

## 10. id3 Algorithm in Machine Learning Bangla || Decision Tree Classification in Machine Learning

যদি  $\log_2 4$  এর মান,

প্রতি,  $\log_2 4 = \log_2 2^2$

$$= 2 \log_2 2 \quad [\log_2 2 = 1]$$

$$= 2$$

অতএব,  $\log_2 4 = \frac{\log 4}{\log 2}$       সূত্র:  $\log_a b = \frac{\log b}{\log a}$

$$= 2$$

#  $\log_2 \left(\frac{1}{4}\right) = \frac{\log \left(\frac{1}{4}\right)}{\log 2}$       ←

সূত্র:

$$\log \left(\frac{m}{n}\right) = \log m - \log n$$

$$\log_2 \left(\frac{1}{4}\right) = \frac{\log 1 - \log 4}{\log 2}$$

$$= \frac{0 - \log 2^2}{\log 2}$$

$$= -2$$

$$\text{Entropy}(S) = - \sum_{i=1}^n P_i \log_2 P_i$$

$$\text{Gain}(S, A) = \text{Entropy}(S) - \sum_{\text{values}(A)} \frac{|S_v|}{|S|} \times \text{Entropy}(S_v)$$

যদি  $E_A$  পার্টিশনের আগের এন্ট্রপি  $E_A$  হয় এবং  
পরের এন্ট্রপি  $E_B$  হয় তবে আগের  $E_A$  টারগেট  
 $E_A$  ও  $E_B$  এর মধ্যে পার্থক্য যতটা সম্ভব বড় হোক।  
 $\therefore E_A \gg E_B$  করতে হবে।

Activate Windows  
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|    | A      | B   | C           | D      | E         |
|----|--------|-----|-------------|--------|-----------|
| 1  | gender | car | travel cost | income | transport |
| 2  | male   | 0   | cheap       | low    | bus       |
| 3  | male   | 1   | cheap       | medium | bus       |
| 4  | female | 1   | cheap       | medium | train     |
| 5  | female | 0   | cheap       | low    | bus       |
| 6  | male   | 1   | cheap       | medium | bus       |
| 7  | male   | 0   | standard    | medium | train     |
| 8  | female | 1   | standard    | medium | train     |
| 9  | female | 1   | expensive   | high   | car       |
| 10 | male   | 2   | expensive   | medium | car       |
| 11 | female | 2   | expensive   | high   | car       |
| 12 |        |     |             |        |           |
| 13 |        |     |             |        |           |

Entropy Before partition :

$$E(S) = -\left(\frac{4}{10} \log_2 \frac{4}{10} + \frac{3}{10} \log_2 \frac{3}{10} + \frac{3}{10} \log_2 \frac{3}{10}\right)$$

$$= -(-0.528 - 0.521 - 0.521)$$

$$= 1.57$$

Now calculate entropy for each attribute :

$$E(\text{gender\_male}) = -\left(\frac{3}{5} \log_2 \frac{3}{5} + \frac{1}{5} \log_2 \frac{1}{5} + \frac{1}{5} \log_2 \frac{1}{5}\right)$$

$$= -(-0.442 - 0.464 - 0.464)$$

$$= 1.37$$

$$E(\text{gender\_female}) = -\left(\frac{2}{5} \log_2 \frac{2}{5} + \frac{1}{5} \log_2 \frac{1}{5} + \frac{2}{5} \log_2 \frac{2}{5}\right)$$

$$= -(-0.528 - 0.464 - 0.528)$$

$$= 1.52$$

Information Gain  $\rightarrow$  "Gender"

$$1.571 - \left(\left(\frac{5}{10} \times 1.37\right) + \left(\frac{5}{10} \times 1.52\right)\right)$$

$$= 0.125$$

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| 9  | female | 1   | expensive   | high   | car       |
| 10 | male   | 2   | expensive   | medium | car       |
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| 13 |        |     |             |        |           |

$$E(\text{car}-0) = -\left(\frac{2}{3} \log_2 \frac{2}{3} + \frac{1}{3} \log_2 \frac{1}{3}\right)$$

$$= -(-.387 - .528)$$

$$= .915$$

$$E(\text{car}-1) = -\left(\frac{2}{5} \log_2 \frac{2}{5} + \frac{2}{5} \log_2 \frac{2}{5} + \frac{1}{5} \log_2 \frac{1}{5}\right)$$

$$= -(.528 - .528 + .464)$$

$$= 1.52$$

$$E(\text{car}-2) = -\left(\frac{2}{2} \log_2 \frac{2}{2}\right)$$

$$= 0$$

Information Gain: "car"

$$= 1.571 - \left(\left(\frac{2}{10} \times .915\right) + \left(\frac{5}{10} \times 1.52\right) + \left(\frac{2}{10} \times 0\right)\right)$$

$$= 1.571 - (.274 + .76 + 0)$$

$$= .537$$

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| 5  | female | 0   | cheap       | low    | bus       |
| 6  | male   | 1   | cheap       | medium | bus       |
| 7  | male   | 0   | standard    | medium | train     |
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| 9  | female | 1   | expensive   | high   | car       |
| 10 | male   | 2   | expensive   | medium | car       |
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| 13 |        |     |             |        |           |

$$E(\text{cost-cheap}) = -\left(\frac{4}{5} \log_2 \frac{4}{5} + \frac{1}{5} \log_2 \frac{1}{5}\right)$$

$$= -(-.257 + .464)$$

$$= .721$$

$$E(\text{cost-standard}) = -\left(\frac{2}{2} \log_2 \frac{2}{2}\right)$$

$$= 0$$

$$E(\text{cost-Expensive}) = -\left(\frac{3}{3} \log_2 \frac{3}{3}\right)$$

$$= 0$$

Information Gain: "cost"

