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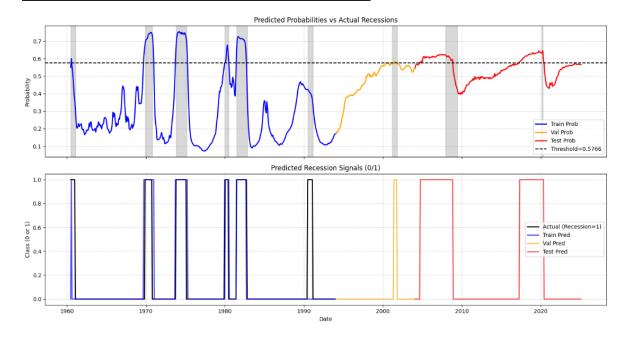
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LSTM 1m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	12
recession	1m recession

```
LSTM for dataset 1959 - 1m recession
Accuracy : 0.6877
Precision : 0.1609
Recall
          : 0.7000
F1 Score
         : 0.2617
ROC-AUC
          : 0.6326
PR-AUC
          : 0.1274
Classification Report:
             precision
                          recall f1-score
                                             support
        0.0
                0.9639
                          0.6867
                                    0.8020
                                                 233
                0.1609
                          0.7000
        1.0
                                    0.2617
                                                  20
                                    0.6877
                                                 253
   accuracy
  macro avg
                0.5624
                          0.6933
                                    0.5318
                                                 253
weighted avg
                0.9004
                          0.6877
                                    0.7593
                                                 253
```

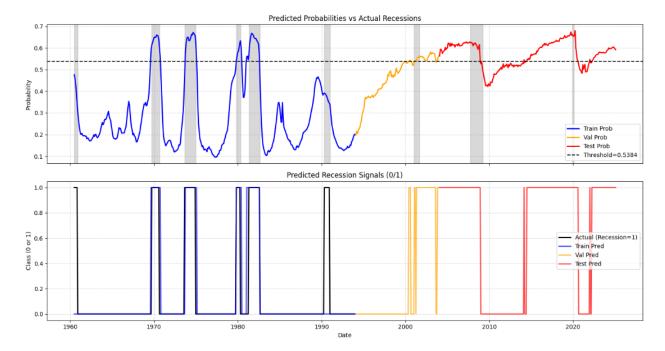
```
# --- W&B INIT ---
wandb.init(
    project="us-recession-lstm",
    config={
        "seq_length": 12,
        "lstm_units": 32,
        "dense_units": 16,
        "dropout": 0.1,
        "batch_size": 32,
        "learning_rate": 0.001,
        "epochs": 50,
}
```



LSTM 3m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	12
recession	3m recession

```
Accuracy : 0.3834
Precision : 0.1000
Recall
          : 0.8500
F1 Score
          : 0.1789
ROC-AUC
          : 0.6833
          : 0.1373
PR-AUC
Classification Report:
             precision
                          recall f1-score
                                             support
        0.0
                0.9639
                          0.3433
                                    0.5063
                                                 233
                0.1000
                          0.8500
                                    0.1789
        1.0
                                                 20
                                    0.3834
    accuracy
                0.5319
   macro avg
                          0.5967
                                    0.3426
                                                 253
weighted avg
                0.8956
                          0.3834
                                    0.4804
                                                 253
```

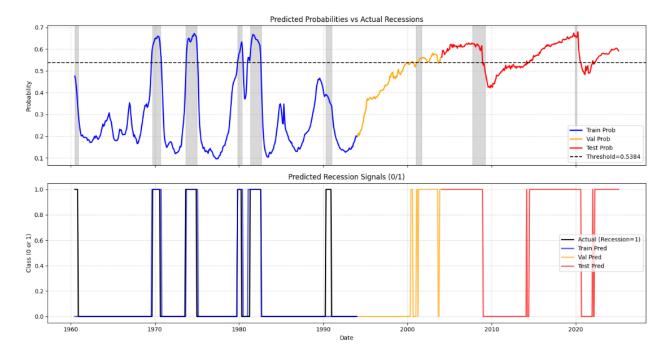


LSTM 6m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	12
recession	6m recession

```
LSTM for dataset 1959 - 1m recession
Accuracy : 0.1976
Precision : 0.0897
Recall
          : 1.0000
F1 Score : 0.1646
ROC-AUC
          : 0.6760
PR-AUC
          : 0.1545
Classification Report:
             precision
                          recall f1-score
                                             support
                1.0000
                                                 233
        0.0
                          0.1288
                                    0.2281
        1.0
                0.0897
                          1.0000
                                    0.1646
                                                 20
                                    0.1976
    accuracy
   macro avg
                0.5448
                          0.5644
                                    0.1964
weighted avg
                0.9280
                          0.1976
                                    0.2231
                                                 253
```

```
# --- W&B INIT ---
wandb.init(
    project="us-recession-lstm",
    config={
        "seq_length": 12,
        "lstm_units": 32,
        "dense_units": 16,
        "dropout": 0.1,
        "batch_size": 32,
        "learning_rate": 0.001,
        "epochs": 50,
}
```

