

# POMDP PART 1

## 2019121010

X = 0.89

Y = 1

P(o = red | state = red) = 0.80

P(o = green | state = green) = 0.95

States = ['R', 'R', 'G', 'G', 'R']

Initial Belief state = [0.33, 0.33, 0, 0, 0.33]

$$b'(s_j) = P(s_j | o, a, b) = \frac{P(o | s_j, a) \sum_{s_i \in S} P(s_j | s_i, a) b(s_i)}{\sum_{s_j \in S} P(o | s_j, a) \sum_{s_i \in S} P(s_j | s_i, a) b(s_i)}$$

The above formula is used to calculate the next belief state.

In the below calculations the meaning of the terms are as follows:

**b = belief state probability for a state**

**obs = probability of observing the given observation in that state**

**trans = transition probability**

**answer = multiplication of above three**

Now there are three actions that we take:-

1. Agent took action **Right** and observed **Red**

**calculating denominator**

**From s1**

To s1

b = 0.33000, obs = 0.80000, trans = 0.11000 answer=0.02904

To s2

b = 0.33000, obs = 0.80000, trans = 0.89000 answer=0.23496

To s3

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

To s4

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

To s5

b = 0.33000, obs = 0.80000, trans = 0.00000 answer=0.00000

Sum -> 0.264

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### **From s2**

To s1

b = 0.33000, obs = 0.80000, trans = 0.11000 answer=0.02904

To s2

b = 0.33000, obs = 0.80000, trans = 0.00000 answer=0.00000

To s3

b = 0.33000, obs = 0.05000, trans = 0.89000 answer=0.01469

To s4

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

To s5

b = 0.33000, obs = 0.80000, trans = 0.00000 answer=0.00000

Sum -> 0.043725

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### **From s3**

To s1

b = 0.00000, obs = 0.80000, trans = 0.00000 answer=0.00000

To s2

b = 0.00000, obs = 0.80000, trans = 0.11000 answer=0.00000

To s3

b = 0.00000, obs = 0.05000, trans = 0.00000 answer=0.00000

To s4

b = 0.00000, obs = 0.05000, trans = 0.89000 answer=0.00000

To s5

b = 0.00000, obs = 0.80000, trans = 0.00000 answer=0.00000

Sum -> 0.0

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#### **From s4**

To s1

b = 0.00000, obs = 0.80000, trans = 0.00000 answer=0.00000

To s2

b = 0.00000, obs = 0.80000, trans = 0.00000 answer=0.00000

To s3

b = 0.00000, obs = 0.05000, trans = 0.11000 answer=0.00000

To s4

b = 0.00000, obs = 0.05000, trans = 0.00000 answer=0.00000

To s5

b = 0.00000, obs = 0.80000, trans = 0.89000 answer=0.00000

Sum -> 0.0

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#### **From s5**

To s1

b = 0.33000, obs = 0.80000, trans = 0.00000 answer=0.00000

To s2

b = 0.33000, obs = 0.80000, trans = 0.00000 answer=0.00000

To s3

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

To s4

b = 0.33000, obs = 0.05000, trans = 0.11000 answer=0.00181

To s5

b = 0.33000, obs = 0.80000, trans = 0.89000 answer=0.23496

Sum -> 0.236775

**Denominator -> 0.5445**

**For s1 :-**

calculating numerator

**To s1**

b = 0.33, obs = 0.8, trans = 0.11 answer=0.02904

**To s2**

b = 0.33, obs = 0.8, trans = 0.11 answer=0.02904

**To s3**

b = 0, obs = 0.8, trans = 0 answer=0.0

**To s4**

b = 0, obs = 0.8, trans = 0 answer=0.0

**To s5**

b = 0.33, obs = 0.8, trans = 0 answer=0.0

**Numerator -> 0.0290399 + 0.0290399 = 0.05808**

Numerator / denominator = 0.10666

**B'[s1'] = 0.10666**

**For s2:-**

calculating numerator

**To s1**

b = 0.33000, obs = 0.80000, trans = 0.89000 answer=0.23496

**To s2**

b = 0.33000, obs = 0.80000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.00000, obs = 0.80000, trans = 0.11000 answer=0.00000

