

Pytorch:

## 1. Mushroom dataset

### Basic testing:

```
PS C:\Users\chim\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\pytorch_implementation> python test.py --ID EC_E_PES2UG23CS310_Lab3 --data ./Datasets/mushrooms.csv --framework pytorch
ch
Running tests with PYTORCH framework
=====
target column: 'class' (last column)
Original dataset info:
Shape: (8124, 23)
Columns: ['cap-shape', 'cap-surface', 'cap-color', 'bruises', 'odor', 'gill-attachment', 'gill-spacing', 'gill-size', 'gill-color', 'stalk-shape', 'stalk-root', 'stalk-surface-above-ring', 'stalk-surface-below-ring', 'stalk-color-above-ring', 'stalk-color-below-ring', 'veil-type', 'veil-color', 'ring-number', 'ring-type', 'spore-print-color', 'population', 'habitat', 'class']
First few rows:
cap-shape: ['x' 'b' 's' 'f' 'k'] -> [5 0 4 2 3]
cap-color: ['n' 'y' 'w' 'g' 'e'] -> [4 9 8 3 2]
class: ['p' 'e'] -> [1 0]

Processed dataset shape: torch.size([8124, 23])
Number of features: 22
Features: ['cap-shape', 'cap-surface', 'cap-color', 'bruises', 'odor', 'gill-attachment', 'gill-spacing', 'gill-size', 'gill-color', 'stalk-shape', 'stalk-root', 'stalk-surface-above-ring', 'stalk-surface-below-ring', 'stalk-color-above-ring', 'stalk-color-below-ring', 'veil-type', 'veil-color', 'ring-number', 'ring-type', 'spore-print-color', 'population', 'habitat']
Target class:
Framework: PYTORCH
Data type: <class 'torch.Tensor'>
=====

DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 8124
Training samples: 6499
Testing samples: 1625

Constructing decision tree using training data...
└─ Decision tree construction completed using PYTORCH!
    └─ OVERALL PERFORMANCE METRICS
        =====
        Accuracy: 1.0000 (100.00%)
        Precision (weighted): 1.0000
        Recall (weighted): 1.0000
        F1-Score (weighted): 1.0000
        Precision (macro): 1.0000
        Recall (macro): 1.0000
        F1-Score (macro): 1.0000
    └─ TREE COMPLEXITY METRICS
        =====
        Maximum Depth: 4
        Total Nodes: 29
        Leaf Nodes: 24
        Internal Nodes: 5
```

## Tree Visualisation:

## 2. Tic-tac-toe dataset

### Basic testing:

```
PS C:\Users\chinn\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\pytorch_implementation> python test.py --ID EC_E_PES2UG23CS310_Lab3 --data ./datasets/tictactoe.csv --framework pytorch
Running tests with PYTORCH framework
=====
target column: 'Class' (last column)
Original dataset info:
Shape: (958, 10)
columns: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square', 'Class']
First few rows:
top-left-square: ['x' 'o' 'b'] -> [2 1 0]
top-middle-square: ['x' 'o' 'b'] -> [2 1 0]
top-right-square: ['x' 'o' 'b'] -> [2 1 0]
Class: ['positive' 'negative'] -> [1 0]

Processed dataset shape: torch.size([958, 10])
Number of features: 9
Features: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square']
Target: Class
Framework: PYTORCH
Data type: <class 'torch.Tensor'>

=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 958
Training samples: 766
Testing samples: 192
constructing decision tree using training data...
◆ Decision tree construction completed using PYTORCH!

▣ OVERALL PERFORMANCE METRICS
=====
Accuracy: 0.8723 (87.23%)
Precision (weighted): 0.8734
Recall (weighted): 0.8723
F1-Score (weighted): 0.8728
Precision (macro): 0.8586
Recall (macro): 0.8634
F1-Score (macro): 0.8669

◆ TREE COMPLEXITY METRICS
=====
Maximum Depth: 7
Total Nodes: 283
Leaf Nodes: 181
Internal Nodes: 102
```

