

## imdb-bt-ex12-2

November 25, 2024

Name: Võ Hồng Quân Student ID: 22134012

```
[1]: import time
import plotly.graph_objects as go
from keras.datasets import imdb
from keras.preprocessing.sequence import pad_sequences
from keras.optimizers import Adam
from keras import Input
from keras.models import Sequential
from keras.layers import Embedding, SimpleRNN, LSTM, GRU, Dense, Bidirectional
```

```
[2]: # Chỉ sử dụng 10.000 từ phổ biến nhất
vocab_size = 10000

# Tải dữ liệu IMDB
(x_train, y_train), (x_test, y_test) = imdb.load_data(num_words=vocab_size)

# Khởi tạo max_length
max_length = 500

# Embedding
embedding_dim = 100

# Padding các câu về cùng độ dài
x_train = pad_sequences(x_train, maxlen=max_length)
x_test = pad_sequences(x_test, maxlen=max_length)
```

Downloading data from <https://storage.googleapis.com/tensorflow/tf-keras-datasets/imdb.npz>  
17464789/17464789 0s  
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```
[3]: def plot_history(history):
    # Biểu đồ độ chính xác
    fig_accuracy = go.Figure()
    fig_accuracy.add_trace(go.Scatter(y=history.history['accuracy'],
    mode='lines', name='Train Accuracy'))
```

```

fig_accuracy.add_trace(go.Scatter(y=history.history['val_accuracy'],
↪mode='lines', name='Validation Accuracy'))
fig_accuracy.update_layout(
    title='Model Accuracy',
    xaxis_title='Epoch',
    yaxis_title='Accuracy',
    legend=dict(x=0, y=1)
)
fig_accuracy.show()

# Biểu đồ loss
fig_loss = go.Figure()
fig_loss.add_trace(go.Scatter(y=history.history['loss'], mode='lines',
↪name='Train Loss'))
fig_loss.add_trace(go.Scatter(y=history.history['val_loss'], mode='lines',
↪name='Validation Loss'))
fig_loss.update_layout(
    title='Model Loss',
    xaxis_title='Epoch',
    yaxis_title='Loss',
    legend=dict(x=0, y=1)
)
fig_loss.show()

```

```

[4]: import plotly.graph_objects as go

histories_list = []
def plot_histories(histories_list):
    # Biểu đồ độ chính xác
    fig_accuracy = go.Figure()
    for i, history in enumerate(histories_list):
        fig_accuracy.add_trace(go.Scatter(
            y=history.history['accuracy'],
            mode='lines',
            name=f'Train Accuracy {i+1}'
        ))
        fig_accuracy.add_trace(go.Scatter(
            y=history.history['val_accuracy'],
            mode='lines',
            name=f'Validation Accuracy {i+1}'
        ))
    fig_accuracy.update_layout(
        title='Model Accuracy',
        xaxis_title='Epoch',
        yaxis_title='Accuracy',
        legend=dict(x=0, y=1)
    )

```

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fig_accuracy.show()

# Biểu đồ loss
fig_loss = go.Figure()
for i, history in enumerate(histories_list):
    fig_loss.add_trace(go.Scatter(
        y=history.history['loss'],
        mode='lines',
        name=f'Train Loss {i+1}'
    ))
    fig_loss.add_trace(go.Scatter(
        y=history.history['val_loss'],
        mode='lines',
        name=f'Validation Loss {i+1}'
    ))
fig_loss.update_layout(
    title='Model Loss',
    xaxis_title='Epoch',
    yaxis_title='Loss',
    legend=dict(x=0, y=1)
)
fig_loss.show()

```

```

[5]: # 1. RNN
model_rnn = Sequential([
    Input(shape=(x_train.shape[1],)),
    Embedding(input_dim=vocab_size, output_dim=embedding_dim),
    SimpleRNN(units=128, activation='tanh'),
    Dense(1, activation='sigmoid')
])

# Cấu hình chung
model_rnn.compile(optimizer=Adam(learning_rate=0.001),
                  loss='binary_crossentropy',
                  metrics=['accuracy'])

# Huấn luyện
start = time.time()
history_model_rnn = model_rnn.fit(x_train, y_train, epochs=100,
    ↪ batch_size=2048, validation_data=(x_test, y_test), verbose="False")
RNN_time = time.time() - start
plot_history(history_model_rnn)
histories_list.append(history_model_rnn)

```

Epoch 1/100

WARNING: All log messages before absl::InitializeLog() is called are written to STDERR

I0000 00:00:1732544492.289634 64 service.cc:145] XLA service 0x5b8a53bef4c0

initialized for platform CUDA (this does not guarantee that XLA will be used).

Devices:

I0000 00:00:1732544492.289723 64 service.cc:153] StreamExecutor device

(0): Tesla P100-PCIE-16GB, Compute Capability 6.0

I0000 00:00:1732544493.324437 64 device\_compiler.h:188] Compiled cluster  
using XLA! This line is logged at most once for the lifetime of the process.

