# Hidden Markov Model

CSE 467: Pattern Recognition

### Let,

Bob and Alice are two friends

Bob's mood changes based on weather

If it is sunny, bob is happy

If it is rainy, bob is grumpy

Alice is in a different place from Bob

Bob says to Alice via phone that he is happy today and Alice predicts today is sunny

Bob says to Alice via phone that he is grumpy today and Alice predicts today is rainy

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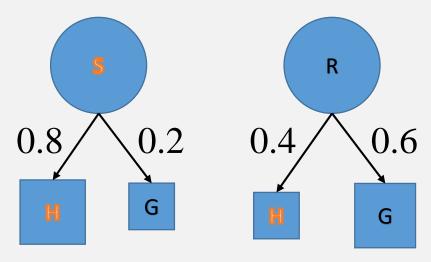
Bob says to Alice via phone that he is grumpy today and Alice predict today is rainy

Let,

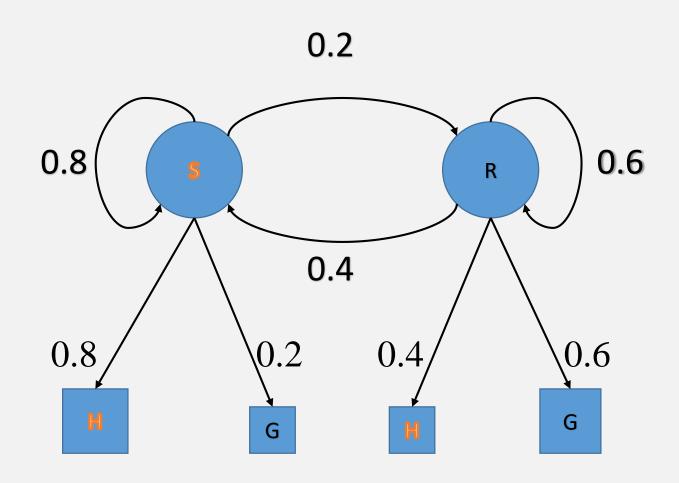
Bob is mostly happy when the weather is sunny, but there is some exception

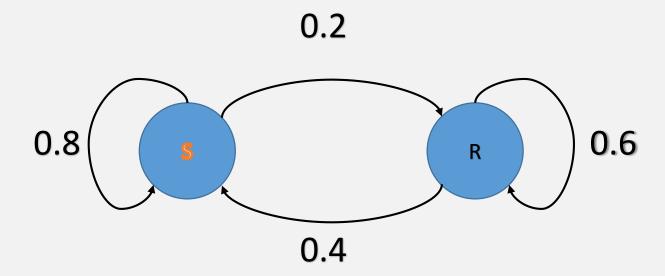
Bob is mostly grumpy when the weather is rainy, but there is some

exception



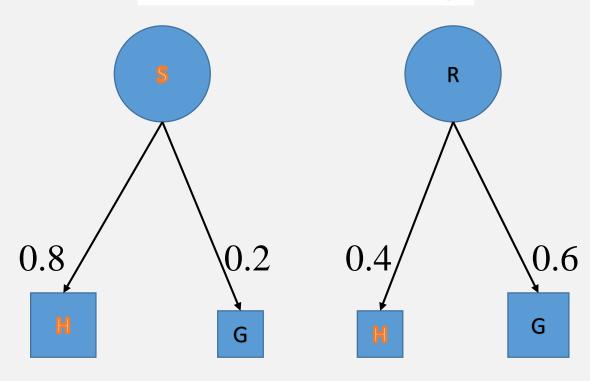
	Sat	Sun	Mon	Tue	Wed	Thurs	Fri
Bob Says	Н	G	Н	G	Н	G	Н
Alice Predict	S	R	S	R	S	R	S