**To s4**

b = 0.00000, obs = 0.80000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.33000, obs = 0.80000, trans = 0.00000 answer=0.00000

numerator -> 0.23496

Numerator/Denominator = 0.4315151515151515

**B'[s2] = 0.4315151515151515**

**For s3:-**

calculating numerator

**To s1**

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.33000, obs = 0.05000, trans = 0.89000 answer=0.01469

**To s3**

b = 0.00000, obs = 0.05000, trans = 0.00000 answer=0.00000

**To s4**

b = 0.00000, obs = 0.05000, trans = 0.11000 answer=0.00000

**To s5**

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

**Numerator** -> 0.014685

Numerator/Denominator = 0.02696969696969697

B'[s3] = 0.02696969696969697

**For s4:-**

calculating numerator

**To s1**

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.33000, obs = 0.05000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.00000, obs = 0.05000, trans = 0.89000 answer=0.00000

**To s4**

b = 0.00000, obs = 0.05000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.33000, obs = 0.05000, trans = 0.11000 answer=0.00181

Numerator -> 0.0018149999999999998

Numerator/Denominator = 0.0033333333333333333

B'[s4] = 0.0033333333333333333

**For s5:-**

calculating numerator

**To s1**

$b = 0.33000$ ,  $obs = 0.80000$ ,  $trans = 0.00000$   $answer=0.00000$

**To s2**

$b = 0.33000$ ,  $obs = 0.80000$ ,  $trans = 0.00000$   $answer=0.00000$

**To s3**

$b = 0.00000$ ,  $obs = 0.80000$ ,  $trans = 0.00000$   $answer=0.00000$

**To s4**

$b = 0.00000$ ,  $obs = 0.80000$ ,  $trans = 0.89000$   $answer=0.00000$

**To s5**

$b = 0.33000$ ,  $obs = 0.80000$ ,  $trans = 0.89000$   $answer=0.23496$

Numerator  $\rightarrow 0.23496$

Numerator/Denominator =  $0.4315151515151515$

$B'[s5] = 0.4315151515151515$

**The Updated Belief state is as follows:-**

**[0.10666666666666666, 0.4315151515151515, 0.02696969696969697, 0.003333333333333333, 0.4315151515151515]**

**2. Agent took action LEFT and observed GREEN**

Calculating denominator

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**From s1**

To s1

$b = 0.10667$ ,  $obs = 0.20000$ ,  $trans = 0.89000$   $answer=0.01899$

To s2

$b = 0.10667$ ,  $obs = 0.20000$ ,  $trans = 0.11000$   $answer=0.00235$

To s3

$b = 0.10667$ ,  $obs = 0.95000$ ,  $trans = 0.00000$   $answer=0.00000$

To s4

b = 0.10667, obs = 0.95000, trans = 0.00000 answer=0.00000  
To s5

b = 0.10667, obs = 0.20000, trans = 0.00000 answer=0.00000  
sum -> 0.021333333333333333

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### **From s2**

To s1

b = 0.43152, obs = 0.20000, trans = 0.89000 answer=0.07681

To s2

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000

To s3

b = 0.43152, obs = 0.95000, trans = 0.11000 answer=0.04509

To s4

b = 0.43152, obs = 0.95000, trans = 0.00000 answer=0.00000

To s5

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000

sum -> 0.12190303030303029

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### **From s3**

To s1

b = 0.02697, obs = 0.20000, trans = 0.00000 answer=0.00000

To s2

b = 0.02697, obs = 0.20000, trans = 0.89000 answer=0.00480

To s3

b = 0.02697, obs = 0.95000, trans = 0.00000 answer=0.00000

To s4

b = 0.02697, obs = 0.95000, trans = 0.11000 answer=0.00282

To s5

b = 0.02697, obs = 0.20000, trans = 0.00000 answer=0.00000

sum -> 0.007618939393939393

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### **From s4**

To s1

b = 0.00333, obs = 0.20000, trans = 0.00000 answer=0.00000  
To s2

b = 0.00333, obs = 0.20000, trans = 0.00000 answer=0.00000  
To s3

b = 0.00333, obs = 0.95000, trans = 0.89000 answer=0.00282  
To s4

b = 0.00333, obs = 0.95000, trans = 0.00000 answer=0.00000  
To s5

b = 0.00333, obs = 0.20000, trans = 0.11000 answer=0.00007  
sum -> 0.002891666666666666