Epoch 2/100

Epoch 3/100

Epoch 4/100

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Epoch 39/100

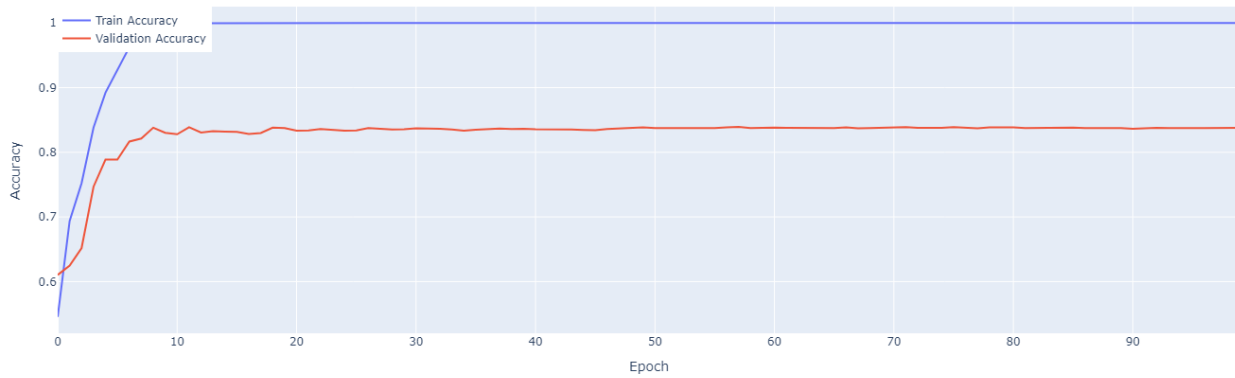
Epoch 40/100

Epoch 41/100

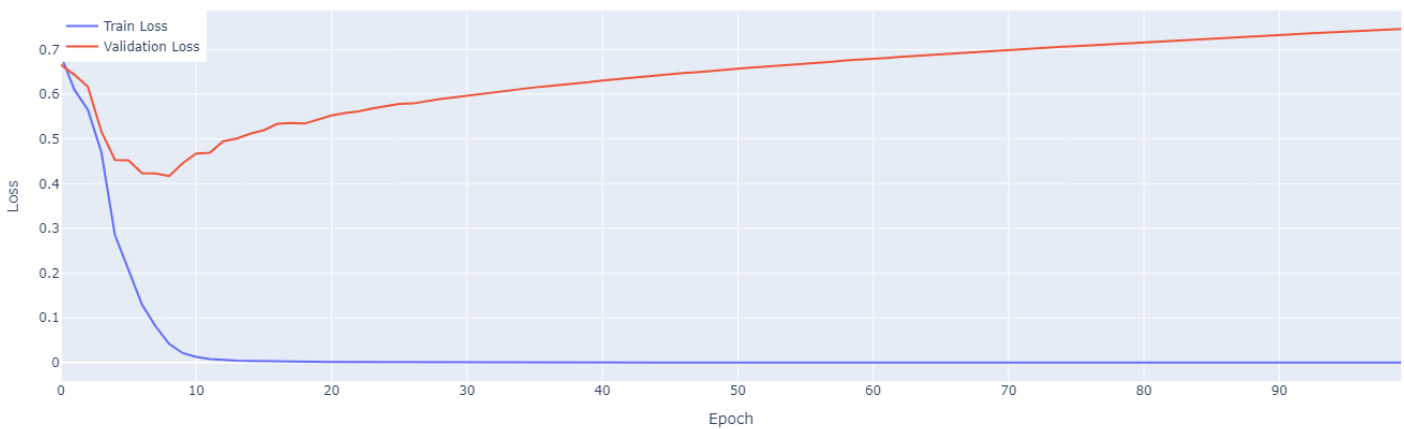
Epoch 42/100

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Epoch 90/100

Model Accuracy



Model Loss



```
[6]: # 2. LSTM
model_lstm = Sequential([
    Input(shape=(x_train.shape[1],)),
    Embedding(input_dim=vocab_size, output_dim=embedding_dim),
    LSTM(units=128, activation='tanh'),
    Dense(1, activation='sigmoid')
])
# Cấu hình chung
model_lstm.compile(optimizer=Adam(learning_rate=0.001),
                    loss='binary_crossentropy',
                    metrics=['accuracy'])

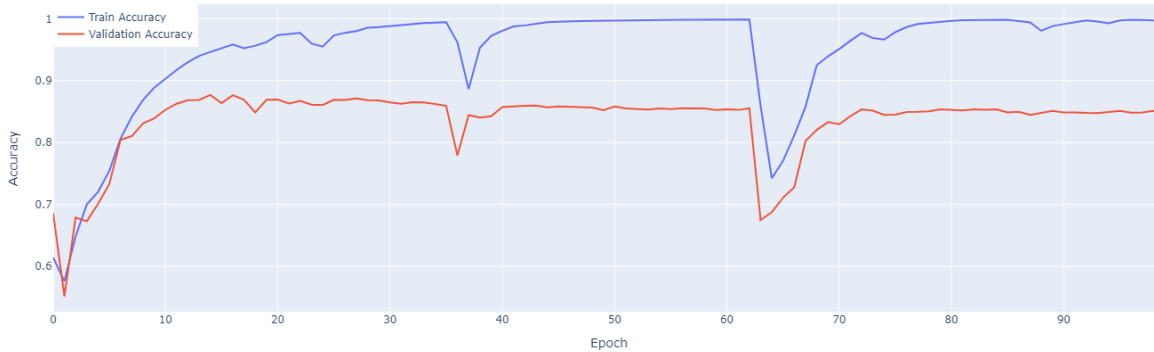
# Huấn luyện
start = time.time()
history_model_lstm = model_lstm.fit(x_train, y_train, epochs=100,
    ↪ batch_size=2048, validation_split=0.2, verbose="False")