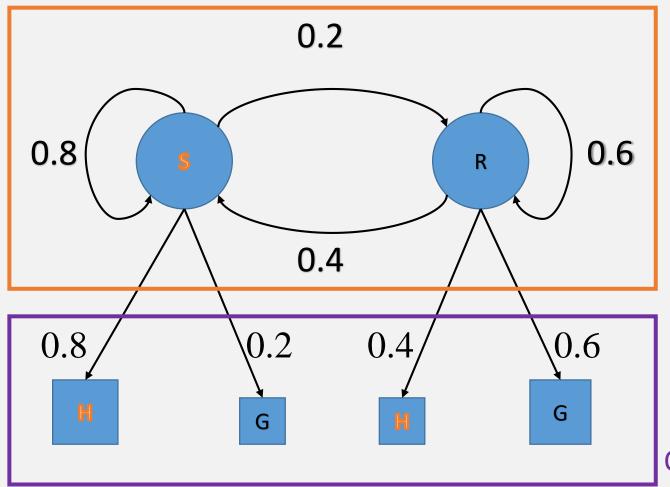


**Transition Probability** 

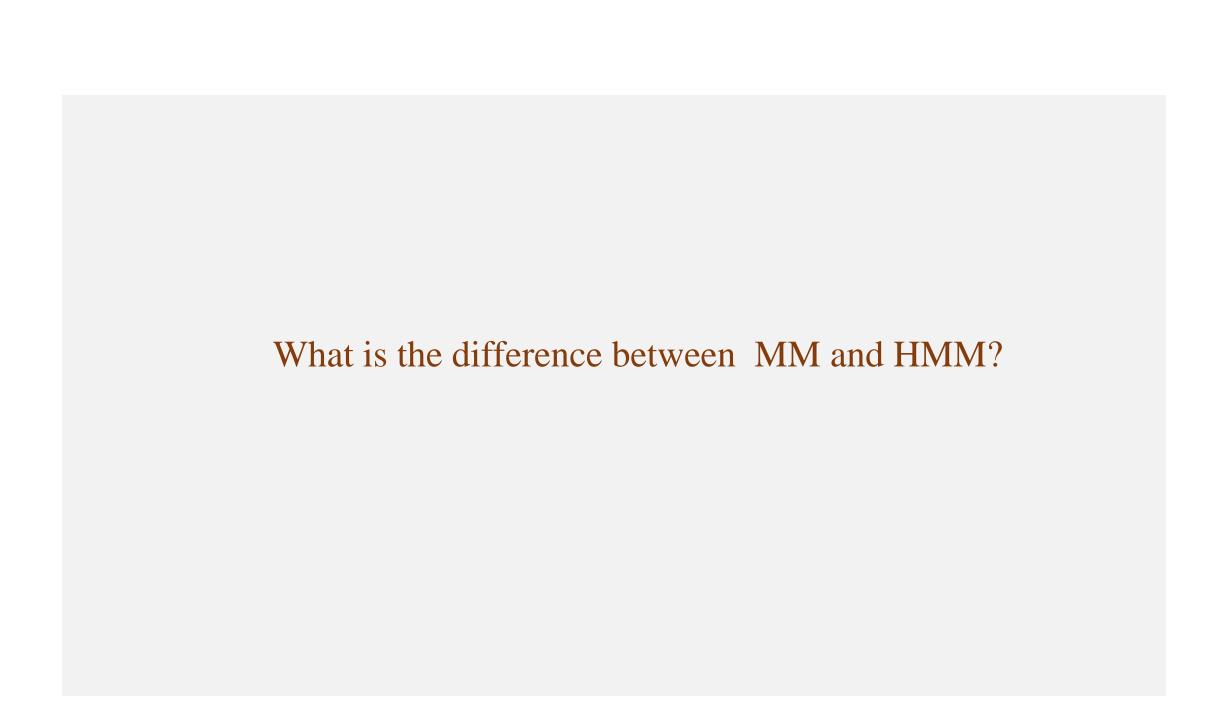
# **Emission Probability**







Observation



### 4 Questions:

- How to calculate the probabilities?
- What is the probability that a random day is sunny or rainy?
- If Bob is happy today, what is the probability that it's sunny or rainy today?
- If for three days Bob is happy, grumpy, happy, what was the weather?

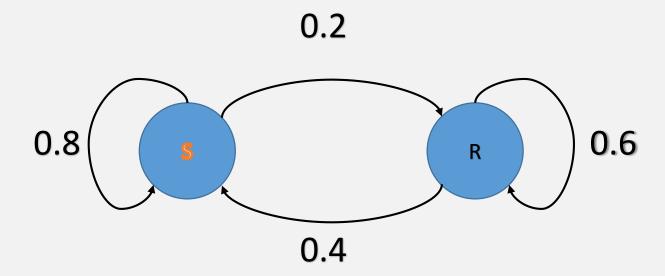
# How to calculate the probabilities?