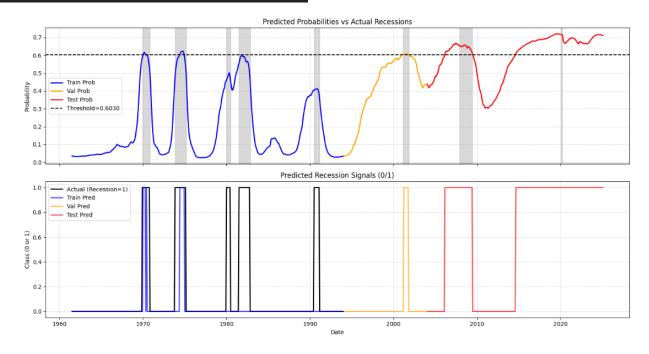


BiLSTM 1m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	24
recession	1m recession

```
BiLSTM for dataset 1959 - 1m recession
Accuracy : 0.4229
Precision : 0.1205
Recall
          : 1.0000
F1 Score
          : 0.2151
ROC-AUC
          : 0.5152
PR-AUC
           : 0.0869
Classification Report:
             precision
                          recall f1-score
                                             support
                 1.0000
                          0.3734
                                    0.5437
        0.0
        1.0
                 0.1205
                          1.0000
                                    0.2151
                                                 20
                                    0.4229
    accuracy
                                                 253
   macro avg
                0.5602
                          0.6867
                                    0.3794
                                                 253
weighted avg
                0.9305
                          0.4229
                                    0.5178
                                                 253
```

```
wandb.init(
   project="us-recession-lstm",
   config={
        "seq_length": 24,
        "lstm_units": 64,
        "dense_units": 32,
        "dropout": 0.1,
        "batch_size": 64,
        "learning_rate": 0.001,
        "epochs": 100,
        #"threshold": 0.4
}
```

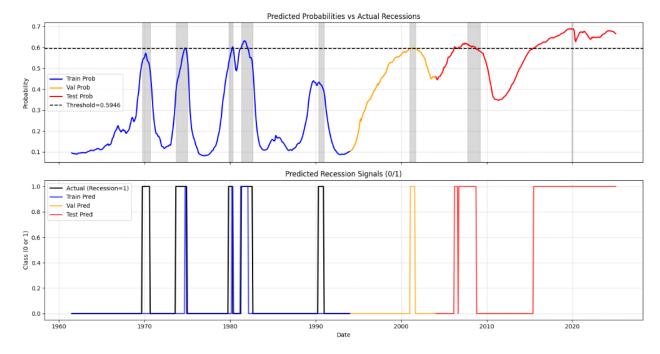


BiLSTM 3m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	24
recession	3m recession

```
BiLSTM for dataset 1959 - 3m recession
Accuracy : 0.4625
Precision : 0.1027
Recall
           : 0.7500
F1 Score
         : 0.1807
ROC-AUC
           : 0.5219
PR-AUC
           : 0.1189
Classification Report:
                           recall f1-score
              precision
                                              support
         0.0
                 0.9533
                           0.4378
                                     0.6000
                                                  233
         1.0
                 0.1027
                           0.7500
                                     0.1807
                                                   20
    accuracy
                                     0.4625
                                                  253
   macro avg
                 0.5280
                           0.5939
                                     0.3904
                                                  253
weighted avg
                 0.8860
                           0.4625
                                     0.5669
                                                  253
```

```
# --- W&B INIT ---
wandb.init(
    project="us-recession-lstm",
    config={
        "seq_length": 24,
        "lstm_units": 64,
        "dense_units": 32,
        "dropout": 0.1,
        "batch_size": 64,
        "learning_rate": 0.001,
        "epochs": 100,
        #"threshold": 0.4
    }
)
```