## Tree Visualisation:

```

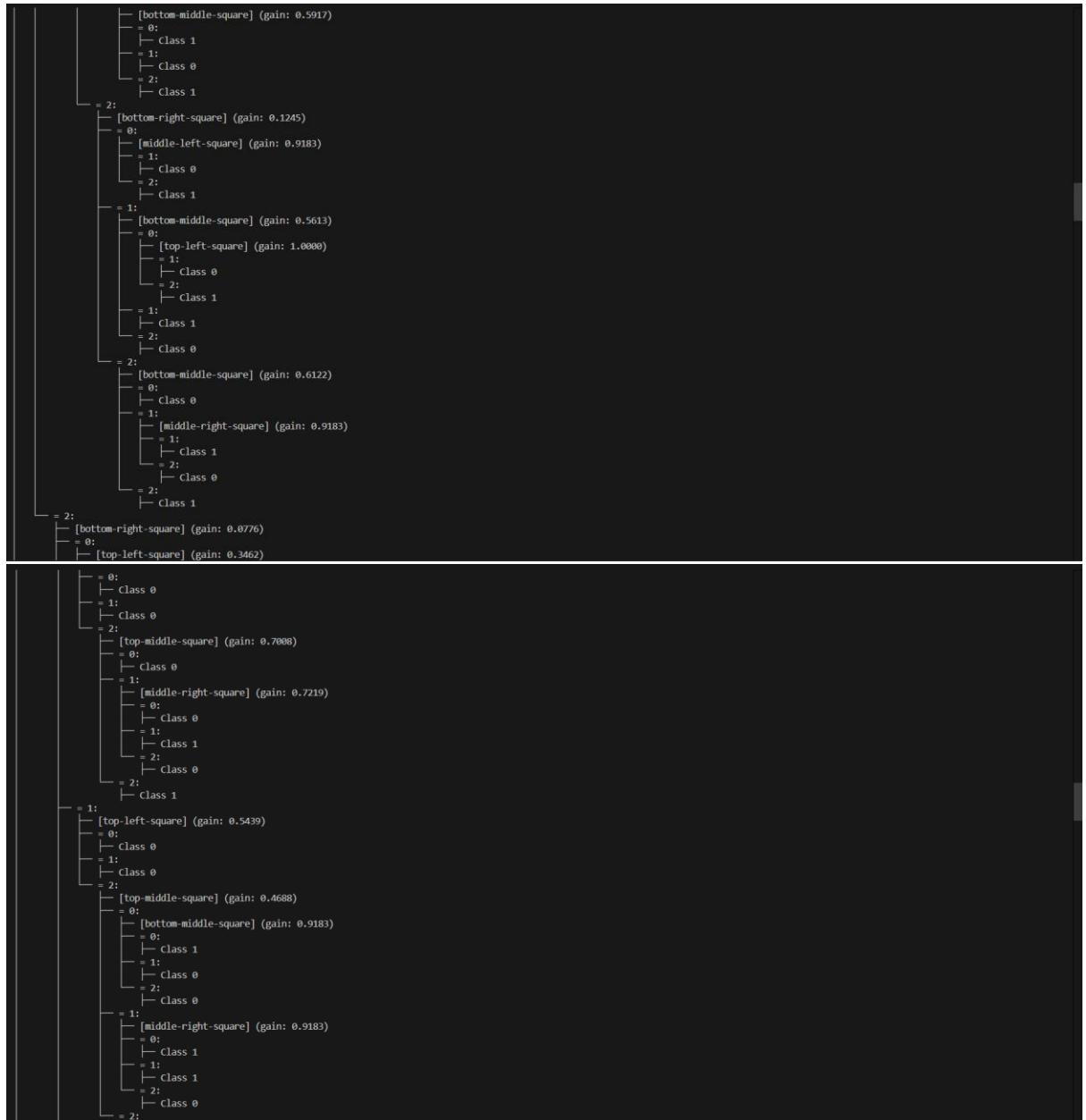
PS C:\Users\chinm\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\pytorch_implementation> python test.py --ID EC_E_PES2UG23CS310_Lab3 --data ..\Datasets\tictactoe.csv --print-tree
Running tests with PYTORCH framework
=====
target column: 'Class' (last column)
Original dataset info:
Shape: (958, 10)
Columns: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square', 'Class']
=====
First few rows:
top-left-square: ['x' 'o' 'b'] -> [2 1 0]
top-middle-square: ['x' 'o' 'b'] -> [2 1 0]
top-right-square: ['x' 'o' 'b'] -> [2 1 0]
Class: ['positive' 'negative'] -> [1 0]

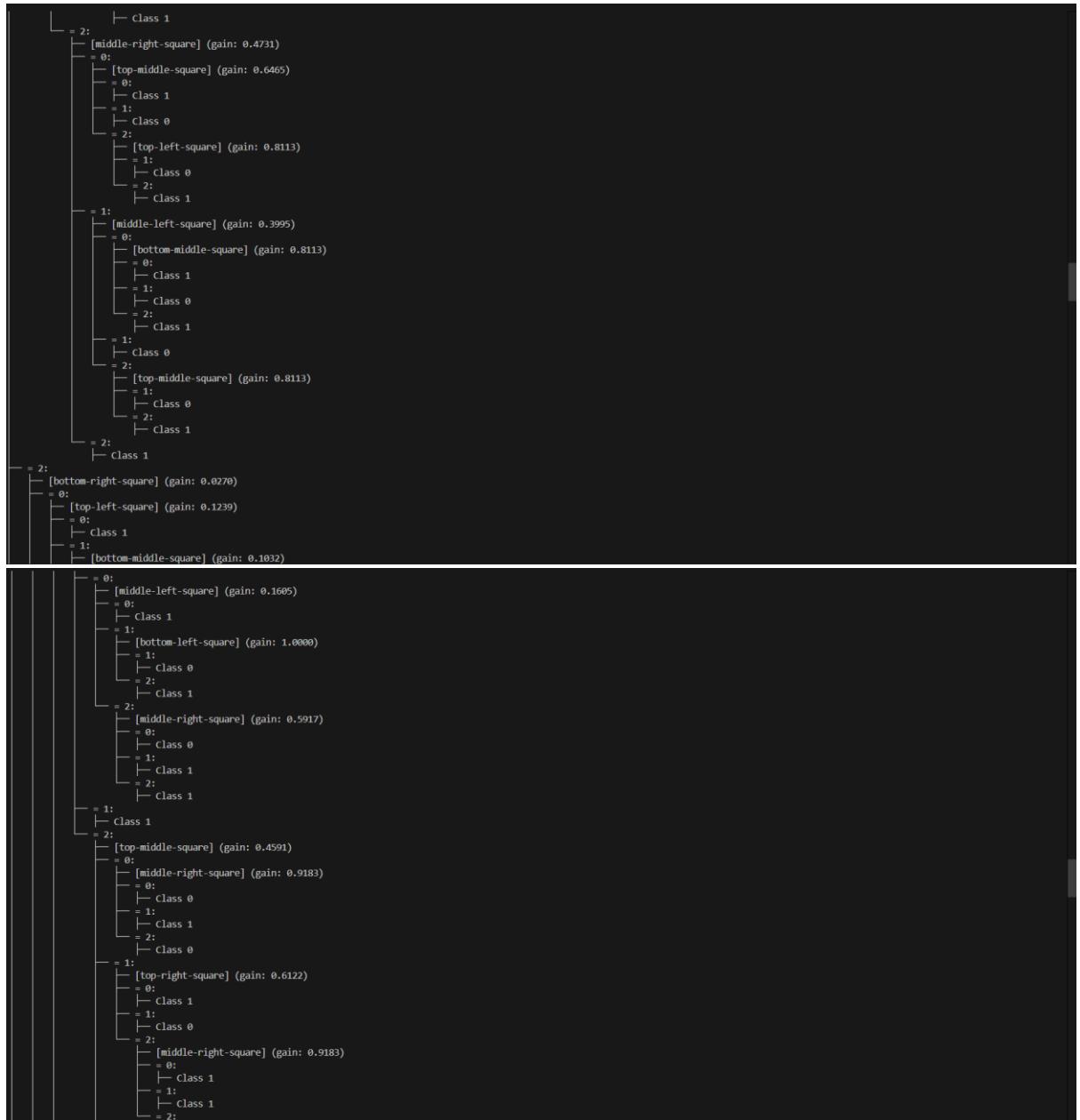
Processed dataset shape: torch.Size([958, 10])
Number of features: 9
Features: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square']
Target: Class
Framework: PYTORCH
Data type: <class 'torch.Tensor'>
=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 958
Training samples: 766
Testing samples: 192

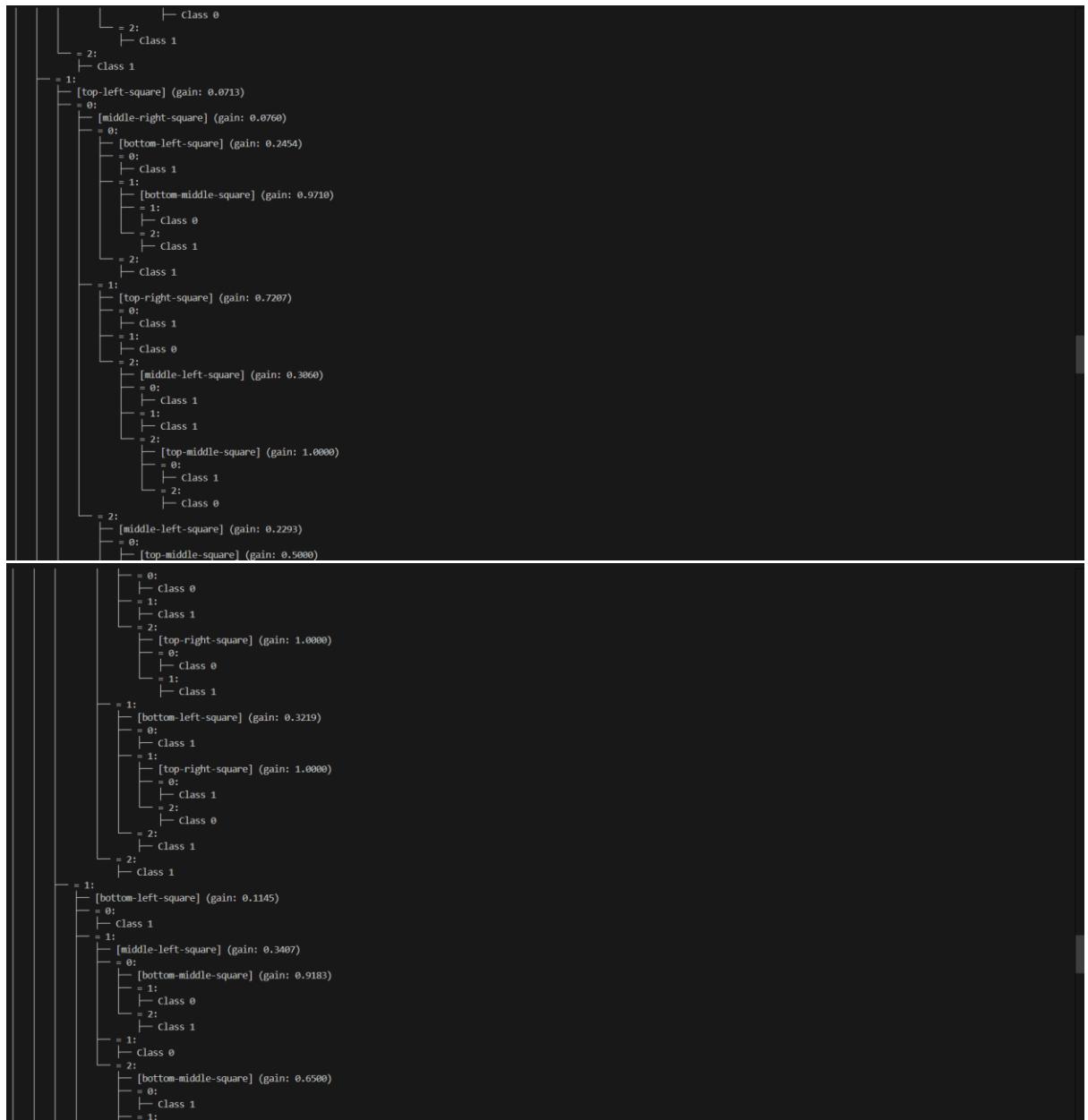
Constructing decision tree using training data...
▲ Decision tree construction completed using PYTORCH!
▲ DECISION TREE STRUCTURE
=====
Root [middle-middle-square] (gain: 0.0834)
  = 0:
    [bottom-left-square] (gain: 0.1056)
      = 0:
        [top-right-square] (gain: 0.0024)
          = 1:
            Class 0
          = 2:
            Class 1
      = 1:
        [top-right-square] (gain: 0.2782)
          = 0:
            Class 0
          = 1:
            Class 0
          = 2:
            [top-left-square] (gain: 0.1767)
              = 0:
                [bottom-right-square] (gain: 0.9183)
                  = 1:
                    Class 0
                  = 2:
                    Class 1
              = 1:
                [top-middle-square] (gain: 0.6058)
                  = 0:
                    [middle-left-square] (gain: 0.9183)
                      = 1:
                        Class 0
                      = 2:
                        Class 0
      = 2:
        Class 1
        = 1:
          Class 1
        = 2:
          Class 0
  = 1:
    [top-middle-square] (gain: 0.3392)
      = 0:
        [middle-left-square] (gain: 0.9183)
          = 0:
            Class 0
          = 1:
            Class 1
          = 2:
            Class 0
      = 1:
        [middle-left-square] (gain: 0.9183)
          = 0:
            Class 1
          = 1:
            Class 1
          = 2:
            Class 0
      = 2:
        Class 1
  = 2:
    [top-right-square] (gain: 0.1225)
      = 0:
        Class 1
      = 1:
        [middle-right-square] (gain: 0.1682)
          = 0:
            Class 1
          = 1:
            [bottom-right-square] (gain: 0.9403)
              = 0:
                Class 1
              = 1:
                Class 0
              = 2:
                Class 1
            = 2:
              [top-left-square] (gain: 0.9183)

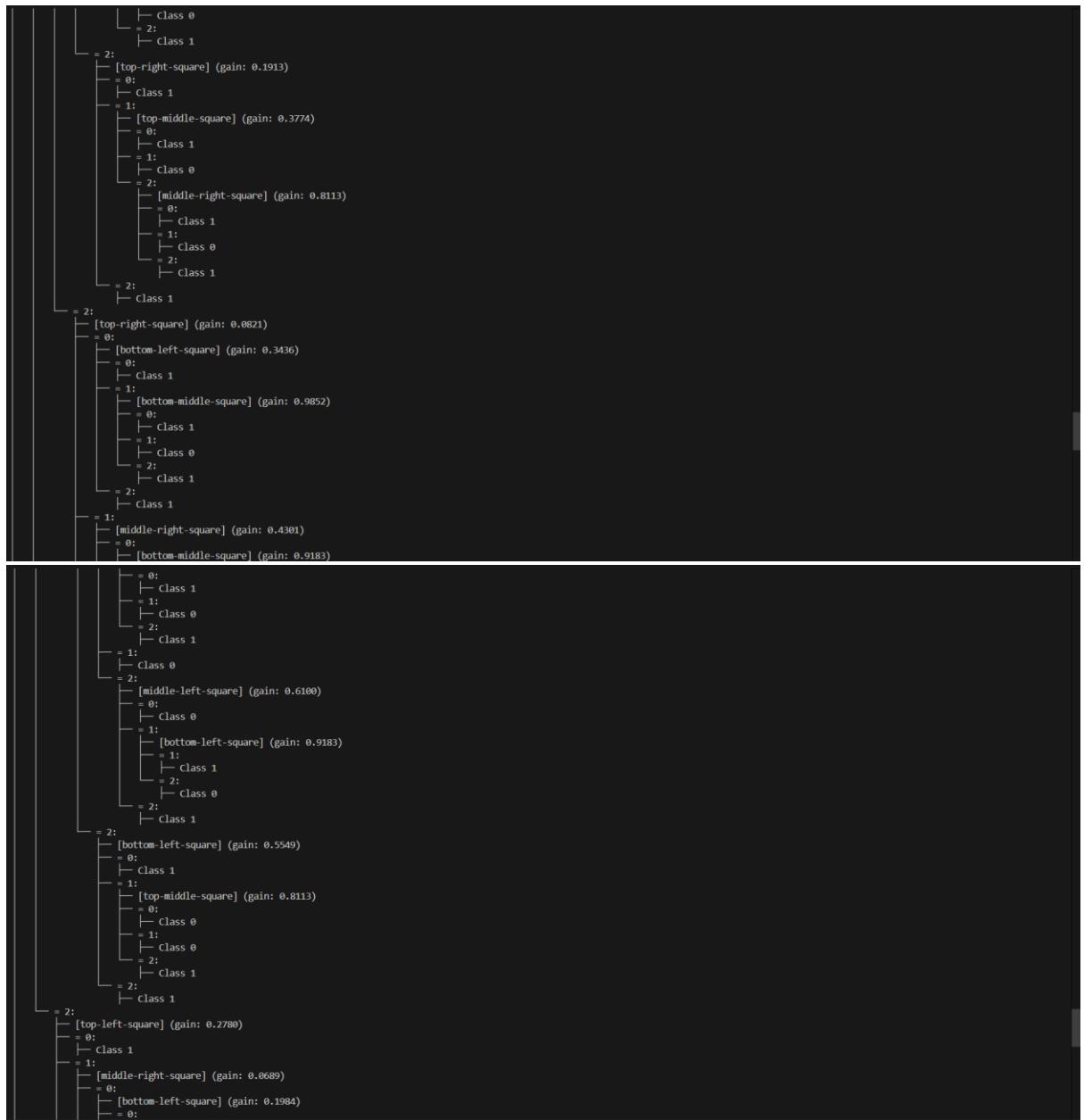
```

