Assignment 3 Solution Manual

Task#1

Steps to implement ID3 on Mushroom Data:

- 1. First of all create a Tree class.
- 2. Then Read data from file.
- 3. Separate the 70% data for training and 30% for testing.
- 4. Now start training on training data.
- 5. Count the number of positive("edible") and negative("poisonous") sample.
- 6. Calculate the "ENTROPY" using these counts.
- 7. Now calculate the counts of all existed values in each attribute.
- 8. Calculate the "AVERAGE ENTROPY" using all counts.
- 9. Now calculate the "GAIN" of each attribute by subtracting average entropy from entropy.
- 10. Which attribute has highest gain will become root of our tree.
- 11. Now divide the data into count of variety of attribute the root contain.
- 12. Now repeat process from (5) for the further children this will results a Decision Tree.
- 13. Now test the testing data on the Decision Tree to get the Accuracy.

Decision Tree:

odor

almond: edible

anise: edible

creosote: poisonous

fishy: poisonous

foul: poisonous

musty: poisonous

none: spore-print-color

black: edible

brown: edible

buff: edible

chocolate: edible

green: poisonous

orange: edible

white: habitat

grasses: edible

leaves: population

clustered: poisonous

several: edible

paths: edible

waste: edible

woods: ring-type

evanescent: poisonous

pendant: edible

yellow: edible

pungent: poisonous

spicy: poisonous

Accuracy:

Accuracy of Classifier is 100%.

Output Screen Shot:

```
:\Users\Adeel\Desktop\AI>python task1.py
  almond: edible
  anise: edible
  creosote: poisonous
   fishy: poisonous
  foul: poisonous
   musty: poisonous
   none: spore-print-color
                             black: edible
                             brown: edible buff: edible
                             chocolate: edible
green: poisonous
                             orange: edible white: habitat
                                              grasses: edible
                                              leaves: population
                                                                  clustered: poisonous
                                                                  several: edible
                                             paths: edible
                                              waste: edible
                                              woods: ring-type
                                                                evanescent: poisonous
                                                                pendant: edible
                             yellow: edible
  pungent: poisonous
spicy: poisonous
ccuracy of Classifier is 100.00%
```

Task#2

Steps to implement Naïve Bayes on Mushroom Data:

- 1. Read data from file.
- 2. Separate the 70% data for training and 30% for testing.
- 3. Now start training on training data.
- 4. Now further split the training data into positive ("edible") and negative ("poisonous") data.
- 5. Now find the probabilities of both positive and negative data by dividing count of both of the one by count of total training data.
- 6. Now calculate the counts of all existed values in each attribute.
- 7. And then calculate their probabilities for positive and negative data separately and store these probabilities.
- 8. Now test the testing data on the Decision Tree to get the Accuracy.

Resultant data for all attributes():

cap-shape:

['b', 269, 33, 'bell', 0.09171496760995568, 0.011982570806100218]

['c', 0, 4, 'conical', 0.0, 0.0014524328249818446]