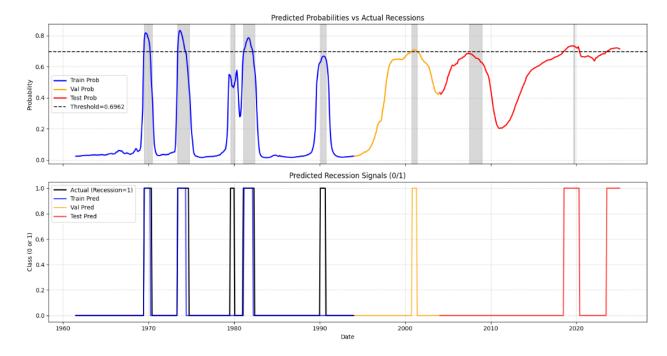


BiLSTM 6m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	24
recession	6m recession

```
BiLSTM for dataset 1959 - 6m recession
Accuracy : 0.7747
Precision : 0.0488
Recall
          : 0.1000
F1 Score
          : 0.0656
ROC-AUC
          : 0.6785
PR-AUC
          : 0.1791
Classification Report:
             precision
                          recall f1-score
                                             support
         0.0
                0.9151
                          0.8326
                                    0.8719
                                                 233
        1.0
                0.0488
                          0.1000
                                    0.0656
                                                  20
                                    0.7747
   accuracy
  macro avg
                0.4819
                          0.4663
                                    0.4687
                                                 253
weighted avg
                0.8466
                          0.7747
                                    0.8082
                                                 253
```

```
# --- W&B INIT ---
wandb.init(
    project="us-recession-lstm",
    config={
        "seq_length": 24,
        "lstm_units": 64,
        "dense_units": 32,
        "dropout": 0.1,
        "batch_size": 64,
        "learning_rate": 0.001,
        "epochs": 100,
        #"threshold": 0.4
    }
)
```

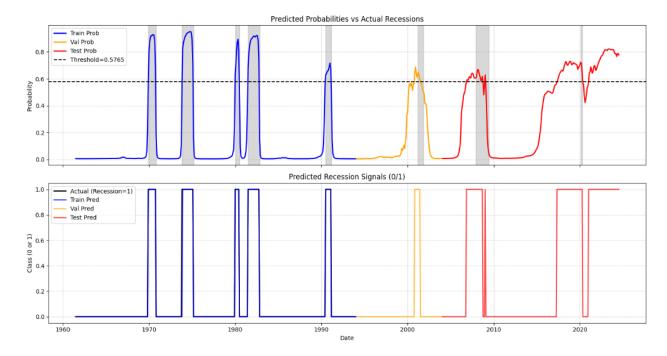


GRU 1m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	24
recession	1m recession

```
GRU for dataset 1959 - 1m recession
Accuracy
          : 0.6057
Precision : 0.1262
Recall
          : 0.6500
F1 Score
         : 0.2114
ROC-AUC
          : 0.6288
PR-AUC
          : 0.1015
Classification Report:
                           recall f1-score
              precision
                                              support
                          0.6018
         0.0
                 0.9510
                                    0.7371
                                                  226
                 0.1262
                           0.6500
                                    0.2114
                                                   20
         1.0
   accuracy
                                     0.6057
                                                  246
  macro avg
                 0.5386
                           0.6259
                                     0.4743
                                                  246
weighted avg
                 0.8840
                           0.6057
                                     0.6944
                                                  246
```

```
# --- W&B INIT ---
wandb.init(
    project="us-recession-lstm",
    config={
        "seq_length": 24,
        "lstm_units": 64,
        "dense_units": 32,
        "dropout": 0.2,
        "batch_size": 64,
        "learning_rate": 0.001,
        "epochs": 100,
        #"threshold": 0.4
    }
)
```