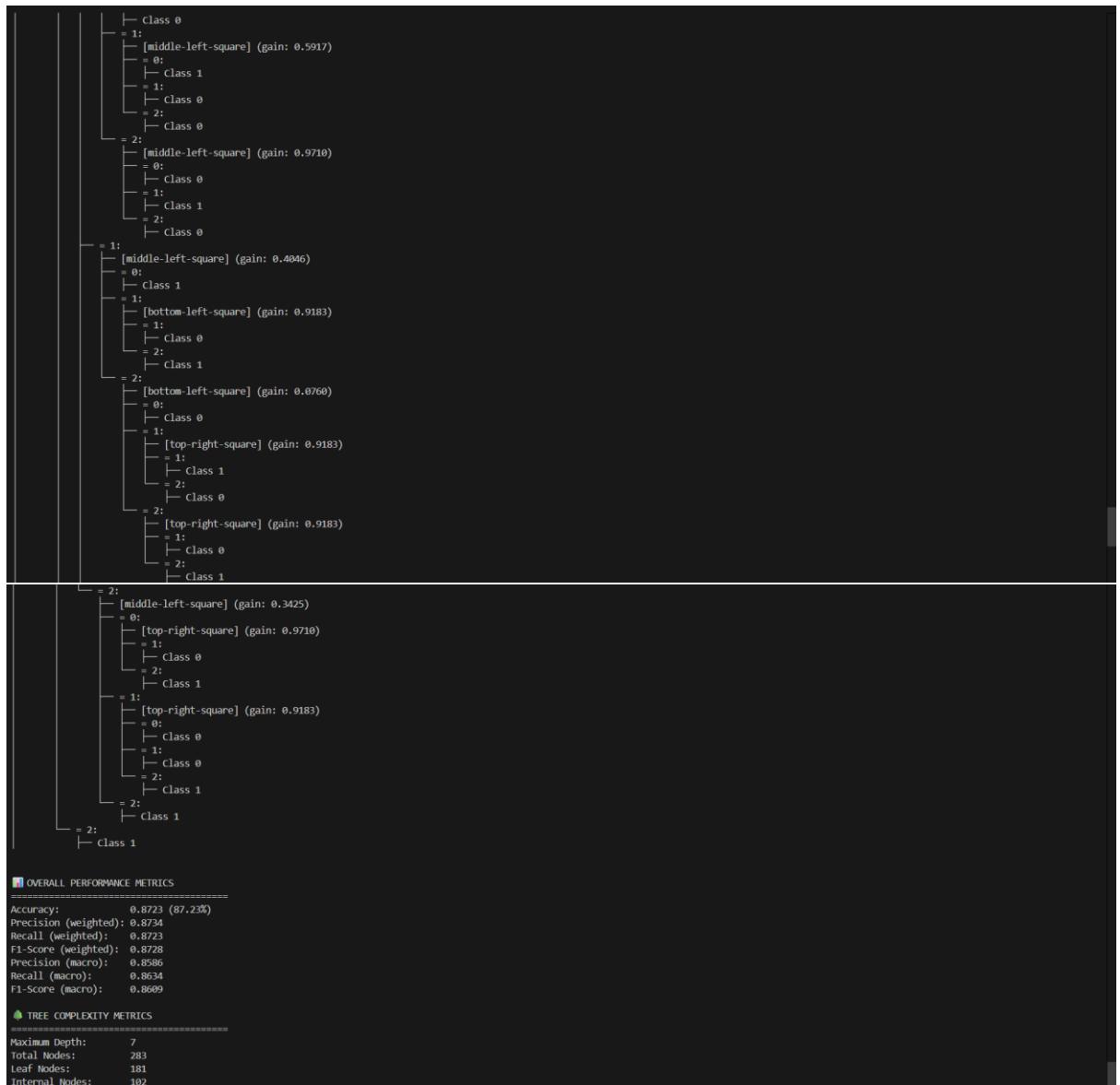












### 3. Nursery dataset

#### Basic testing:

```
Running tests with PYTORCH framework
=====
target column: 'class' (last column)
Original dataset info:
Shape: (12960, 9)
Columns: ['parents', 'has_nurs', 'form', 'children', 'housing', 'finance', 'social', 'health', 'class']

First few rows:
parents: ['usual' 'pretentious' 'great_pret'] -> [2 1 0]
has_nurs: ['proper' 'less_proper' 'improper' 'critical' 'very_crit'] -> [3 2 1 0 4]
form: ['complete' 'completed' 'incomplete' 'foster'] -> [0 1 3 2]
class: ['recommend' 'priority' 'not_recom' 'very_recom' 'spec_prior'] -> [2 1 0 4 3]

Processed dataset shape: torch.Size([12960, 9])
Number of features: 8
Features: ['parents', 'has_nurs', 'form', 'children', 'housing', 'finance', 'social', 'health']
Target: class
Framework: PYTORCH
Data type: <class 'torch.Tensor'>

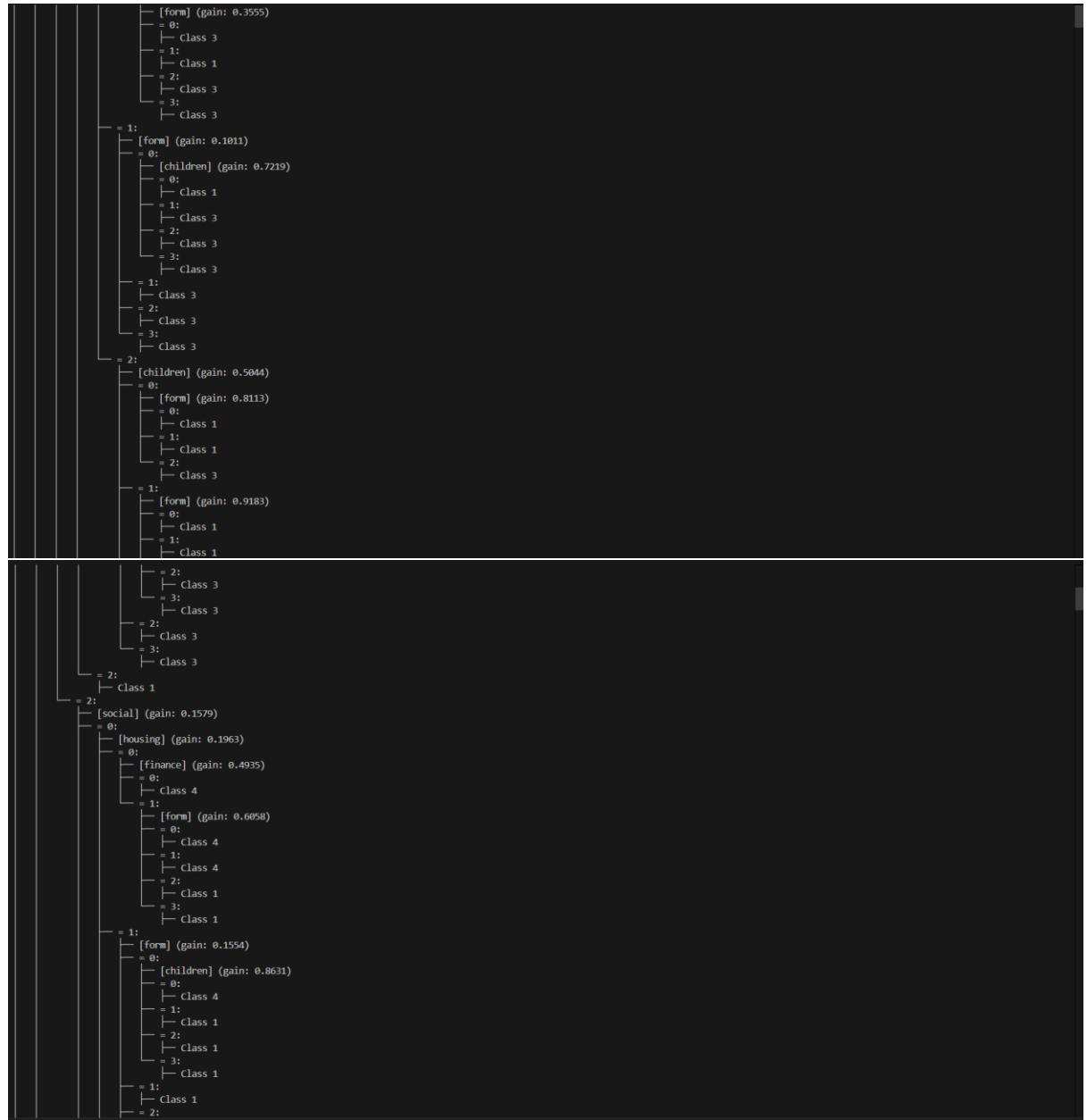
=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 12960
Training samples: 10368
Testing samples: 2592

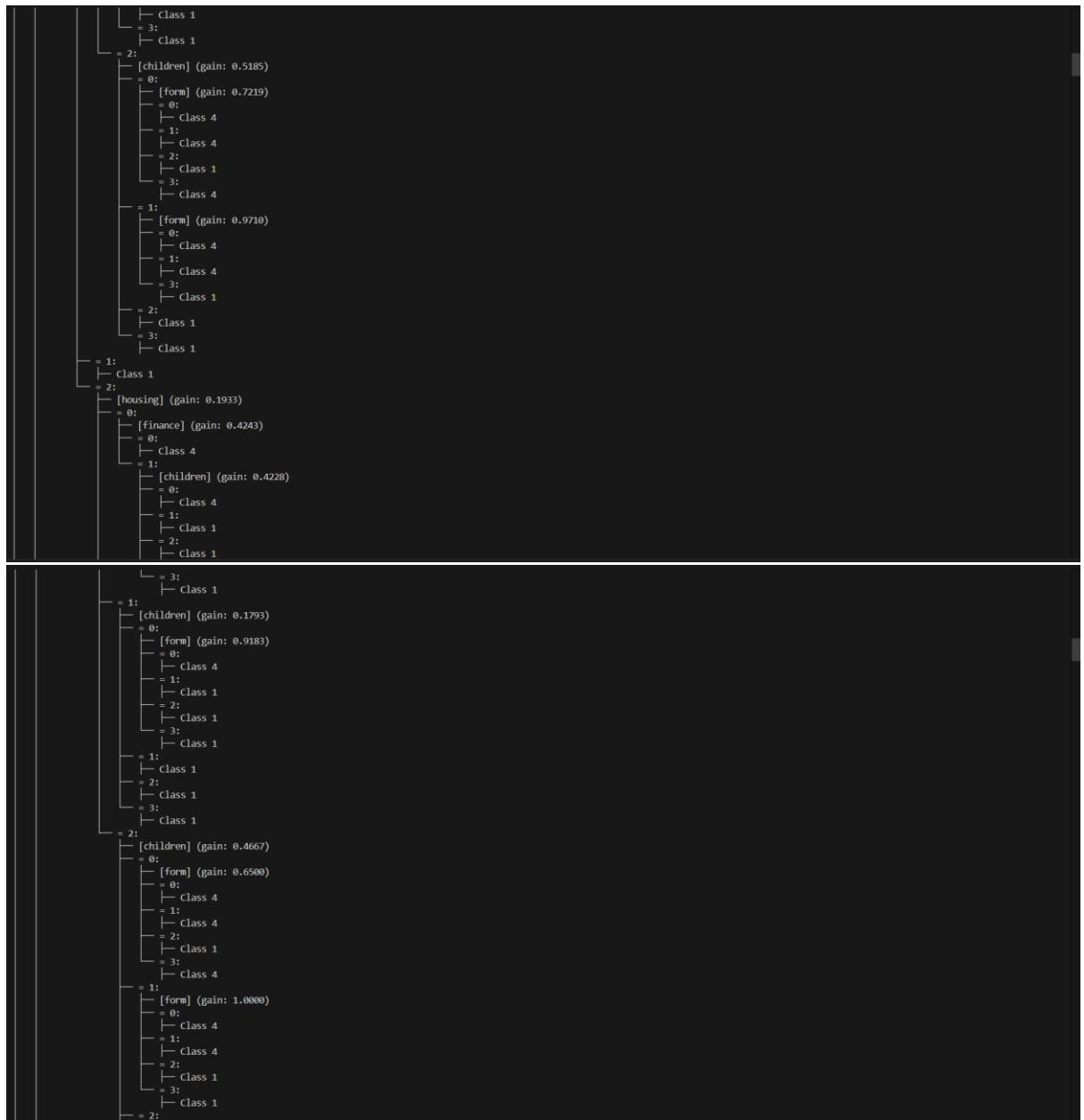
Constructing decision tree using training data...
◆ Decision tree construction completed using PYTORCH!

▣ OVERALL PERFORMANCE METRICS
=====
Accuracy: 0.9867 (98.67%)
Precision (weighted): 0.9876
Recall (weighted): 0.9867
F1-Score (weighted): 0.9872
Precision (macro): 0.7604
Recall (macro): 0.7654
F1-Score (macro): 0.7628

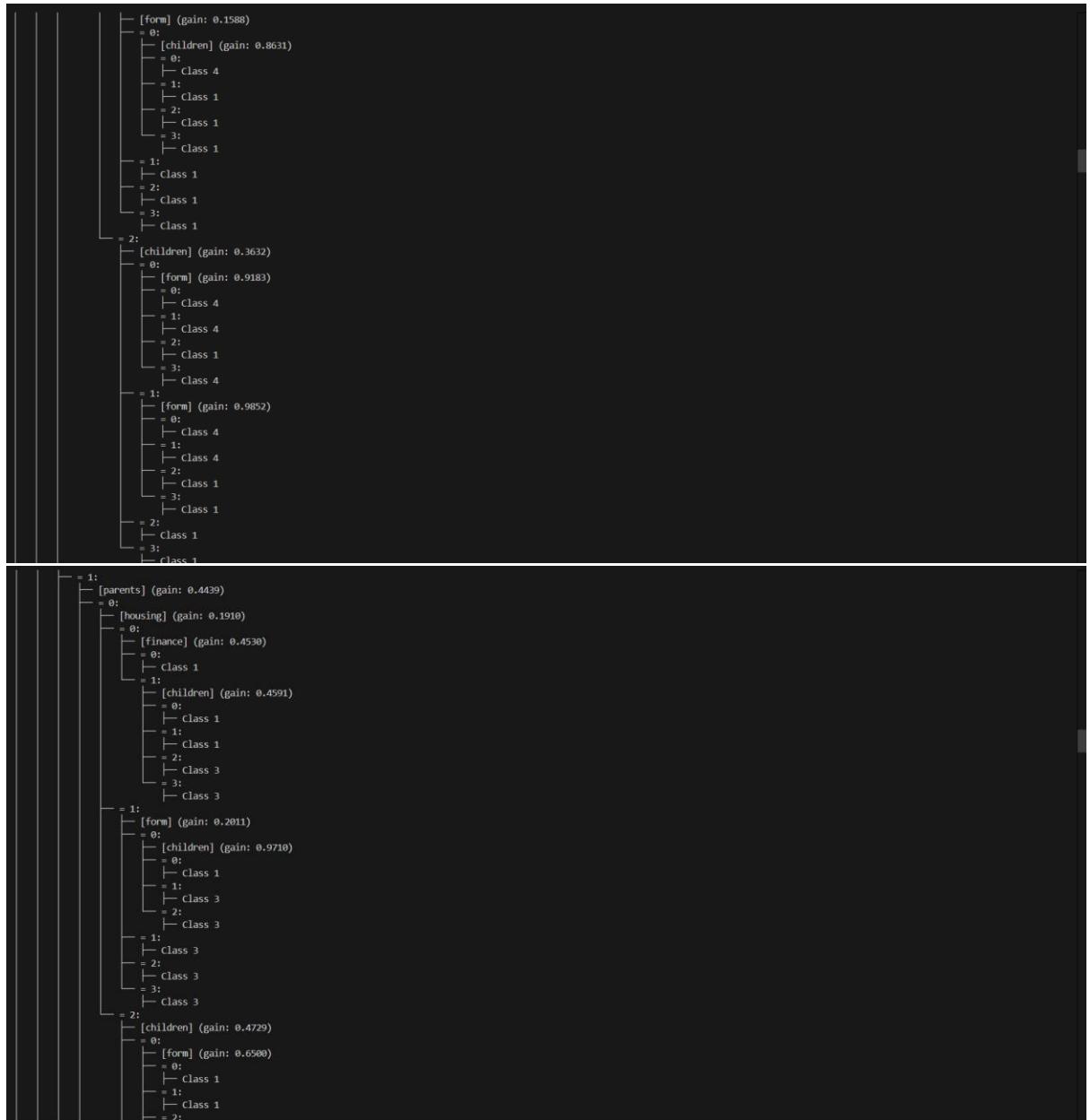
◆ TREE COMPLEXITY METRICS
=====
Maximum Depth: 7
Total Nodes: 952
Leaf Nodes: 680
Internal Nodes: 272
```

