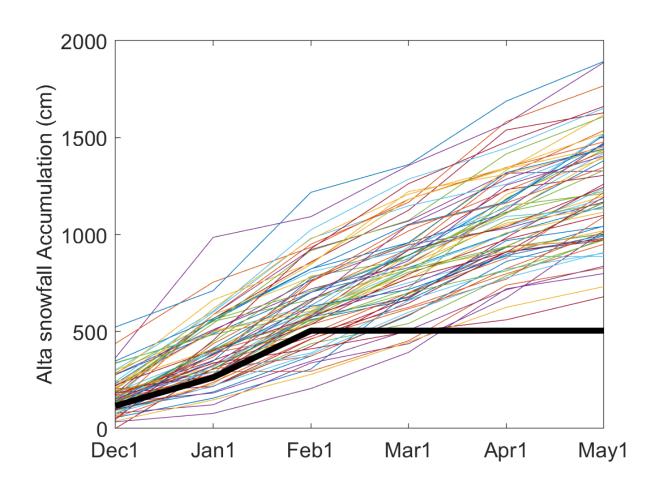
What can we say about estimating this winter's snow total will be?

- What physically is happening?
- Could we use last winter's snow total to predict this winter's?
  - Persistence from one year to next
- What about the amount of snow earlier this winter or right now?
  - Persistence from one month to the next...

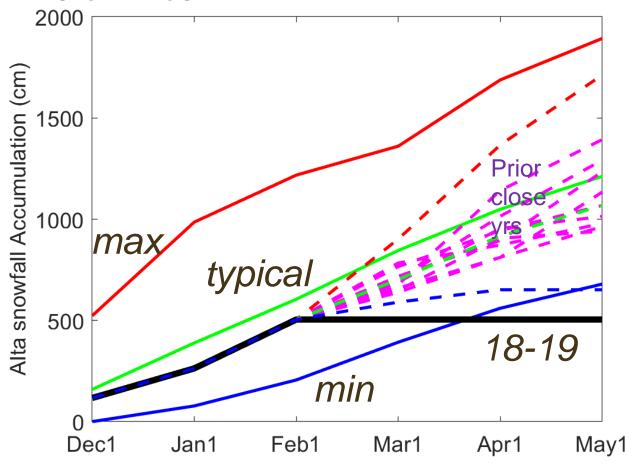
#### Alta Snowfall Seasonal Totals



#### Atla Snowfall Accumulation Each Winter



# How Much Snow Might Accumulate During the Season at Alta?



### Predict May 1 Snowfall from Dec 1 Snowfall

Case 1. Predictor: Dec1 total snowfall (cm)						
Predictand: May 1 Total		Below	Near	Above	Marginal Totals	
snowfall at Alta (cm)	Below	14	9	1	24	
	Near	6	9	10	25	
	Above	4	7	13	24	
	Marginal Totals	24	25	24	73	

## Predict May 1 Spay fall from Dag 1 Spay wfall

Pr{E <sub>1</sub> }	24/73=33%	$Pr\{M_3 \mid E_3\}$	13/24=54%
$Pr\{E_1 \cap E_2\}$	0	$Pr\{E_1 \mid M_1\}$	14/24=58%
$Pr\{E_1 \cap M_1\}$	14/73=19%	Pr{E <sub>2</sub>   M <sub>1</sub> }	9/24=38%
$Pr{E_1 \cap M_3}$	4/73= 5%	Pr{E <sub>3</sub>   M <sub>1</sub> }	1/24=4%
Pr{M <sub>1</sub>   E <sub>1</sub> }	14/24=58%	Pr{E <sub>3</sub>   M <sub>3</sub> }	13/24=54%
Pr{M <sub>3</sub>   E <sub>1</sub> }	4/24=17%	$Pr{E_1 \cap M_1}$ IF random	9/72=11%
Pr{M <sub>3</sub>   E <sub>2</sub> }	7/24=29%	% May 1 total same as Predictor	36/73= 49%

# Predict May 1 Snowfall from Last Year's May 1 Snowfall

Case 6. Predicto	r: May1 Prior	Year total sr	nowfall (cm)		
Predictand: May 1 Total snowfall at Alta (cm)		Below	Near	Above	Marginal Totals
(333)	Below	10	7	7	24
	Near	5	12	7	24
	Above	8	6	10	24
	Marginal Totals	23	25	24	72