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### **From s5**

To s1

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000  
To s2

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000  
To s3

b = 0.43152, obs = 0.95000, trans = 0.00000 answer=0.00000  
To s4

b = 0.43152, obs = 0.95000, trans = 0.89000 answer=0.36485  
To s5

b = 0.43152, obs = 0.20000, trans = 0.11000 answer=0.00949  
sum -> 0.37433939393939397

Denominator -> 0.5280863636363636

### **For s1:-**

Calculating Numerator

**To s1**

b = 0.10667, obs = 0.20000, trans = 0.89000 answer=0.01899

**To s2**

b = 0.43152, obs = 0.20000, trans = 0.89000 answer=0.07681

**To s3**

b = 0.02697, obs = 0.20000, trans = 0.00000 answer=0.00000



**To s4**

b = 0.00333, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000

Numerator -> 0.09579636363636364

Numerator/Denominator = 0.181402835280042

B'[s1] = 0.181402835280042

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**For s2:-**

calculating numerator

**To s1**

b = 0.10667, obs = 0.20000, trans = 0.11000 answer=0.00235

**To s2**

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.02697, obs = 0.20000, trans = 0.89000 answer=0.00480

**To s4**

b = 0.00333, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000

Numerator -> 0.007147272727272727

Numerator/Denominator = 0.013534287607915372

B'[s2] = 0.013534287607915372

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**For s3:-**

calculating numerator

**To s1**

b = 0.10667, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.43152, obs = 0.95000, trans = 0.11000 answer=0.04509

**To s3**

b = 0.02697, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s4**

b = 0.00333, obs = 0.95000, trans = 0.89000 answer=0.00282

**To s5**

b = 0.43152, obs = 0.95000, trans = 0.00000 answer=0.00000

Numerator -> 0.04791166666666666

Numerator/Denominator = 0.09072695294904126

B'[s3] = 0.09072695294904126

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**For s4:-**

calculating numerator

**To s1**

b = 0.10667, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.43152, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.02697, obs = 0.95000, trans = 0.11000 answer=0.00282

**To s4**

b = 0.00333, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.43152, obs = 0.95000, trans = 0.89000 answer=0.36485

Numerator -> 0.36766439393939393

Numerator/Denominator = 0.6962202004378302

B'[s4] = 0.6962202004378302

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**For s5:-**

calculating numerator

**To s1**

b = 0.10667, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.43152, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.02697, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s4**

b = 0.00333, obs = 0.20000, trans = 0.11000 answer=0.00007

**To s5**

b = 0.43152, obs = 0.20000, trans = 0.11000 answer=0.00949

Numerator -> 0.009566666666666666

Numerator/Denominator = 0.018115723725171215

B'[s5] = 0.018115723725171215

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**New Belief state**

[0.181402835280042, 0.013534287607915372, 0.09072695294904126,  
0.6962202004378302, 0.018115723725171215]