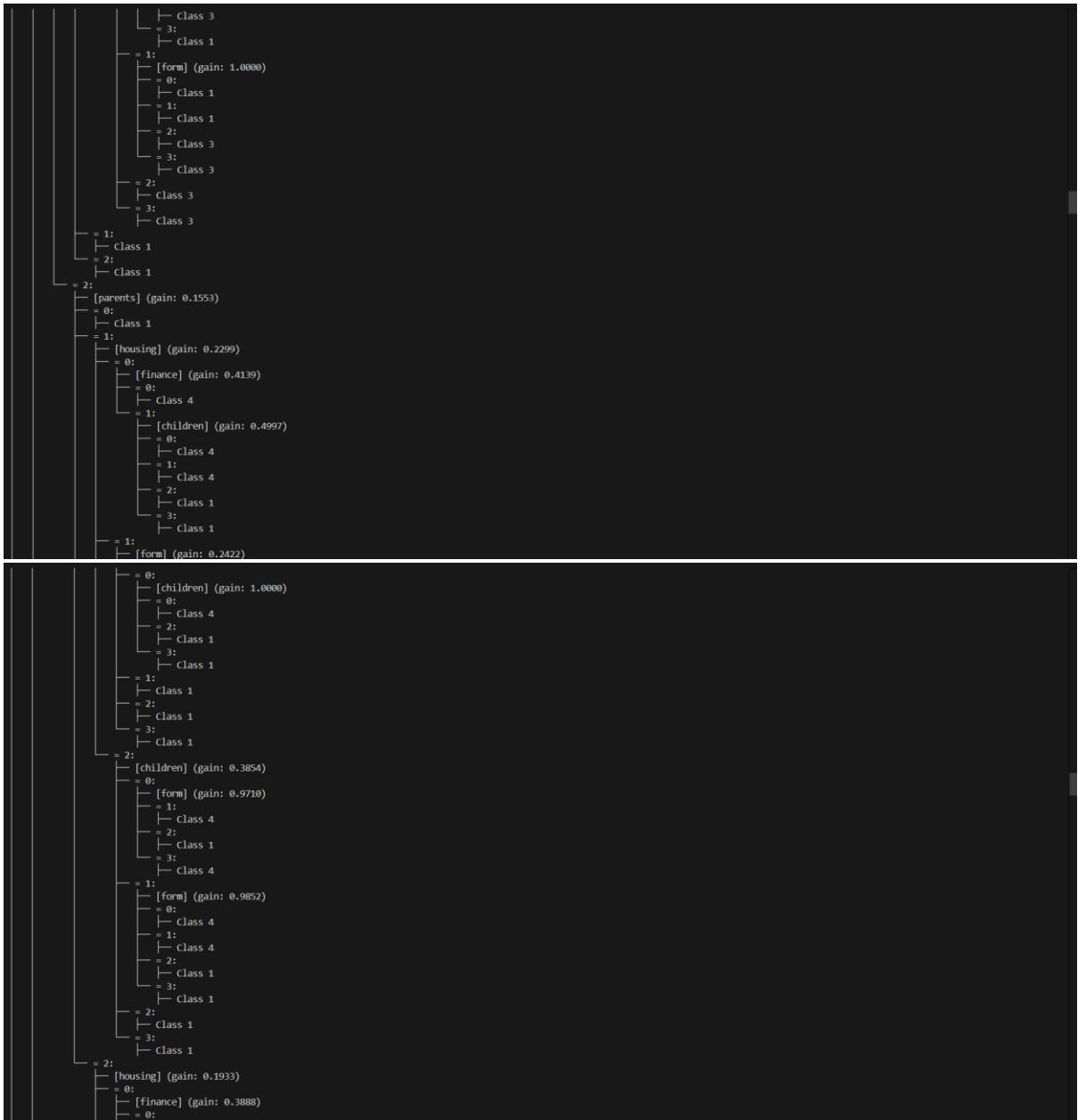
## Tree visualization:









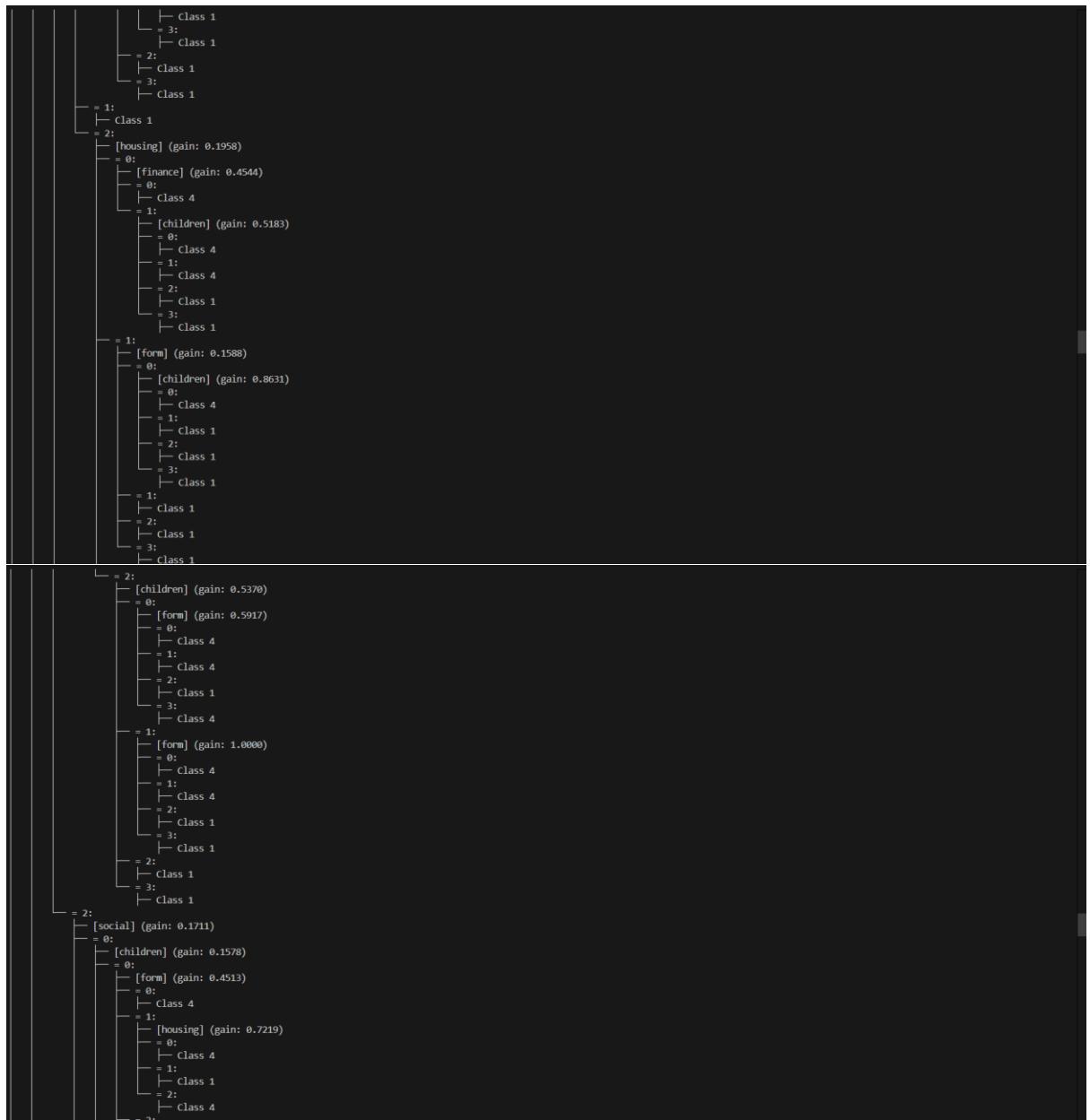


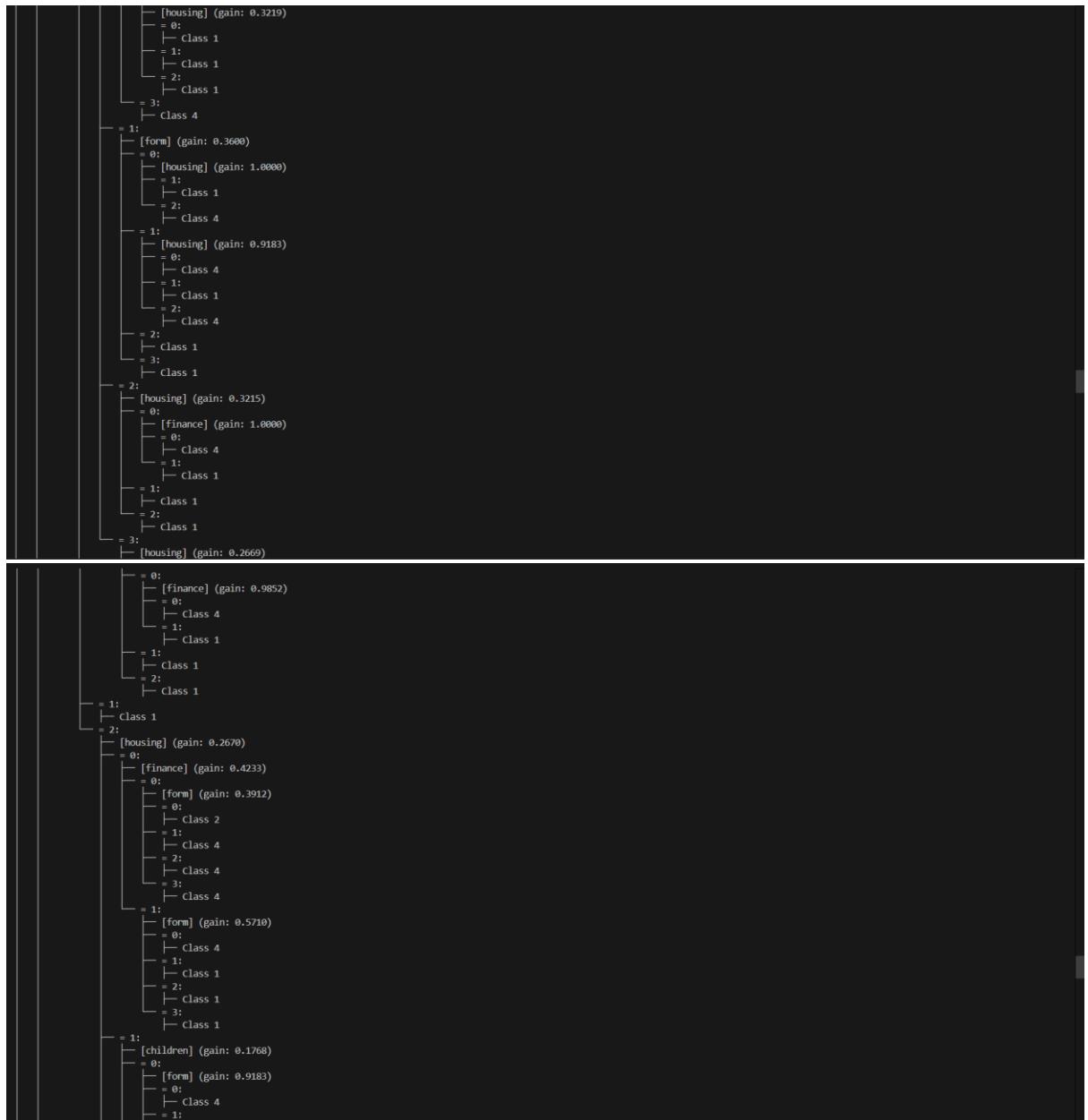
```

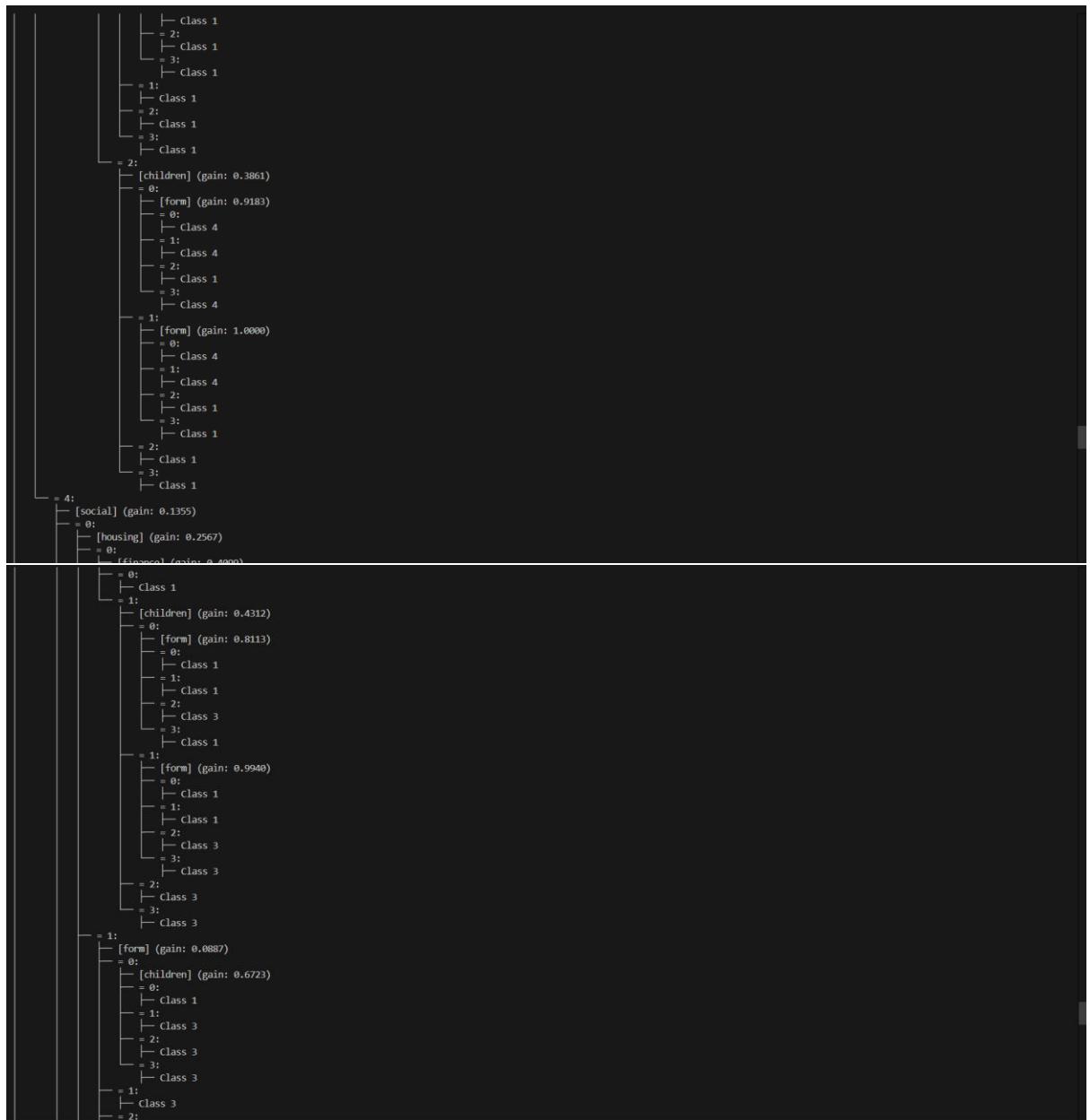
    └── Class 4
      └── = 1:
        └── [children] (gain: 0.4039)
          └── = 0:
            └── Class 4
          └── = 1:
            └── Class 1
          └── = 2:
            └── Class 1
          └── = 3:
            └── Class 1
      └── = 1:
        └── [form] (gain: 0.1554)
          └── = 0:
            └── [children] (gain: 0.8631)
              └── = 0:
                └── Class 4
              └── = 1:
                └── Class 1
              └── = 2:
                └── Class 1
              └── = 3:
                └── Class 1
          └── = 1:
            └── Class 1
          └── = 2:
            └── class 1
          └── = 3:
            └── Class 1
      └── = 2:
        └── [children] (gain: 0.4322)
          └── = 0:
            └── [form] (gain: 0.8113)
              └── = 0:
                └── Class 4
              └── = 1:
                └── Class 4
              └── = 2:
                └── Class 1
              └── = 3:
                └── Class 4
          └── = 1:
            └── [form] (gain: 0.9183)
              └── = 0:
                └── Class 4
              └── = 2:
                └── Class 1
              └── = 3:
                └── Class 1
      └── = 3:
        └── [parents] (gain: 0.2121)
          └── = 0:
            └── [social] (gain: 0.4863)
              └── = 0:
                └── Class 1
            └── = 1:
              └── [housing] (gain: 0.2658)
                └── = 0:
                  └── [finance] (gain: 0.3977)
                    └── = 0:
                      └── Class 1
                └── = 1:
                  └── [children] (gain: 0.4997)
                    └── = 0:
                      └── Class 1
                    └── = 1:
                      └── Class 1
                    └── = 2:
                      └── Class 3
                    └── = 3:
                      └── Class 3
            └── = 1:
              └── [form] (gain: 0.0874)
                └── = 0:
                  └── [children] (gain: 0.6500)
                    └── = 0:
                      └── Class 1
                    └── = 1:
                      └── Class 3
                    └── = 2:
                      └── Class 3
                    └── = 3:
                      └── Class 3

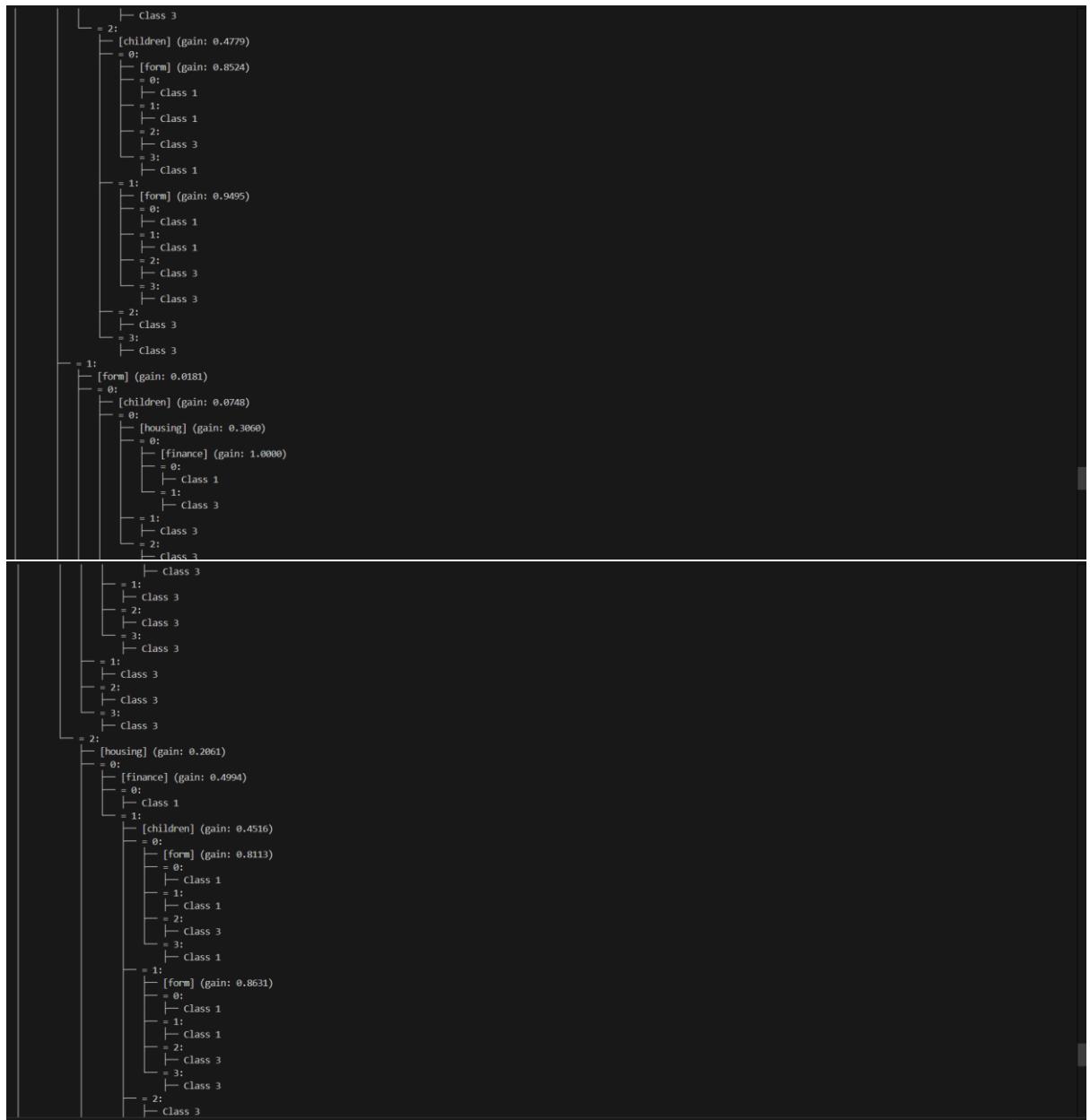
```











```

[= 0:
  [form] (gain: 0.8524)
  [= 0:
    Class 1
    [= 1:
      Class 3
      [= 2:
        Class 3
        [= 3:
          Class 3
        ]
      ]
    ]
  ]
  [= 1:
    Class 3
  ]
  [= 2:
    Class 3
  ]
  [= 3:
    Class 3
  ]
]
 [= 2:
  [children] (gain: 0.4085)
  [= 0:
    [form] (gain: 0.8524)
    [= 0:
      Class 1
      [= 1:
        Class 1
        [= 2:
          Class 3
          [= 3:
            Class 1
          ]
        ]
      ]
    ]
    [= 1:
      [form] (gain: 0.9928)
      [= 0:
        Class 1
        [= 1:
          Class 1
          [= 2:
            Class 3
            [= 3:
              Class 3
            ]
          ]
        ]
      ]
      [= 2:
        Class 3
      ]
      [= 3:
        Class 3
      ]
    ]
  ]
]