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['x', 1347, 1185, 'convex', 0.4592567337197409, 0.43028322440087147]
['f', 1128, 1116, 'flat', 0.3845891578588476, 0.40522875816993464]
['k', 162, 416, 'knobbed', 0.055233549266962154, 0.15105301379811184]
['s', 27, 0, 'sunken', 0.009205591544493692, 0.0]
cap-surface:
['f', 1110, 523, 'fibrous', 0.3784520968291851, 0.18990559186637618]
['g', 0, 4, 'grooves', 0.0, 0.0014524328249818446]
['y', 1037, 1228, 'scaly', 0.35356290487555403, 0.4458968772694263]
['s', 786, 999, 'smooth', 0.26798499829526085, 0.3627450980392157]
cap-color:
['n', 889, 718, 'brown', 0.3031026252983294, 0.2607116920842411]
['b', 35, 88, 'buff', 0.011933174224343675, 0.03195352214960058]
['c', 23, 8, 'cinnamon', 0.007841800204568702, 0.002904865649963689]
['g', 721, 600, 'gray', 0.2458233890214797, 0.2178649237472767]
['r', 11, 0, 'green', 0.0037504261847937266, 0.0]
['p', 40, 62, 'pink', 0.013637913399249914, 0.02251270878721859]
['u', 10, 0, 'purple', 0.0034094783498124785, 0.0]
['e', 425, 593, 'red', 0.14490282986703035, 0.21532316630355847]
['w', 498, 235, 'white', 0.16979202182066144, 0.08533042846768336]
['v', 281, 450, 'vellow', 0.09580634162973065, 0.16339869281045752]
bruises?:
['t', 1946, 454, 'bruises', 0.6634844868735084, 0.16485112563543936]
['f', 987, 2300, 'no', 0.33651551312649164, 0.8351488743645606]
odor:
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['a', 289, 0, 'almond', 0.09853392430958063, 0.0]
['l', 287, 0, 'anise', 0.09785202863961814, 0.0]
['c', 0, 135, 'creosote', 0.0, 0.049019607843137254]
['y', 0, 398, 'fishy', 0.0, 0.14451706608569354]
['f', 0, 1535, 'foul', 0.0, 0.5573710965867829]
['m', 0, 24, 'musty', 0.0, 0.008714596949891068]
['n', 2357, 80, 'none', 0.8036140470508012, 0.029048656499636893]
['p', 0, 187, 'pungent', 0.0, 0.06790123456790123]
['s', 0, 395, 'spicy', 0.0, 0.14342774146695716]
gill-attachment:
['a', 123, 14, 'attached', 0.041936583702693486, 0.005083514887436456]
['d', 0, 0, 'descending', 0.0, 0.0]
['f', 2810, 2740, 'free', 0.9580634162973065, 0.9949164851125636]
['n', 0, 0, 'notched', 0.0, 0.0]
gill-spacing:
['c', 2109, 2679, 'close', 0.7190589839754518, 0.9727668845315904]
['w', 824, 75, 'crowded', 0.28094101602454824, 0.027233115468409588]
['d', 0, 0, 'distant', 0.0, 0.0]
gill-size:
['b', 2728, 1203, 'broad', 0.9301056938288442, 0.43681917211328974]
['n', 205, 1551, 'narrow', 0.06989430617115582, 0.5631808278867102]
gill-color:
['k', 240, 42, 'black', 0.08182748039549949, 0.015250544662309368]
['n', 660, 80, 'brown', 0.22502557108762358, 0.029048656499636893]
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['b', 0, 1197, 'buff', 0.0, 0.434640522875817]
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['h', 146, 389, 'chocolate', 0.04977838390726219, 0.1412490922294844]

['g', 172, 359, 'gray', 0.05864302761677463, 0.13035584604212055]

['r', 0, 15, 'green', 0.0, 0.0054466230936819175]

['o', 32, 0, 'orange', 0.010910330719399931, 0.0]

['p', 581, 455, 'pink', 0.19809069212410502, 0.16521423384168482]

['u', 313, 35, 'purple', 0.10671667234913058, 0.012708787218591141]

['e', 63, 0, 'red', 0.021479713603818614, 0.0]

['w', 680, 167, 'white', 0.23184452778724854, 0.060639070442992014]

['y', 46, 15, 'yellow', 0.015683600409137403, 0.0054466230936819175] stalk-shape:

['e', 1117, 1344, 'enlarging', 0.38083873167405385, 0.4880174291938998]

['t', 1816, 1410, 'tapering', 0.6191612683259461, 0.5119825708061002] stalk-root:

['b', 1354, 1320, 'bulbous', 0.46164336856460964, 0.4793028322440087]

['c', 358, 29, 'club', 0.12205932492328674, 0.010530137981118372]

['u', 0, 0, 'cup', 0.0, 0.0]

['e', 601, 187, 'equal', 0.20490964882372997, 0.06790123456790123]

['z', 0, 0, 'rhizomorphs', 0.0, 0.0]

['r', 144, 0, 'rooted', 0.049096488237299694, 0.0]

['?', 476, 1218, 'missing', 0.162291169451074, 0.4422657952069717] stalk-surface-above-ring:

['f', 270, 109, 'fibrous', 0.09205591544493692, 0.03957879448075526]

['y', 12, 5, 'scaly', 0.004091374019774974, 0.0018155410312273058]

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['k', 107, 1563, 'silky', 0.036481418342993524, 0.5675381263616558]
['s', 2544, 1077, 'smooth', 0.8673712921922946, 0.39106753812636164]
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stalk-surface-below-ring:

['f', 308, 106, 'fibrous', 0.10501193317422435, 0.03848946986201888]

['y', 156, 50, 'scaly', 0.05318786225707467, 0.01815541031227306]

['k', 98, 1516, 'silky', 0.03341288782816229, 0.5504720406681191]

['s', 2371, 1082, 'smooth', 0.8083873167405387, 0.39288307915758897] stalk-color-above-ring:

['n', 12, 303, 'brown', 0.004091374019774974, 0.11002178649237472]

[", 0, 0, 'buff', 0.0, 0.0]

['c', 0, 24, 'cinnamon', 0.0, 0.008714596949891068]

['g', 413, 0, 'gray', 0.14081145584725538, 0.0]

['o', 123, 0, 'orange', 0.041936583702693486, 0.0]

['p', 398, 913, 'pink', 0.13569723832253666, 0.33151779230210604]

['e', 68, 0, 'red', 0.023184452778724857, 0.0]

['w', 1919, 1198, 'white', 0.6542788953290146, 0.43500363108206247]

['y', 0, 5, 'yellow', 0.0, 0.0018155410312273058]

stalk-color-below-ring:

['n', 41, 314, 'brown', 0.013978861234231163, 0.1140159767610748]

[", 0, 0, 'buff', 0.0, 0.0]

['c', 0, 24, 'cinnamon', 0.0, 0.008714596949891068]

['g', 414, 0, 'gray', 0.1411524036822366, 0.0]

['o', 123, 0, 'orange', 0.041936583702693486, 0.0]

['p', 409, 911, 'pink', 0.13944766450733037, 0.3307915758896151]

```
['e', 63, 0, 'red', 0.021479713603818614, 0.0]
['w', 1883, 1189, 'white', 0.6420047732696897, 0.43173565722585333]
['y', 0, 15, 'yellow', 0.0, 0.0054466230936819175]
veil-type:
['p', 2933, 2754, 'partial', 1.0, 1.0]
['u', 0, 0, 'universal', 0.0, 0.0]
veil-color:
['n', 58, 0, 'brown', 0.019774974428912375, 0.0]
['o', 65, 0, 'orange', 0.02216160927378111, 0.0]
['w', 2810, 2749, 'white', 0.9580634162973065, 0.9981844589687727]
['y', 0, 5, 'yellow', 0.0, 0.0018155410312273058]
ring-number:
['n', 0, 24, 'none', 0.0, 0.008714596949891068]
['o', 2572, 2682, 'one', 0.8769178315717695, 0.9738562091503268]
['t', 361, 48, 'two', 0.12308216842823048, 0.017429193899782137]
ring-type:
['c', 0, 0, 'cobwebby', 0.0, 0.0]
['e', 686, 1223, 'evanescent', 0.23389021479713604, 0.444081336238199]
['f', 27, 0, 'flaring', 0.009205591544493692, 0.0]
['n', 0, 24, 'none', 0.0, 0.008714596949891068]
['p', 2220, 589, 'pendant', 0.7569041936583703, 0.2138707334785766]
['s', 0, 0, 'sheathing', 0.0, 0.0]
['z', 0, 0, 'zone', 0.0, 0.0]
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spore-print-color:
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['k', 1169, 164, 'black', 0.39856801909307876, 0.05954974582425563]
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['n', 1217, 158, 'brown', 0.41493351517217864, 0.05737109658678286]

['b', 31, 0, 'buff', 0.010569382884418685, 0.0]

['h', 27, 1131, 'chocolate', 0.009205591544493692, 0.4106753812636166]

['r', 0, 48, 'green', 0.0, 0.017429193899782137]

['o', 29, 0, 'orange', 0.009887487214456188, 0.0]

['u', 38, 0, 'purple', 0.012956017729287419, 0.0]

['w', 390, 1253, 'white', 0.13296965564268667, 0.4549745824255628]

['y', 32, 0, 'yellow', 0.010910330719399931, 0.0]

population:

['a', 269, 0, 'abundant', 0.09171496760995568, 0.0]

['c', 190, 35, 'clustered', 0.0647800886464371, 0.012708787218591141]

['n', 265, 0, 'numerous', 0.09035117627003068, 0.0]

['s', 620, 268, 'scattered', 0.21138765768837367, 0.09731299927378359]

['v', 846, 1995, 'several', 0.2884418683941357, 0.724400871459695]

['y', 743, 456, 'solitary', 0.2533242413910672, 0.1655773420479303]

habitat:

['g', 975, 521, 'grasses', 0.3324241391067167, 0.18917937545388525]

['l', 152, 420, 'leaves', 0.051824070917149676, 0.15250544662309368]

['m', 175, 25, 'meadows', 0.059665871121718374, 0.00907770515613653]

['p', 103, 690, 'paths', 0.03511762700306853, 0.25054466230936817]

['u', 75, 200, 'urban', 0.02557108762359359, 0.07262164124909223]

['w', 131, 0, 'waste', 0.044664166382543474, 0.0]

['d', 1322, 898, 'woods', 0.4507330378452097, 0.3260711692084241]

Accuracy:

Accuracy of Classifier is 99.6-99.9% (Variable due to random splitting).

Output Screen Shot:

```
['s', 0, 0, 'sheathing', 0.0, 0.0]
['z', 0, 0, 'zone', 0.0, 0.0]
['z', 0, 0, 'zone', 0.0, 0.0]
[spore-print-color:
['k', 1154, 145, 'black', 0.39039242219215153, 0.05309410472354449]
['n', 1231, 171, 'brown', 0.41644113667117727, 0.06261442694983523]
['b', 36, 0, 'buff', 0.012178619756427604, 0.0]
['h', 35, 1099, 'chocolate', 0.011840324763193504, 0.40241669718052]
['n', 0.51, 'green', 0.0, 0.41867447821310875]
['o', 33, 0, 'orange', 0.011163734776725304, 0.0]
['u', 36, 0, 'purple', 0.012178619756427604, 0.0]
['u', 36, 0, 'purple', 0.012178619756427604, 0.0]
['u', 25, 0, 'yellow', 0.008457374830852503, 0.0]
population:
['a', 263, 0, 'abundant', 0.08897158322056833, 0.0]
['c', 208, 36, 'clustered', 0.07036535859269283, 0.013181984621017943]
['n', 280, 0, 'numerous', 0.09472258918054803, 0.0]
['s', 626, 258, 'scattered', 0.21177266576454667, 0.09447088978396193]
['v', 834, 1987, 'several', 0.2821380243572395, 0.7275723178322958]
['y', 745, 450, 'solitary', 0.2520297699594046, 0.16477480776272427]
habitat:
['g', 994, 512, 'grasses', 0.33626522327469555, 0.18747711461003294]
['1', 165, 397, 'leaves', 0.058818673883626525, 0.18747711461003294]
['n', 179, 23, 'meadows', 0.0605548037883903926, 0.008421823507872574]
['p', 904, 512, 'grasses', 0.362852337838903926, 0.008421823507872574]
['p', 907, 'paths', 0.03446549391609014, 0.258879531372135]
['u', 69, 194, 'urban', 0.02334235435315291, 0.0710362504577078]
['u', 69, 194, 'urban', 0.02334235453315291, 0.0710362504577078]
['u', 137, 0, 'waste', 0.04634641407307172, 0.0]
['d', 1322, 2898, 'woods', 0.4472259810554804, 0.3288172830465031]
Accuracy of Classifier is 99.84%

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Comparison Between Both of them

- 1. Naïve Bayes implementation is easier than ID3 implementation.
- Accuracy of ID3 Classifier is more efficient than Naïve Bayes Classifier according to the result of Mushroom Data Testing.