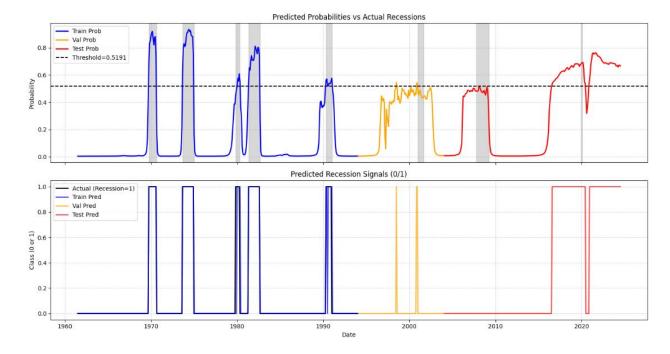


GRU 3m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	24
recession	3m recession

```
GRU for dataset 1959 - 3m recession
Accuracy: 0.5650
Precision : 0.0220
          : 0.1000
Recall
F1 Score
          : 0.0360
ROC-AUC
           : 0.5889
PR-AUC
           : 0.0941
Classification Report:
              precision
                           recall f1-score
                                             support
                0.8839
         0.0
                           0.6062
                                    0.7192
                                                  226
         1.0
                0.0220
                           0.1000
                                    0.0360
                                                  20
                                     0.5650
                                                 246
    accuracy
  macro avg
                0.4529
                           0.3531
                                     0.3776
                                                 246
weighted avg
                                     0.6636
                0.8138
                           0.5650
                                                 246
```

```
# --- W&B INIT ---
wandb.init(
    project="us-recession-lstm",
    config={
        "seq_length": 24,
        "lstm_units": 64,
        "dense_units": 32,
        "dropout": 0.2,
        "batch_size": 64,
        "learning_rate": 0.001,
        "epochs": 100,
        #"threshold": 0.4
    }
)
```

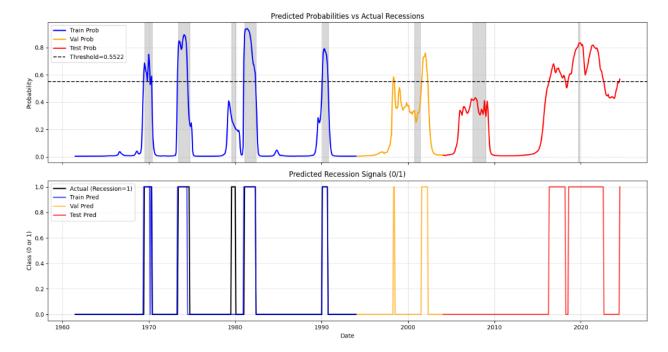


GRU 6m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	24
recession	6m recession

```
GRU for dataset 1959 - 6m recession
Accuracy : 0.6382
Precision : 0.0274
Recall
          : 0.1000
F1 Score
          : 0.0430
ROC-AUC
          : 0.5538
PR-AUC
          : 0.1067
Classification Report:
             precision
                          recall f1-score
                                             support
        0.0
                0.8960
                          0.6858
                                    0.7769
                                                 226
        1.0
                0.0274
                          0.1000
                                    0.0430
                                                  20
   accuracy
                                    0.6382
                                                 246
  macro avg
                0.4617
                          0.3929
                                    0.4100
                                                 246
weighted avg
                0.8253
                          0.6382
                                    0.7173
                                                 246
```

```
# --- W&B INIT ---
wandb.init(
    project="us-recession-lstm",
    config={
        "seq_length": 24,
        "lstm_units": 64,
        "dense_units": 32,
        "dropout": 0.2,
        "batch_size": 64,
        "learning_rate": 0.001,
        "epochs": 100,
        #"threshold": 0.4
    }
)
```

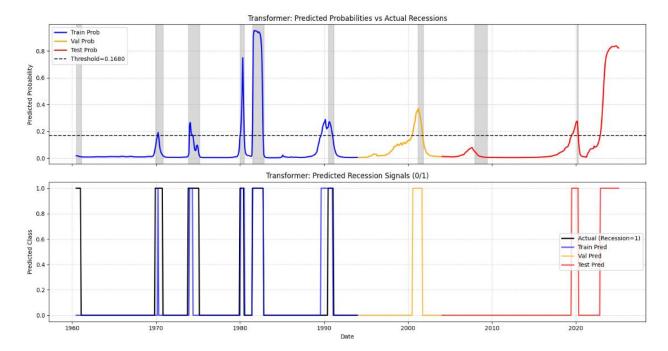


Transformer 1m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	12
recession	1m recession

```
Transformer Model Results 1m recession
Accuracy : 0.7905
Precision : 0.0541
Recall : 0.1000
F1 Score : 0.0702
          : 0.5255
ROC-AUC
PR-AUC
           : 0.0799
Classification Report:
                           recall f1-score
              precision
                                               support
         0.0
                 0.9167
                           0.8498
                                     0.8820
         1.0
                 0.0541
                           0.1000
                                     0.0702
   accuracy
                                      0.7905
                 0.4854
                           0.4749
  macro avg
                                      0.4761
                                                   253
weighted avg
                 0.8485
                           0.7905
                                      0.8178
```

```
wandb.init(
    project="us-recession-transformer",
    config={
        "seq_length": 12,
        "d_model": 32,
        "num_heads": 2,
        "ff_dim": 64,
        "num_layers": 1,
        "dropout": 0.1,
        "batch_size": 32,
        "learning_rate": 0.001,
        "epochs": 100,
    }
}
```