```

**OVERALL PERFORMANCE METRICS**

---

Accuracy: 0.9867 (98.67%)  
 Precision (weighted): 0.9876  
 Recall (weighted): 0.9867  
 F1-Score (weighted): 0.9872  
 Precision (macro): 0.7684  
 Recall (macro): 0.7654  
 F1-Score (macro): 0.7628

**TREE COMPLEXITY METRICS**

---

Maximum Depth: 7  
 Total Nodes: 952  
 Leaf Nodes: 680  
 Internal Nodes: 272

## Sklearn

### 1. Mushroom dataset

#### Basic testing:

```
PS C:\Users\chim\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\sklearn_implementation> python test.py --id EC_E_PES20G23CS310_Lab03 --data ../../datasets/mushrooms.csv --framework sklearn
Running tests with SKLEARN framework
=====
target column: 'class' (last column)
Original dataset info:
Shape: (8124, 23)
Columns: ['cap-shape', 'cap-surface', 'cap-color', 'bruises', 'odor', 'gill-attachment', 'gill-spacing', 'gill-size', 'gill-color', 'stalk-shape', 'stalk-root', 'stalk-surface-above-ring', 'stalk-surface-below-ring', 'stalk-color-above-ring', 'stalk-color-below-ring', 'veil-type', 'veil-color', 'ring-number', 'ring-type', 'spore-print-color', 'population', 'habitat', 'class']

First few rows:
cap-shape: ['x' 'b' 's' 'f' 'k'] -> [5 0 4 2 3]
cap-surface: ['s' 'y' 'f' 'g'] -> [2 3 0 1]
cap-color: ['n' 'y' 'w' 'g' 'e'] -> [4 9 8 3 2]
class: ['p' 'e'] -> [1 0]

Processed dataset shape: (8124, 23)
Number of features: 22
Features: ['cap-shape', 'cap-surface', 'cap-color', 'bruises', 'odor', 'gill-attachment', 'gill-spacing', 'gill-size', 'gill-color', 'stalk-shape', 'stalk-root', 'stalk-surface-above-ring', 'stalk-surface-below-ring', 'stalk-color-above-ring', 'stalk-color-below-ring', 'veil-type', 'veil-color', 'ring-number', 'ring-type', 'spore-print-color', 'population', 'habitat']
Target: class
Framework: SKLEARN
Data type: <class 'numpy.ndarray'>

=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 8124
Training samples: 6499
Testing samples: 1625

Constructing decision tree using training data...
└─ Decision tree construction completed using SKLEARN!

=====
OVERALL PERFORMANCE METRICS
=====
Accuracy: 1.0000 (100.00%)
Precision (weighted): 1.0000
Recall (weighted): 1.0000
F1-Score (weighted): 1.0000
Precision (macro): 1.0000
Recall (macro): 1.0000
F1-Score (macro): 1.0000

=====
TREE COMPLEXITY METRICS
=====
Maximum Depth: 4
Total Nodes: 29
Leaf Nodes: 24
Internal Nodes: 5
PS C:\Users\chim\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\sklearn_implementation>
```

## Tree Visualisation:

```
PS C:\Users\chinn\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\sklearn_implementation> python test.py --ID EC_E_PES2UG23CS310_Lab3 --data ..\Data\mushrooms.csv -print-tree
Running tests with PYTORCH framework
=====
target column: 'class' (last column)
Original dataset info:
Shape: (8124, 23)
Columns: ['cap-shape', 'cap-surface', 'cap-color', 'bruises', 'odor', 'gill-attachment', 'gill-spacing', 'gill-size', 'gill-color', 'stalk-shape', 'stalk-root', 'stalk-surface-above-ring', 'stalk-surface-below-ring', 'stalk-color-above-ring', 'stalk-color-below-ring', 'veil-type', 'veil-color', 'ring-number', 'ring-type', 'spore-print-color', 'population', 'habitat', 'class']

First few rows:
cap-shape: ['x' 'b' 's' 'f' 'k'] -> [5 0 4 2 3]
cap-surface: ['s' 'y' 'f' 'g'] -> [2 3 0 1]
cap-color: ['n' 'y' 'w' 'g' 'e'] -> [4 9 8 3 2]
class: ['p' 'e'] -> [1 0]

Processed dataset shape: torch.Size([8124, 23])
Number of features: 22
Features: ['cap-shape', 'cap-surface', 'cap-color', 'bruises', 'odor', 'gill-attachment', 'gill-spacing', 'gill-size', 'gill-color', 'stalk-shape', 'stalk-root', 'stalk-surface-above-ring', 'stalk-surface-below-ring', 'stalk-color-above-ring', 'stalk-color-below-ring', 'veil-type', 'veil-color', 'ring-number', 'ring-type', 'spore-print-color', 'population', 'habitat']
Target: class
Framework: PYTORCH
Data type: <class 'torch.Tensor'>

=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 8124
Training samples: 6499
Testing samples: 1625

Constructing decision tree using training data...
► Decision tree construction completed using PYTORCH!

► DECISION TREE STRUCTURE
=====
Root [odor] (gain: 0.0083)
  = 0:
    |--- Class 0
  = 1:
    |--- Class 1
  = 2:
    |--- Class 1
  = 3:
    |--- Class 0
  = 4:
    |--- Class 1
  = 5:
    |--- [spore-print-color] (gain: 0.1469)
      = 0:
        |--- Class 0
      = 1:
        |--- Class 0
      = 2:
        |--- Class 0
      = 3:
        |--- Class 0
      = 4:
        |--- Class 0
      = 5:
        |--- Class 1
      = 7:
        |--- [habitat] (gain: 0.2218)
          = 0:
            |--- [gill-size] (gain: 0.7642)
              = 0:
                |--- Class 0
              = 1:
                |--- Class 1
            = 1:
              |--- Class 0
          = 2:
            |--- [cap-color] (gain: 0.7300)
              = 1:
                |--- Class 0
              = 4:
                |--- Class 0
```

```
    └── Class 0
        ├── = 8:
        │   └── Class 1
        ├── = 9:
        │   └── Class 1
        └── = 4:
            ├── = 6:
            │   └── Class 0
            └── = 8:
                └── Class 0
            └── = 6:
                ├── Class 1
                ├── = 7:
                │   └── Class 1
                └── = 8:
                    └── Class 1
```

📊 OVERALL PERFORMANCE METRICS

```
=====
Accuracy:      1.0000 (100.00%)
Precision (weighted): 1.0000
Recall (weighted): 1.0000
F1-Score (weighted): 1.0000
Precision (macro): 1.0000
Recall (macro): 1.0000
F1-Score (macro): 1.0000
```

🕒 TREE COMPLEXITY METRICS

```
=====
Maximum Depth:      4
Total Nodes:        29
Leaf Nodes:         24
Internal Nodes:     5
```

```
PS C:\Users\chinm\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\sklearn implementation> █
```

## 2. Tictactoe dataset

### Basic testing:

```
PS C:\Users\chim\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\sklearn_implementation> python test.py --ID EC_E_PES2UG23CS310_Lab3 --data ../Datasets/tictactoe.csv --framework sklearn
Running tests with SKLEARN framework
=====
target column: 'Class' (last column)
Original dataset info:
Shape: (958, 10)
Columns: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square', 'Class']

First few rows:
top-left-square: ['x' 'o' 'b'] -> [2 1 0]
top-middle-square: ['x' 'o' 'b'] -> [2 1 0]
top-right-square: ['x' 'o' 'b'] -> [2 1 0]
Class: ['positive' 'negative'] -> [1 0]

Processed dataset shape: (958, 10)
Number of features: 9
Features: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square']
Target: Class
Framework: SKLEARN
Data type: <class 'numpy.ndarray'>

=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 958
Training samples: 766
Testing samples: 192

Constructing decision tree using training data...
└ Decision tree construction completed using SKLEARN!
=====

DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 958
Training samples: 766
Testing samples: 192

Constructing decision tree using training data...
└ Decision tree construction completed using SKLEARN!
=====

OVERALL PERFORMANCE METRICS
=====
Accuracy: 0.8836 (88.36%)
Precision (weighted): 0.8827
Recall (weighted): 0.8836
F1-Score (weighted): 0.8822
Precision (macro): 0.8784
Recall (macro): 0.8600
F1-Score (macro): 0.8680

└ TREE COMPLEXITY METRICS
=====
Maximum Depth: 7
Total Nodes: 260
Leaf Nodes: 165
Internal Nodes: 95
```