# From the previous data:

S	S	S	S	R	R	R	S	S	S	S	R	R	S	S	S
G	Н	Н	Н	G	G	Ι	G	Н	Н	Η	G	Ι	Ι	Ι	

Total Sunny (S) = 10Total Rainy (R) = 5

	S	R
S	8/10	2/10
R	2/5	3/5



**Transition Probability** 

# How to calculate the probabilities?

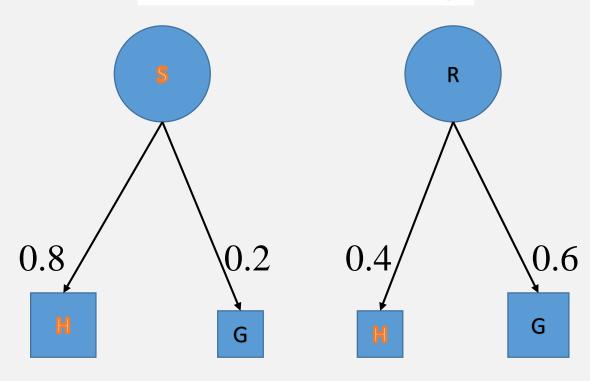
# From the previous data:

S	S	S	S	R	R	R	S	S	S	S	R	R	S	S	
G	Н	Н	Н	G	G	Ι	G	Н	Н	Н	G	Н	Ι	Ι	

Total Sunny (S) = 10Total Rainy (R) = 5

	Н	G
S	8/10	2/10
R	2/5	3/5

# **Emission Probability**



# What is the probability that a random day is sunny or rainy?

From the previous data:

Total Sunny 
$$(S) = 10$$

Total Rainy 
$$(R) = 5$$

So, 
$$P(S) = 10/15 = 2/3$$

$$P(R) = 5/15 = 1/3$$

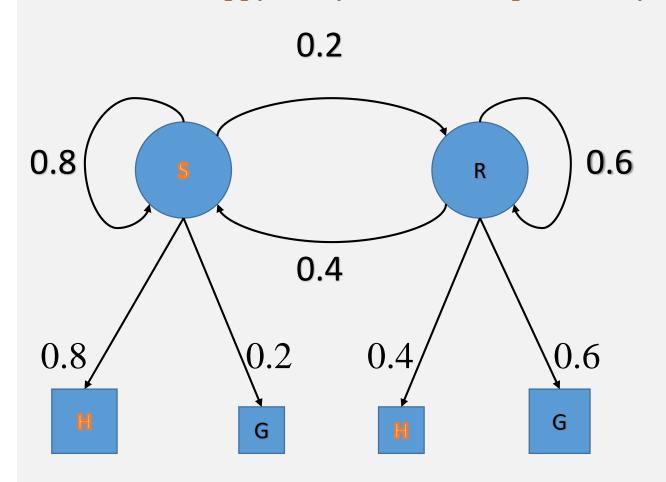
If Bob is happy today, what is the probability that it's sunny or rainy today? Recall Bayes Theorem,

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

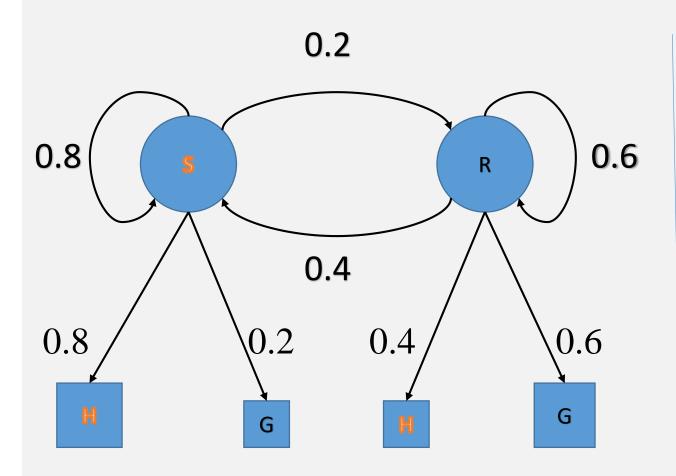
We have to find out P(S|H) and P(R|H).

We can write, 
$$P(S|H) = \frac{P(H|S)P(S)}{P(H)}$$

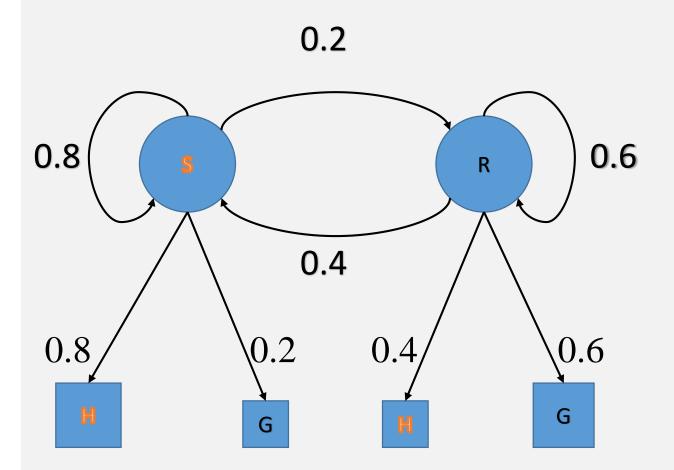
$$P(H|S) = ?$$
  
 $P(S) = ?$   
 $P(H) = ?$ 



$$P(H|S) = 0.8$$
  
 $P(S) = 2/3$   
 $P(H) = ?$   
Easy to find out!