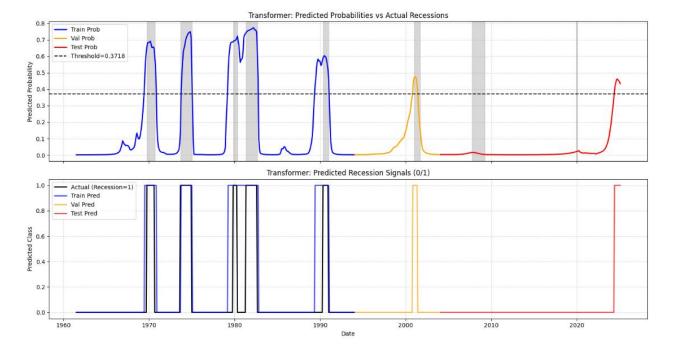


Transformer 3m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	24
recession	3m recession

```
Transformer Model Results 3m recession
Accuracy : 0.8814
Precision: 0.0000
Recall
          : 0.0000
F1 Score : 0.0000
ROC-AUC
          : 0.6964
PR-AUC
          : 0.1180
Classification Report:
                          recall f1-score
             precision
                                             support
        0.0
                0.9177
                          0.9571
                                    0.9370
                                                 233
        1.0
                0.0000
                          0.0000
                                    0.0000
                                                 20
   accuracy
                                    0.8814
                                                 253
   macro avg
                0.4588
                          0.4785
                                    0.4685
                                                 253
weighted avg
                0.8452
                          0.8814
                                    0.8629
                                                 253
```

```
wandb.init(
    project="us-recession-transformer",
    config={
        "seq_length": 24,
        "d_model": 32,
        "num_heads": 2,
        "ff_dim": 64,
        "num_layers": 1,
        "dropout": 0.2,
        "batch_size": 32,
        "learning_rate": 0.001,
        "epochs": 100,
    }
)
```

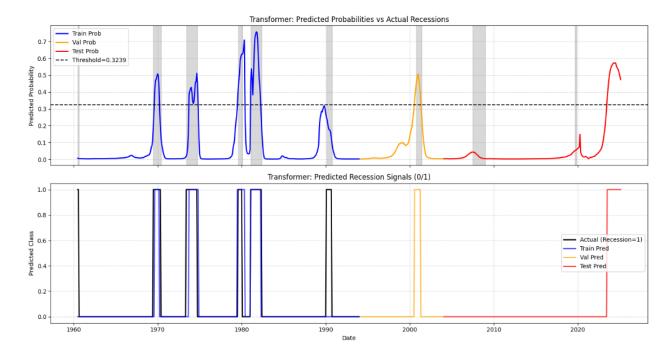


Transformer 6m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Using validation set (f1 score)
Seq_length	12
recession	6m recession

```
Transformer Model Results 6m recession
Accuracy : 0.8419
Precision : 0.0000
Recall
          : 0.0000
F1 Score
          : 0.0000
ROC-AUC
          : 0.6908
PR-AUC
          : 0.1187
Classification Report:
              precision
                          recall f1-score
                                             support
                          0.9142
                0.9142
                                    0.9142
                                                 233
        0.0
                0.0000
                          0.0000
                                    0.0000
                                                  20
         1.0
    accuracy
                                    0.8419
   macro avg
                0.4571
                          0.4571
                                    0.4571
                                                 253
weighted avg
                0.8419
                           0.8419
                                    0.8419
                                                 253
```

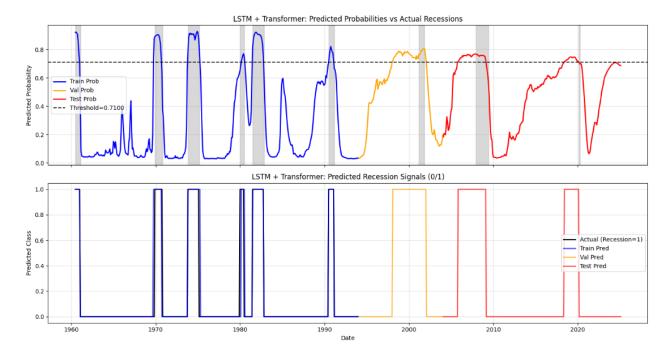
```
wandb.init(
    project="us-recession-transformer",
    config={
        "seq_length": 12,
        "d_model": 32,
        "num_heads": 2,
        "ff_dim": 64,
        "num_layers": 1,
        "dropout": 0.1,
        "batch_size": 32,
        "learning_rate": 0.001,
        "epochs": 100,
    }
)
```