$$1.57 - \left(\left(\frac{5}{10} \times .721\right) + 0 + 0\right)$$

$$= 1.57 - .36$$

$$= 1.21$$

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| 5  | female | 0   | cheap       | low    | bus       |
| 6  | male   | 1   | cheap       | medium | bus       |
| 7  | male   | 0   | standard    | medium | train     |
| 8  | female | 1   | standard    | medium | train     |
| 9  | female | 1   | expensive   | high   | car       |
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$$E(\text{Income-low}) = -\left(\frac{2}{2} \log_2 \frac{2}{2}\right) = 0$$

$$E(\text{Income-medium}) = -\left(\frac{2}{6} \log_2 \frac{2}{6} + \frac{3}{6} \log_2 \frac{3}{6} + \frac{1}{6} \log_2 \frac{1}{6}\right) = -(-.528 - .5 - .430) = 1.459$$

$$E(\text{Income-High}) = -\left(\frac{2}{2} \log_2 \frac{2}{2}\right) = 0$$

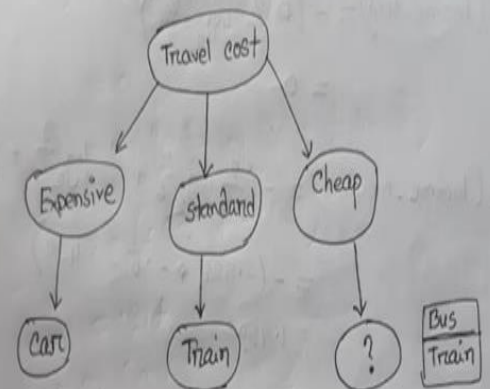
Information gain: "Income"

$$1.571 - \left((0 \times \frac{2}{10}) + \left(\frac{6}{10} \times 1.459\right) + \left(\frac{2}{10} \times 0\right)\right) = 1.571 - .875 = .695$$

| Attributes  | Gain  |
|-------------|-------|
| Gender      | .125  |
| car         | .537  |
| Travel cost | 1.221 |
| Income      | .695  |



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| 6  | male   | 1   | cheap       | medium | bus       |
| 7  | male   | 0   | standard    | medium | train     |
| 8  | female | 1   | standard    | medium | train     |
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| 12 |        |     |             |        |           |
| 13 |        |     |             |        |           |



second iteration → omit Travel cost only for cheap

| Gender | Car | Income | Transport |
|--------|-----|--------|-----------|
| Male   | 0   | Low    | Bus       |
| Male   | 1   | Medium | Bus       |
| Female | 1   | Medium | Train     |
| Female | 0   | Low    | Bus       |
| Male   | 1   | Medium | Bus       |

|   | A      | B   | C      | D         |
|---|--------|-----|--------|-----------|
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| 4 | female | 1   | medium | train     |
| 5 | female | 0   | low    | bus       |
| 6 | male   | 1   | medium | bus       |
| 7 |        |     |        |           |
| 8 |        |     |        |           |

Entropy Before partition:

$$E(s) = - \left( \frac{4}{5} \log_2 \frac{4}{5} + \frac{1}{5} \log_2 \frac{1}{5} \right)$$

$$= - (-0.257 - 0.464)$$

$$= 0.721$$

Now Calculate entropy for each attribute:

$$E(\text{gender\_male}) = - \left( \frac{3}{3} \log_2 \frac{3}{3} \right)$$

$$= 0$$

$$E(\text{gender\_female}) = - \left( \frac{2}{2} \log_2 \frac{1}{2} + \frac{1}{2} \log_2 \frac{1}{2} \right)$$

$$= 1$$

Information Gain: "Gender"

$$0.721 - \left( \left( \frac{2}{5} \times 1 \right) + 0 \right)$$

$$= 0.721 - 0.40$$

$$= 0.321$$

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| 3 | male   | 1   | medium | bus       |
| 4 | female | 1   | medium | train     |
| 5 | female | 0   | low    | bus       |
| 6 | male   | 1   | medium | bus       |
| 7 |        |     |        |           |
| 8 |        |     |        |           |

$$E(\text{car}_0) = -\left(\frac{2}{2} \log_2 \frac{2}{2}\right)$$

$$= 0$$

$$E(\text{car}_1) = -\left(\frac{4}{8} \frac{2}{3} \log_2 \frac{2}{3} + \frac{1}{3} \log_2 \frac{1}{3}\right)$$

$$= -\left(-.389 - .528\right)$$

$$= .917$$

Information Gain : "car"

$$.721 - \left((0) + (.917 \times \frac{2}{5})\right)$$

$$= .721 - .550$$

$$= .170$$

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| 4 | female | 1   | medium | train     |
| 5 | female | 0   | low    | bus       |
| 6 | male   | 1   | medium | bus       |
| 7 |        |     |        |           |
| 8 |        |     |        |           |

$$E(\text{income}_{\text{low}}) = -\left(\frac{2}{2} \log_2 \frac{2}{2}\right)$$

$$= 0$$

$$E(\text{income}_{\text{medium}}) = -\left(\frac{2}{3} \log_2 \frac{2}{3} + \frac{1}{3} \log_2 \frac{1}{3}\right)$$

$$= -(\cdot389 - \cdot528)$$

$$= \cdot917$$

Information Gain: 'income'

$$\cdot721 - (\cdot10) + (\cdot917 \times \frac{3}{5})$$

$$= \cdot170$$

| Attributes | Info Gain   |
|------------|---|
| ✓ Gender   | <u>·922</u>   |
| Car        | ·170  |
| Income     | Activate Windows<br>Go to Settings to activate Windows. |

|   | A      | B   | C      | D         |
|---|--------|-----|--------|-----------|
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| 3 | male   | 1   | medium | bus       |
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