From dataset, P(H)=10/15=2/3



Is it possible to find out P(H) from the diagram at left side? If it is not possible to find it out from the diagram, then which diagram can help us?

$$P(S|H) = \frac{P(H|S)P(S)}{P(H)}$$

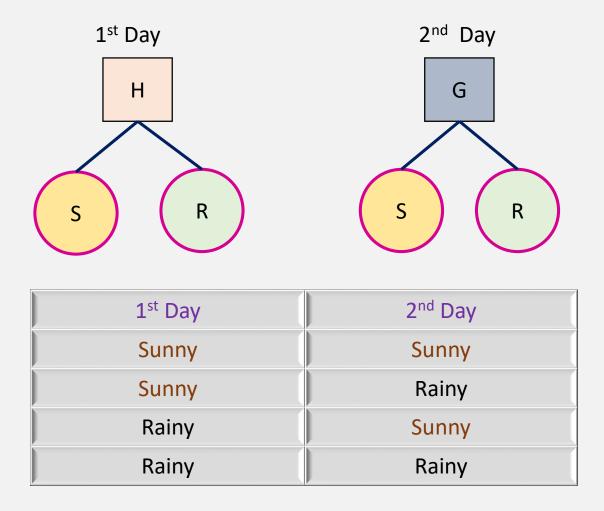
$$=\frac{\frac{4}{5} * \frac{2}{3}}{\frac{2}{3}} = \frac{4}{5}$$

$$P(H|S) = \frac{4}{5}$$

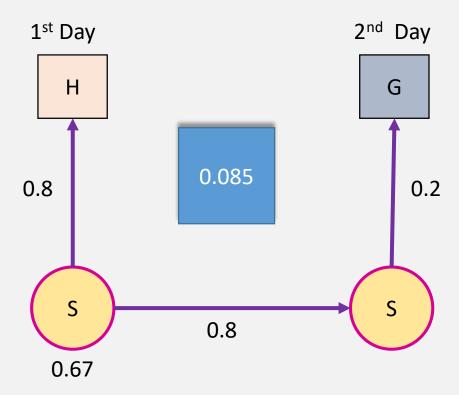
$$P(S) = \frac{2}{3}$$

$$P(H) = \frac{2}{3}$$

### If for two days Bob is happy, grumpy, what was the weather?

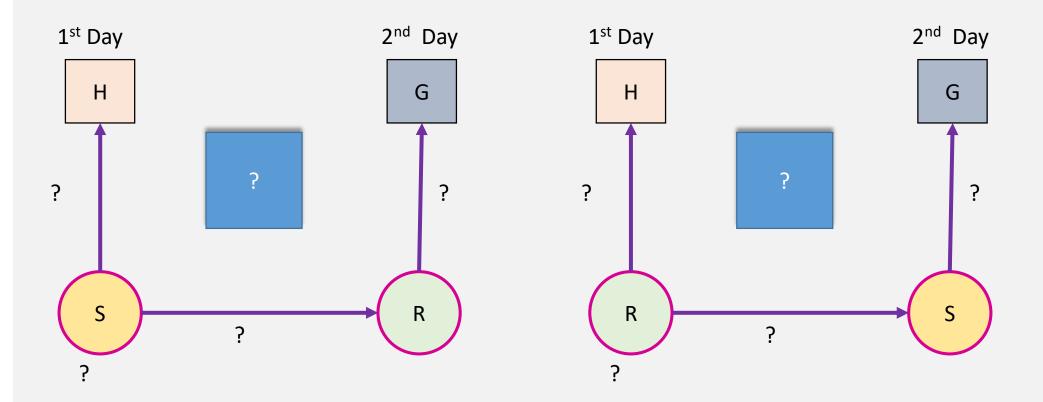


#### If for two days Bob is happy, grumpy, what was the weather?



Using the conditional probability, the probability of the whole thing (denoted in the blue box) is the product of all the probabilities.

### If for two days Bob is happy, grumpy, what was the weather?



**Another Combination?** 

If for three days Bob is happy, grumpy, happy, what was the weather?