### Tree visualization:

```
PS C:\Users\chinni\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\sklearn_implementation> python test.py --ID EC_E_PES2UG23CS310_Lab3 --data ..\Datasets\tictactoe.csv --print-tree
Running tests with PYTORCH framework
=====
target column: 'Class' (last column)
Original dataset info:
Shape: (958, 10)
Columns: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square', 'Class']
First few rows:
top-left-square: [ 'x' 'o' 'b' ] -> [ 2 1 0 ]
top-middle-square: [ 'x' 'o' 'b' ] -> [ 2 1 0 ]
top-right-square: [ 'x' 'o' 'b' ] -> [ 2 1 0 ]
Class: [ 'positive' 'negative' ] -> [ 1 0 ]
Processed dataset shape: torch.Size([958, 10])
Number of features: 9
Features: ['top-left-square', 'top-middle-square', 'top-right-square', 'middle-left-square', 'middle-middle-square', 'middle-right-square', 'bottom-left-square', 'bottom-middle-square', 'bottom-right-square']
Target: Class
Framework: PYTORCH
Data type: <class 'torch.Tensor'>
=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 958
Training samples: 766
Testing samples: 192
Constructing decision tree using training data...
└─ Decision tree construction completed using PYTORCH!
└─ DECISION TREE STRUCTURE
=====
Root: [middle-middle-square] (gain: 0.0834)
└─ = 0:
   └─ [bottom-left-square] (gain: 0.1056)
      └─ = 0:
         └─ [top-right-square] (gain: 0.9024)
            └─ = 1:
               └─ Class 0
            └─ = 2:
               └─ Class 1
      └─ = 1:
         └─ [top-right-square] (gain: 0.2782)
            └─ = 0:
               └─ Class 0
            └─ = 1:
               └─ Class 0
            └─ = 2:
               └─ [top-left-square] (gain: 0.1767)
                  └─ = 0:
                     └─ [bottom-right-square] (gain: 0.9183)
                        └─ = 1:
                           └─ Class 0
                        └─ = 2:
                           └─ Class 1
                  └─ = 1:
                     └─ [top-middle-square] (gain: 0.6058)
                        └─ = 0:
                           └─ [middle-left-square] (gain: 0.9183)
                              └─ = 1:
                                 └─ Class 0
                              └─ = 2:
                                 └─ Class 1
                        └─ = 1:
                           └─ Class 1
                        └─ = 2:
                           └─ Class 0
                  └─ = 2:
                     └─ [top-middle-square] (gain: 0.3392)
                        └─ = 0:
                           └─ [middle-left-square] (gain: 0.9183)
                              └─ = 0:
                                 └─ Class 0
                              └─ = 1:
                                 └─ Class 1
                              └─ = 2:
                                 └─ Class 0
```

```

    [-----]
    |   = 1:
    |   |   [middle-left-square] (gain: 0.9183)
    |   |   = 0:
    |   |   |   Class 1
    |   |   = 1:
    |   |   |   [middle-left-square] (gain: 0.9183)
    |   |   |   = 2:
    |   |   |   |   Class 0
    |   |   = 2:
    |   |   |   [top-right-square] (gain: 0.1225)
    |   |   = 0:
    |   |   |   Class 1
    |   |   = 1:
    |   |   |   [middle-right-square] (gain: 0.1682)
    |   |   |   = 0:
    |   |   |   |   Class 1
    |   |   |   = 1:
    |   |   |   |   [bottom-right-square] (gain: 0.9403)
    |   |   |   |   = 0:
    |   |   |   |   |   Class 1
    |   |   |   |   = 1:
    |   |   |   |   |   Class 0
    |   |   |   |   = 2:
    |   |   |   |   |   Class 1
    |   |   |   = 2:
    |   |   |   |   [top-left-square] (gain: 0.9183)
    |   |   |   = 0:
    |   |   |   |   Class 1
    |   |   |   = 1:
    |   |   |   |   Class 0
    |   |   |   = 2:
    |   |   |   |   Class 1
    |   |   = 2:
    |   |   |   Class 1
    |   = 1:
    |   |   [top-right-square] (gain: 0.0223)
    |   |   = 0:
    |   |   |   [bottom-left-square] (gain: 0.2247)
    |   |   |   = 0:
    |   |   |   |   Class 0
    |   |   |   = 1:
    |   |   = 2:
    |   |   |   [middle-right-square] (gain: 0.1159)
    |   |   = 0:
    |   |   |   [top-middle-square] (gain: 0.1772)
    |   |   |   = 0:
    |   |   |   |   Class 1
    |   |   |   = 1:
    |   |   |   |   [bottom-middle-square] (gain: 0.7219)
    |   |   |   |   = 1:
    |   |   |   |   |   Class 0
    |   |   |   |   = 2:
    |   |   |   |   |   Class 1
    |   |   |   = 2:
    |   |   |   |   [middle-left-square] (gain: 0.5000)
    |   |   |   = 0:
    |   |   |   |   Class 0
    |   |   |   = 1:
    |   |   |   |   Class 1
    |   |   |   = 2:
    |   |   |   |   [top-left-square] (gain: 1.0000)
    |   |   |   = 1:
    |   |   |   |   Class 0
    |   |   |   = 2:
    |   |   |   |   Class 1
    |   |   = 1:
    |   |   |   [middle-left-square] (gain: 0.9887)
    |   |   = 0:
    |   |   |   Class 1
    |   |   = 1:
    |   |   |   [middle-left-square] (gain: 0.9887)
    |   |   = 2:
    |   |   |   Class 1
    |   |   = 2:
    |   |   |   [bottom-middle-square] (gain: 0.2401)
    |   |   = 0:
    |   |   |   [top-left-square] (gain: 1.0000)
    |   |   |   = 1:
    |   |   |   |   Class 0
    |   |   |   = 2:
    |   |   |   |   Class 1
    |   |   = 1:
    |   |   |   Class 0
    |   |   = 2:

```

```

[bottom-right-square] (gain: 0.9710)
  = 1:
    [bottom-left-square] (gain: 0.4759)
      = 0:
        Class 0
      = 1:
        Class 0
      = 2:
        [top-middle-square] (gain: 0.1974)
          = 0:
            Class 1
          = 1:
            [top-left-square] (gain: 0.3436)
              = 0:
                [bottom-middle-square] (gain: 0.9183)
                  = 1:
                    Class 0
                  = 2:
                    Class 1
              = 1:
                Class 0
              = 2:
                [bottom-middle-square] (gain: 0.5917)
                  = 0:
                    Class 1
                  = 1:
                    Class 0
                  = 2:
                    Class 1
            = 2:
              [bottom-right-square] (gain: 0.1245)
                = 0:
                  [middle-left-square] (gain: 0.9183)
                    = 1:
                      Class 0
                    = 2:
                      Class 1
                = 1:
                  [bottom-middle-square] (gain: 0.5613)

[bottom-middle-square] (gain: 1.0000)
  = 0:
    [top-left-square] (gain: 0.6122)
      = 1:
        Class 0
      = 2:
        Class 1
  = 1:
    Class 1
  = 2:
    Class 0
  = 2:
    [bottom-middle-square] (gain: 0.6122)
      = 0:
        Class 0
      = 1:
        [middle-right-square] (gain: 0.9183)
          = 1:
            Class 1
          = 2:
            Class 0
      = 2:
        Class 1
  = 2:
    [bottom-right-square] (gain: 0.0776)
      = 0:
        [top-left-square] (gain: 0.3462)
          = 0:
            Class 0
          = 1:
            Class 0
          = 2:
            [top-middle-square] (gain: 0.7008)
              = 0:
                Class 0
              = 1:
                [middle-right-square] (gain: 0.7219)
                  = 0:
                    Class 0
                  = 1:
                    Class 1
                  = 2:
                    Class 0
              = 2:
                Class 0

```

```

    └── = 1:
        └── [top-left-square] (gain: 0.5439)
    └── = 0:
        └── Class 0
    └── = 1:
        └── Class 0
    └── = 2:
        └── [top-middle-square] (gain: 0.4688)
            └── = 0:
                └── [bottom-middle-square] (gain: 0.9183)
                    └── = 0:
                        └── Class 1
                    └── = 1:
                        └── Class 0
                    └── = 2:
                        └── Class 0
            └── = 1:
                └── [middle-right-square] (gain: 0.9183)
                    └── = 0:
                        └── Class 1
                    └── = 1:
                        └── Class 1
                    └── = 2:
                        └── Class 0
            └── = 2:
                └── Class 1
    └── = 2:
        └── [middle-right-square] (gain: 0.4731)
            └── = 0:
                └── [top-middle-square] (gain: 0.6465)
                    └── = 0:
                        └── Class 1
                    └── = 1:
                        └── Class 0
                    └── = 2:
                        └── [top-left-square] (gain: 0.8113)
                            └── = 1:
                                └── Class 0
                            └── = 2:
                                └── Class 1
            └── = 1:
                └── [middle-left-square] (gain: 0.3995)
    └── = 0:
        └── [bottom-middle-square] (gain: 0.8113)
            └── = 0:
                └── Class 1
            └── = 1:
                └── Class 0
            └── = 2:
                └── Class 1
    └── = 1:
        └── Class 0
    └── = 2:
        └── [top-middle-square] (gain: 0.8113)
            └── = 1:
                └── Class 0
            └── = 2:
                └── Class 1
    └── = 2:
        └── Class 1
    └── = 0:
        └── [top-left-square] (gain: 0.1239)
            └── = 0:
                └── Class 1
            └── = 1:
                └── [bottom-middle-square] (gain: 0.1032)
                    └── = 0:
                        └── [middle-left-square] (gain: 0.1605)
                            └── = 0:
                                └── Class 1
                            └── = 1:
                                └── [bottom-left-square] (gain: 1.0000)
                                    └── = 1:
                                        └── Class 0
                                    └── = 2:
                                        └── Class 1
                    └── = 1:
                        └── [middle-right-square] (gain: 0.5917)
                            └── = 0:
                                └── Class 0
                            └── = 1:
                                └── Class 1
                            └── = 2:
                                └── Class 1

```

```

    └── = 2:
        └── class 1
    └── = 1:
        └── Class 1
    └── = 2:
        └── [top-middle-square] (gain: 0.4591)
            └── = 0:
                └── [middle-right-square] (gain: 0.9183)
                    └── = 0:
                        └── Class 0
                    └── = 1:
                        └── class 1
                    └── = 2:
                        └── Class 0
            └── = 1:
                └── [top-right-square] (gain: 0.6122)
                    └── = 0:
                        └── Class 1
                    └── = 1:
                        └── class 0
                    └── = 2:
                        └── [middle-right-square] (gain: 0.9183)
                            └── = 0:
                                └── Class 1
                            └── = 1:
                                └── Class 1
                            └── = 2:
                                └── Class 0
            └── = 2:
                └── class 1
    └── = 1:
        └── [top-left-square] (gain: 0.0713)
            └── = 0:
                └── [middle-right-square] (gain: 0.0760)
                    └── = 0:
                        └── [bottom-left-square] (gain: 0.2454)
                            └── = 0:
                                └── class 1
                            └── = 1:
                                └── [bottom-middle-square] (gain: 0.9710)
                                    └── = 1:
                                        └── class 0
    └── = 2:
        └── class 0
            └── = 2:
                └── class 1
            └── = 2:
                └── Class 1
    └── = 1:
        └── [top-right-square] (gain: 0.7207)
            └── = 0:
                └── Class 1
            └── = 1:
                └── Class 0
            └── = 2:
                └── [middle-left-square] (gain: 0.3060)
                    └── = 0:
                        └── Class 1
                    └── = 1:
                        └── Class 1
                    └── = 2:
                        └── [top-middle-square] (gain: 1.0000)
                            └── = 0:
                                └── class 1
                            └── = 2:
                                └── class 0
            └── = 2:
                └── [middle-left-square] (gain: 0.2293)
                    └── = 0:
                        └── [top-middle-square] (gain: 0.5000)
                            └── = 0:
                                └── Class 0
                            └── = 1:
                                └── Class 1
                            └── = 2:
                                └── [top-right-square] (gain: 1.0000)
                                    └── = 0:
                                        └── Class 0
                                    └── = 1:
                                        └── Class 1
            └── = 1:
                └── [bottom-left-square] (gain: 0.3219)
                    └── = 0:
                        └── Class 1
                    └── = 1:
                        └── [top-right-square] (gain: 1.0000)