LSTM + Transformer 1m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Hardcoded
Seq_length	12
recession	1m recession

```
Hybrid LSTM + Transformer Model Results - 1m recession
Accuracy : 0.8063
Precision : 0.2623
Recall : 0.8000
F1 Score : 0.3951
         : 0.8936
ROC-AUC
PR-AUC
          : 0.3678
Classification Report:
             precision
                         recall f1-score support
                0.9792
        0.0
                         0.8069
                                   0.8847
                                                233
        1.0
                0.2623
                         0.8000
                                   0.3951
                                                20
                                   0.8063
                                                253
   accuracy
                0.6207
                         0.8034
                                   0.6399
  macro avg
                                                253
weighted avg
                0.9225
                         0.8063
                                   0.8460
                                                253
```

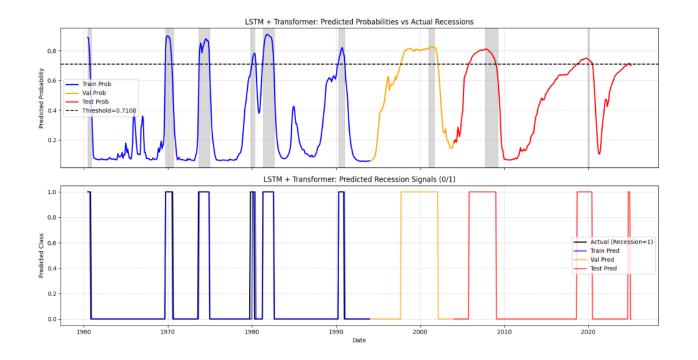


LSTM + Transformer 3m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Hardcoded
Seq_length	12
recession	3m recession

```
Hybrid LSTM + Transformer Model Results - 3m recession
Accuracy : 0.8103
Precision : 0.2812
Recall
          : 0.9000
F1 Score
         : 0.4286
ROC-AUC
          : 0.9167
PR-AUC
          : 0.5073
Classification Report:
             precision
                          recall f1-score
                                             support
        0.0
                0.9894
                          0.8026
                                    0.8863
                          0.9000
                                    0.4286
                0.2812
        1.0
                                                  20
   accuracy
                                    0.8103
                                                 253
                0.6353
   macro avg
                          0.8513
                                    0.6574
                                                 253
weighted avg
                0.9334
                                    0.8501
                          0.8103
                                                 253
```

```
wandb.init(
  project="us-recession-transformer-lstm-hybrid",
  config={
        "seq_length": 12,
        "lstm_units": 64,
        "d_model":32,
        "num_heads": 2,
        "ff_dim": 64,
        "num_layers": 1,
        "dropout": 0.18,
        "batch_size": 16,
        "learning_rate": 5e-4,
        "epochs": 200,
        "focal_gamma": 2.0,
        "focal_alpha": 0.9,
        "use_class_weight": True,
        "class_weight_pos": 12.0,
}
```

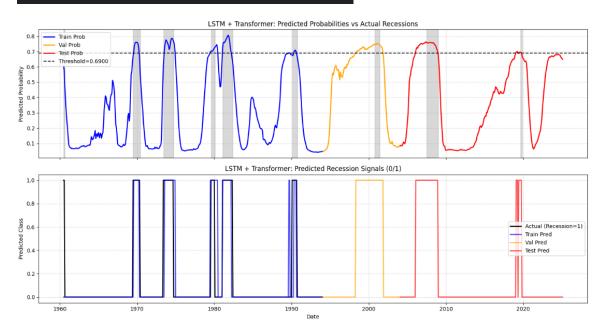


LSTM + Transformer 6m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Class imbalance	Focal loss
Early stopping Used	Yes – val_pr_auc
Threshold selected	Hardcoded
Seq_length	12
recession	6m recession

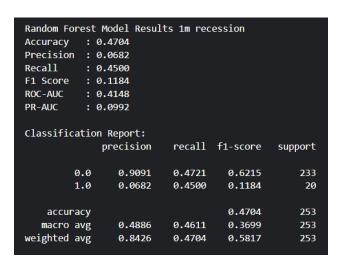
```
Hybrid LSTM + Transformer Model Results - 6m recession
Accuracy : 0.9091
Precision : 0.4651
Recall : 1.0000
F1 Score : 0.6349
ROC-AUC
          : 0.9680
PR-AUC
           : 0.6273
Classification Report:
              precision
                             recall f1-score
                                                 support
                  1.0000
         0.0
                             0.9013
                                       0.9481
         1.0
                  0.4651
                             1.0000
                                       0.6349
                                                      20
    accuracy
                                       0.9091
                                                      253
   macro avg
                  0.7326
                             0.9506
                                        0.7915
                                                      253
weighted avg
                  0.9577
                             0.9091
                                       0.9233
                                                      253
```