**3. Agent took the action Left and observed Green**

calculating denominator

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**From s1**

To s1

b = 0.18140, obs = 0.20000, trans = 0.89000 answer=0.03229

To s2

b = 0.18140, obs = 0.20000, trans = 0.11000 answer=0.00399

To s3

b = 0.18140, obs = 0.95000, trans = 0.00000 answer=0.00000

To s4

b = 0.18140, obs = 0.95000, trans = 0.00000 answer=0.00000

To s5

b = 0.18140, obs = 0.20000, trans = 0.00000 answer=0.00000

sum -> 0.03628056705600839

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**From s2**

To s1

b = 0.01353, obs = 0.20000, trans = 0.89000 answer=0.00241

To s2

b = 0.01353, obs = 0.20000, trans = 0.00000 answer=0.00000

To s3

b = 0.01353, obs = 0.95000, trans = 0.11000 answer=0.00141

To s4

b = 0.01353, obs = 0.95000, trans = 0.00000 answer=0.00000

To s5

b = 0.01353, obs = 0.20000, trans = 0.00000 answer=0.00000

sum -> 0.003823436249236092

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### **From s3**

To s1

b = 0.09073, obs = 0.20000, trans = 0.00000 answer=0.00000

To s2

b = 0.09073, obs = 0.20000, trans = 0.89000 answer=0.01615

To s3

b = 0.09073, obs = 0.95000, trans = 0.00000 answer=0.00000

To s4

b = 0.09073, obs = 0.95000, trans = 0.11000 answer=0.00948

To s5

b = 0.09073, obs = 0.20000, trans = 0.00000 answer=0.00000

sum -> 0.025630364208104155

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### **From s4**

To s1

b = 0.69622, obs = 0.20000, trans = 0.00000 answer=0.00000

To s2

b = 0.69622, obs = 0.20000, trans = 0.00000 answer=0.00000

To s3

b = 0.69622, obs = 0.95000, trans = 0.89000 answer=0.58865

To s4

b = 0.69622, obs = 0.95000, trans = 0.00000 answer=0.00000

To s5

b = 0.69622, obs = 0.20000, trans = 0.11000 answer=0.01532

sum -> 0.6039710238798176

-----  
**From s5**

To s1

b = 0.01812, obs = 0.20000, trans = 0.00000 answer=0.00000

To s2

b = 0.01812, obs = 0.20000, trans = 0.00000 answer=0.00000

To s3

b = 0.01812, obs = 0.95000, trans = 0.00000 answer=0.00000

To s4

b = 0.01812, obs = 0.95000, trans = 0.89000 answer=0.01532

To s5

b = 0.01812, obs = 0.20000, trans = 0.11000 answer=0.00040

sum -> 0.015715390331586025

**Denominator -> 0.6854207817247522**

**For s1:-**

calculating numerator

**To s1**

b = 0.18140, obs = 0.20000, trans = 0.89000 answer=0.03229

**To s2**

b = 0.01353, obs = 0.20000, trans = 0.89000 answer=0.00241

**To s3**

b = 0.09073, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s4**

b = 0.69622, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.01812, obs = 0.20000, trans = 0.00000 answer=0.00000

Numerator -> 0.03469880787405641

Numerator/Denominator = 0.05062409661221883

B'[s1] = 0.05062409661221883  
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**For s2:-**

calculating numerator

**To s1**

b = 0.18140, obs = 0.20000, trans = 0.11000 answer=0.00399

**To s2**

b = 0.01353, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.09073, obs = 0.20000, trans = 0.89000 answer=0.01615

**To s4**

b = 0.69622, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.01812, obs = 0.20000, trans = 0.00000 answer=0.00000

Numerator -> 0.020140260001090267

Numerator/Denominator = 0.02938378954663515

B'[s2] = 0.02938378954663515

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**For s3:-**

calculating numerator

**To s1**

b = 0.18140, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.01353, obs = 0.95000, trans = 0.11000 answer=0.00141

**To s3**

b = 0.09073, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s4**

b = 0.69622, obs = 0.95000, trans = 0.89000 answer=0.58865

**To s5**

b = 0.01812, obs = 0.95000, trans = 0.00000 answer=0.00000

Numerator -> 0.5900685125252125

Numerator/Denominator = 0.8608850625164868

B'[s3] = 0.8608850625164868

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**For s4:-**

calculating numerator

**To s1**

b = 0.18140, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.01353, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.09073, obs = 0.95000, trans = 0.11000 answer=0.00948

**To s4**

b = 0.69622, obs = 0.95000, trans = 0.00000 answer=0.00000

**To s5**

b = 0.01812, obs = 0.95000, trans = 0.89000 answer=0.01532

Numerator -> 0.02479781099280707

Numerator/Denominator = 0.03617895992357764

B'[s4] = 0.03617895992357764  
-----

**For s5:-**

calculating numerator

**To s1**

b = 0.18140, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s2**

b = 0.01353, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s3**

b = 0.09073, obs = 0.20000, trans = 0.00000 answer=0.00000

**To s4**

b = 0.69622, obs = 0.20000, trans = 0.11000 answer=0.01532

**To s5**

b = 0.01812, obs = 0.20000, trans = 0.11000 answer=0.00040

Numerator -> 0.01571539033158603

Numerator/Denominator = 0.02292809140108176

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**New Belief state is:-**

**[0.05062409661221883, 0.02938378954663515, 0.8608850625164868,  
0.03617895992357764, 0.02292809140108176]**