```

```

    └── = 0:
        └── Class 1
    └── = 2:
        └── Class 0
    └── = 2:
        └── Class 1
    └── = 2:
        └── Class 1
    └── = 1:
        └── [bottom-left-square] (gain: 0.1145)
    └── = 0:
        └── Class 1
    └── = 1:
        └── [middle-left-square] (gain: 0.3407)
    └── = 0:
        └── [bottom-middle-square] (gain: 0.9183)
        └── = 1:
            └── Class 0
        └── = 2:
            └── Class 1
    └── = 1:
        └── Class 0
    └── = 2:
        └── [bottom-middle-square] (gain: 0.6500)
        └── = 0:
            └── Class 1
        └── = 1:
            └── Class 0
        └── = 2:
            └── Class 0
    └── = 2:
        └── [top-right-square] (gain: 0.1913)
    └── = 0:
        └── Class 1
    └── = 1:
        └── [top-middle-square] (gain: 0.3774)
        └── = 0:
            └── Class 1
        └── = 1:
            └── Class 0
        └── = 2:
            └── [middle-right-square] (gain: 0.8113)
    └── = 0:
        └── Class 0
└── = 2:
    └── = 2:
        └── Class 1
    └── = 0:
        └── [top-right-square] (gain: 0.0821)
    └── = 0:
        └── [bottom-left-square] (gain: 0.3436)
    └── = 0:
        └── Class 1
    └── = 1:
        └── [bottom-middle-square] (gain: 0.9852)
        └── = 0:
            └── Class 1
        └── = 1:
            └── Class 0
        └── = 2:
            └── Class 1
    └── = 2:
        └── Class 1
    └── = 1:
        └── [middle-right-square] (gain: 0.4301)
    └── = 0:
        └── [bottom-middle-square] (gain: 0.9183)
    └── = 0:
        └── Class 1
    └── = 1:
        └── Class 0
    └── = 2:
        └── = 0:
            └── Class 0
        └── = 1:
            └── [middle-left-square] (gain: 0.6100)
            └── = 0:
                └── Class 0
            └── = 1:
                └── [bottom-left-square] (gain: 0.9183)
                └── = 1:
                    └── Class 1
                └── = 2:
                    └── Class 0
            └── = 2:
                └── Class 1

```

The figure displays a decision tree structure. The root node is a square labeled [top-middle-square] (gain: 0.8113). It splits into three branches based on the value of the feature: 0, 1, and 2. The '0' branch leads to a leaf node labeled Class 0. The '1' branch leads to a node labeled [middle-right-square] (gain: 0.0689), which further splits into bottom-left-square (gain: 0.1984) and middle-left-square (gain: 0.5917). The bottom-left-square node splits into 0, 1, and 2, leading to Class 0, Class 1, and Class 0 respectively. The middle-left-square node splits into 0, 1, and 2, leading to Class 1, Class 0, and Class 0 respectively. The '2' branch of the root node leads to a node labeled [top-left-square] (gain: 0.2780), which splits into 0, 1, and 2. The '0' branch leads to a leaf node labeled Class 1. The '1' branch leads to a node labeled [middle-left-square] (gain: 0.4046), which splits into 0, 1, and 2, leading to Class 1, Class 1, and Class 0 respectively. The '2' branch leads to a node labeled [bottom-left-square] (gain: 0.9183), which splits into 1, 2, and 2, leading to Class 0, Class 1, and Class 1 respectively. This structure continues down the tree, with further splits and class distributions at each subsequent node.

#### OVERALL PERFORMANCE METRICS

---

Accuracy: 0.8723 (87.23%)  
Precision (weighted): 0.8734  
Recall (weighted): 0.8723  
F1-Score (weighted): 0.8728  
Precision (macro): 0.8586  
Recall (macro): 0.8634  
F1-Score (macro): 0.8669

#### TREE COMPLEXITY METRICS

---

Maximum Depth: 7  
Total Nodes: 283  
Leaf Nodes: 181  
Internal Nodes: 102

### 3. Nursery dataset

#### Basic testing:

```
PS C:\Users\chiru\OneDrive\Desktop\Week 3 - Student folder\Week 3 - Student folder\sklearn_implementation> python test.py --ID EC_E_PES20G23CS310_Lab3 --data ..\Data\datasets\nursery.csv --framework sklearn
Running tests with SKLEARN framework
=====
target column: 'class' (last column)
Original dataset info:
Shape: (12960, 9)
Columns: ['parents', 'has_nurs', 'form', 'children', 'housing', 'finance', 'social', 'health', 'class']

First few rows:
parents: ['usual' 'pretentious' 'great_pret'] -> [2 1 0]
has_nurs: ['proper' 'less_proper' 'improper' 'critical' 'very_crit'] -> [3 2 1 0 4]
form: ['complete' 'completed' 'incomplete' 'foster'] -> [0 1 3 2]
class: ['recommend' 'priority' 'not_recom' 'very_recom' 'spec_prior'] -> [2 1 0 4 3]

Processed dataset shape: (12960, 9)
Number of features: 8
Features: ['parents', 'has_nurs', 'form', 'children', 'housing', 'finance', 'social', 'health']
Target: class
Framework: SKLEARN
Data type: <class 'numpy.ndarray'>

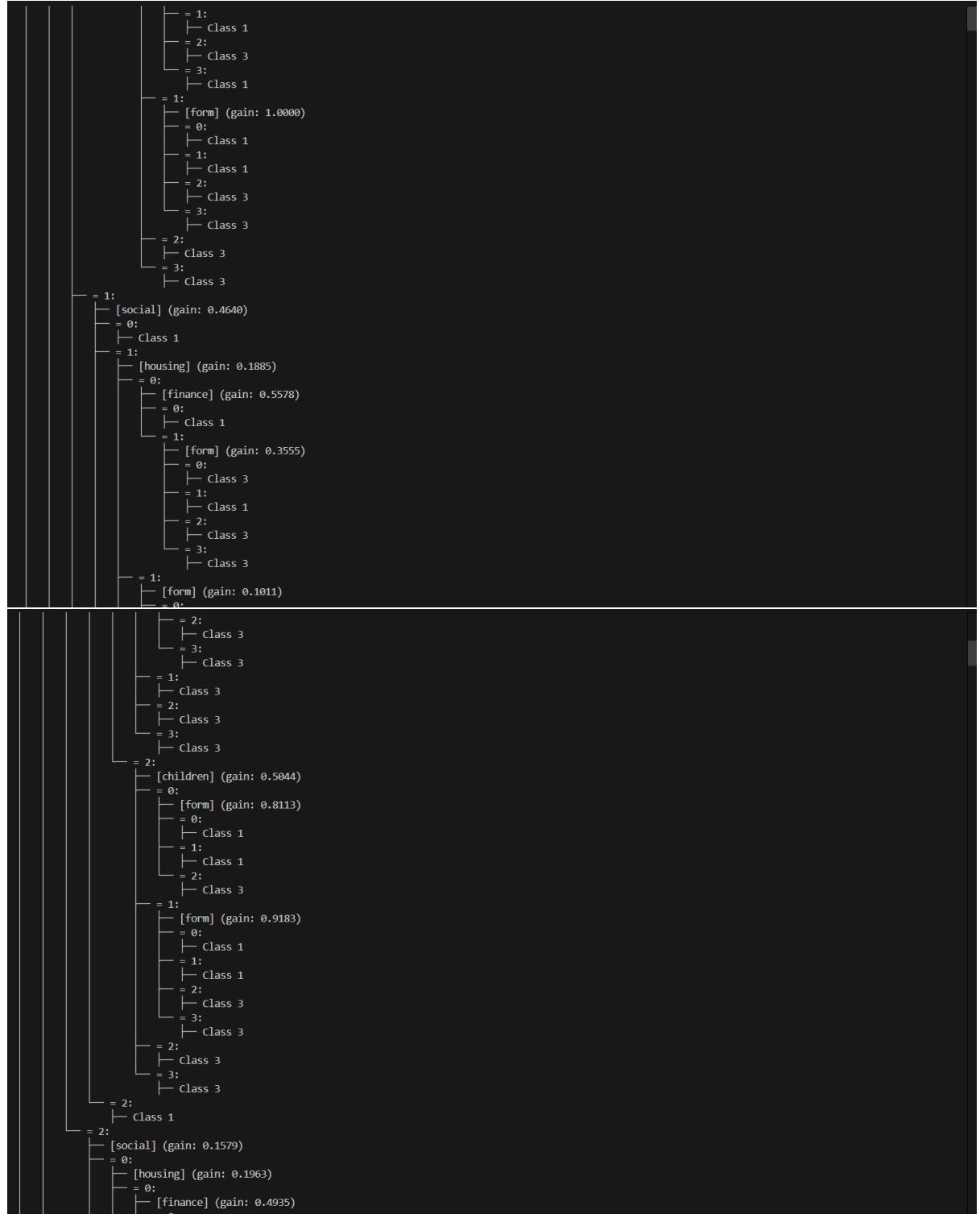
=====
DECISION TREE CONSTRUCTION DEMO
=====
Total samples: 12960
Training samples: 10368
Testing samples: 2592

Constructing decision tree using training data...
✓ Decision tree construction completed using SKLEARN!

📊 OVERALL PERFORMANCE METRICS
=====
Accuracy: 0.9887 (98.87%)
Precision (weighted): 0.9888
Recall (weighted): 0.9887
F1-Score (weighted): 0.9887
Precision (macro): 0.9577
Recall (macro): 0.9576
F1-Score (macro): 0.9576

✓ TREE COMPLEXITY METRICS
=====
Maximum Depth: 7
Total Nodes: 983
Leaf Nodes: 703
Internal Nodes: 280
```

## Testing visualization:



```

[form] (gain: 0.6058)
= 0:
  Class 4
= 1:
  Class 4
= 2:
  Class 1
= 3:
  Class 1

= 1:
  [form] (gain: 0.1554)
  = 0:
    [children] (gain: 0.8631)
    = 0:
      Class 4
    = 1:
      Class 1
    = 2:
      Class 1
    = 3:
      Class 1
    = 1:
      Class 1
    = 2:
      Class 1
    = 3:
      Class 1

  = 2:
    [children] (gain: 0.5185)
    = 0:
      [form] (gain: 0.7219)
      = 0:
        Class 4
      = 1:
        Class 4
      = 2:
        Class 1
      = 3:
        Class 4
    = 1:
      [form] (gain: 0.9710)
      = 0:
        Class 4

[form] (gain: 0.1933)
= 0:
  [finance] (gain: 0.4243)
  = 0:
    Class 4
  = 1:
    [children] (gain: 0.4228)
    = 0:
      Class 4
    = 1:
      Class 1
    = 2:
      Class 1
    = 3:
      Class 1

  = 1:
    [children] (gain: 0.1793)
    = 0:
      [form] (gain: 0.9183)
      = 0:
        Class 4
      = 1:
        Class 1
      = 2:
        Class 1
      = 3:
        Class 1
    = 1:
      Class 1
    = 2:
      Class 1
    = 3:
      Class 1

  = 2:
    [children] (gain: 0.4667)
    = 0:

```

```
      [form] (gain: 0.8524)
      = 0:
        |--- class 1
      = 1:
        |--- class 3
      = 2:
        |--- class 3
      = 3:
        |--- class 3
      = 1:
        |--- class 3
      = 2:
        |--- class 3
      = 3:
        |--- class 3
    = 2:
      |--- [children] (gain: 0.4085)
      |--- = 0:
          |--- [form] (gain: 0.8524)
          |--- = 0:
              |--- class 1
          = 1:
              |--- class 1
          = 2:
              |--- class 3
          = 3:
              |--- class 1
      = 1:
        |--- [form] (gain: 0.9928)
        |--- = 0:
            |--- class 1
        = 1:
            |--- class 1
        = 2:
            |--- class 3
        = 3:
            |--- class 3
      = 2:
        |--- class 3
      = 3:
        |--- class 3
```

OVERALL PERFORMANCE METRICS

```
=====
Accuracy: 0.9867 (98.67%)
Precision (weighted): 0.9876
Recall (weighted): 0.9867
F1-Score (weighted): 0.9872
Precision (macro): 0.7604
Recall (macro): 0.7654
F1-Score (macro): 0.7628
```

TREE COMPLEXITY METRICS

```
=====
Maximum Depth: 7
Total Nodes: 952
Leaf Nodes: 680
Internal Nodes: 272
```