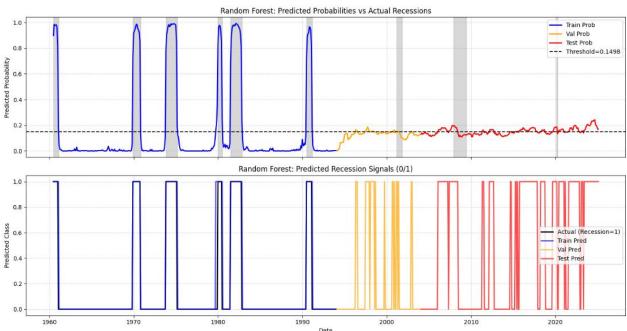




Random Forest 1m recession

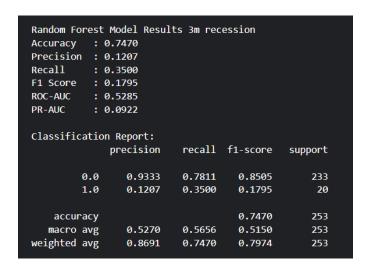
Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	1m recession

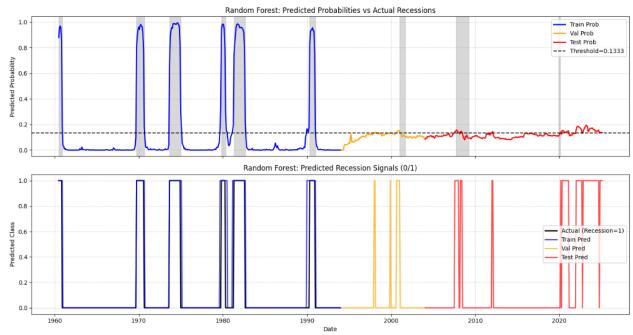




Random Forest 3m recession

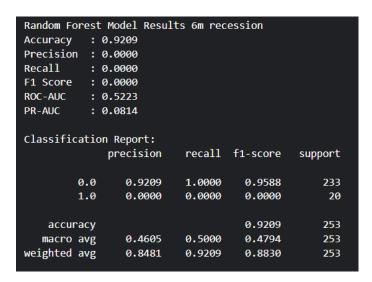
Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	3m recession

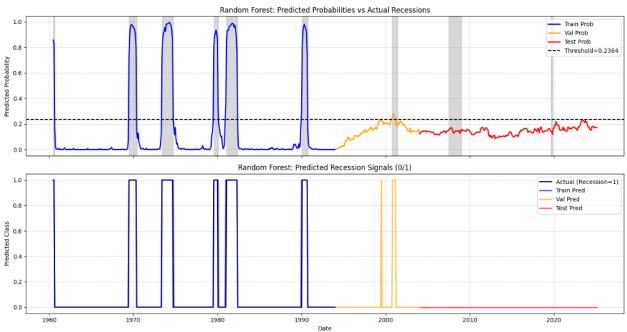




Random Forest 6m recession

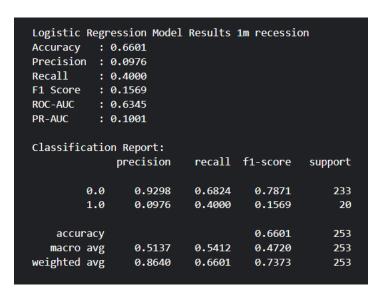
Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	6m recession

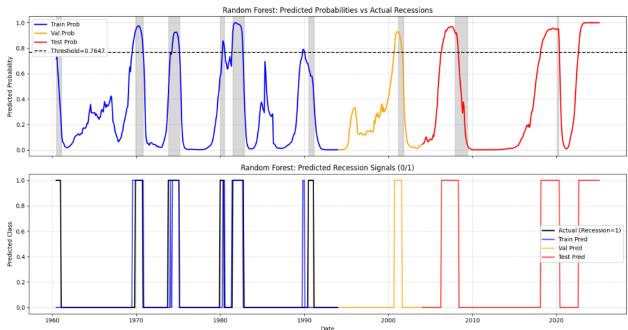




Logistic Regression 1m recession

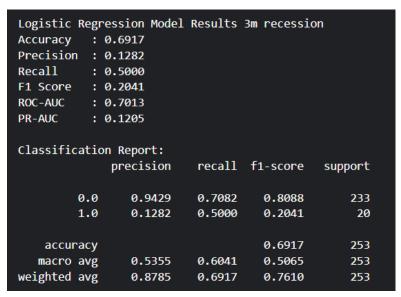
Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	1m recession

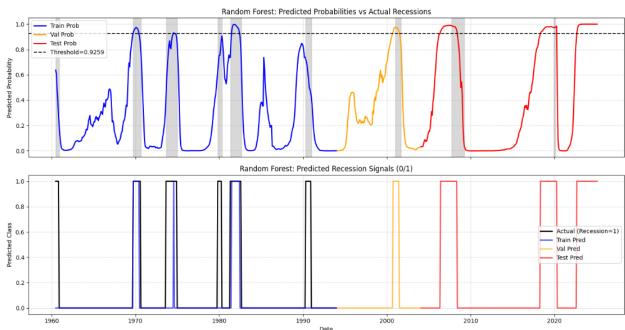




Logistic Regression 3m recession

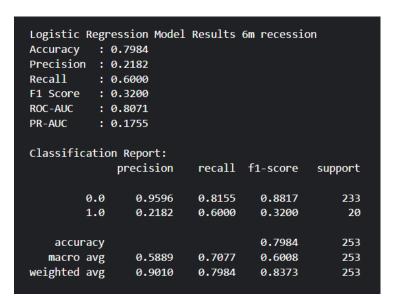
Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	3m recession

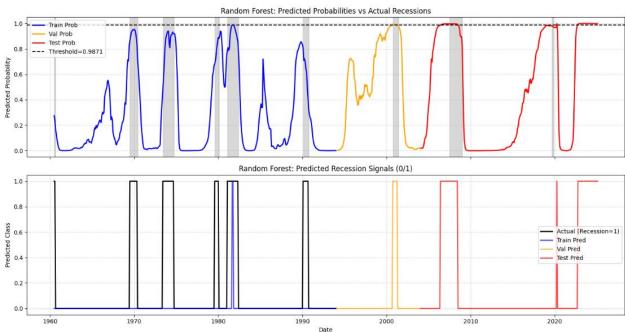




Logistic Regression 6m recession

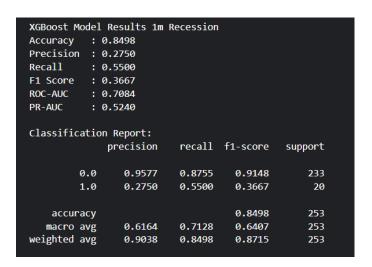
Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	6m recession

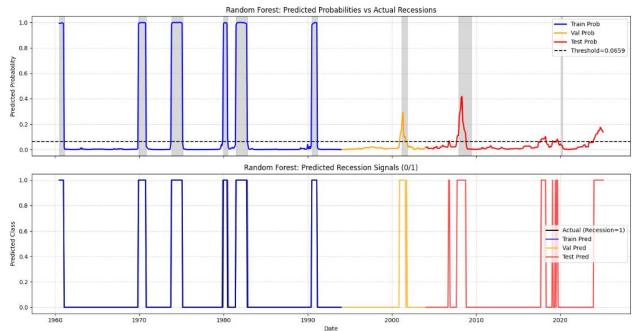




Xgboost 1m recession

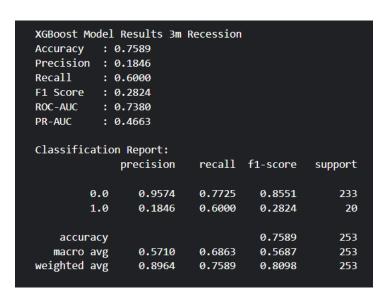
Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	1m recession

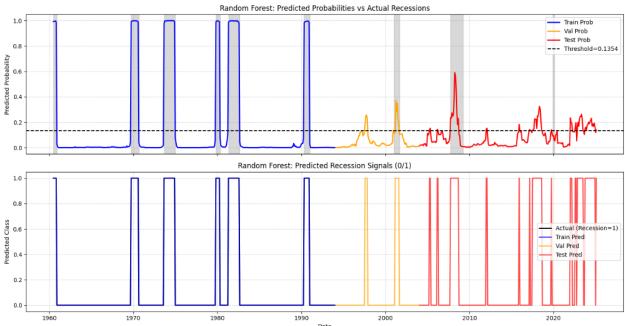




Xgboost 3m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	3m recession





Xgboost 6m recession

Dataset	1959 -07-01 to 2025 -08-01
Train test split	Fixed Date method
	Train end -1994, Val end -2004
Threshold selected	Using validation set (f1 score)
recession	6m recession