LSTM_time = time.time() - start
plot_history(history_model_lstm)
histories_list.append(history_model_lstm)
```

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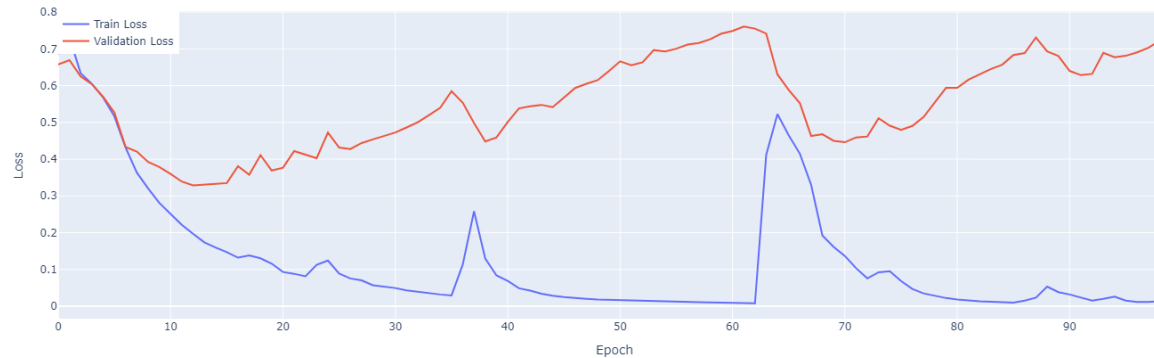
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Epoch 96/100



Model Accuracy



Model Loss



```
[7]: # 3. GRU
model_gru = Sequential([
    Input(shape=(x_train.shape[1],)),
    Embedding(input_dim=vocab_size, output_dim=embedding_dim),
    GRU(units=128, activation='tanh'),
    Dense(1, activation='sigmoid')
])

# Cấu hình chung
model_gru.compile(optimizer=Adam(learning_rate=0.001),
                  loss='binary_crossentropy',
                  metrics=['accuracy'])

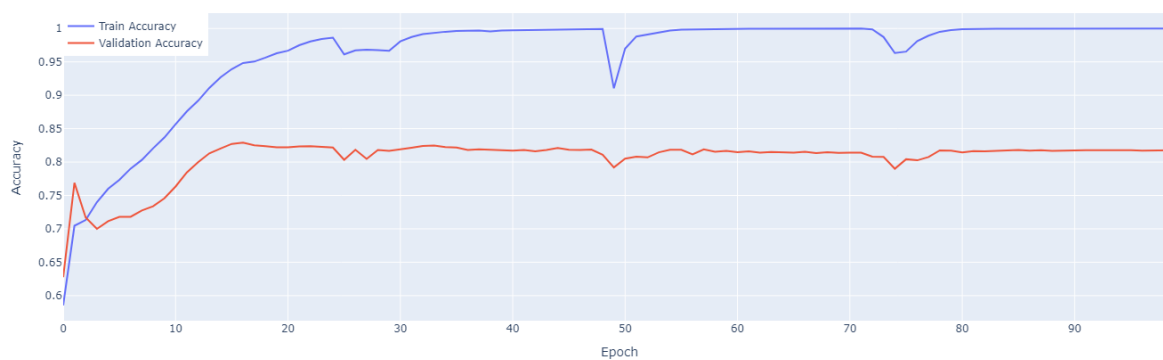
# Huấn luyện
start = time.time()
history_model_gru = model_gru.fit(x_train, y_train, epochs=100,
    ↪ batch_size=2048, validation_split=0.2, verbose="False")
GRU_time = time.time() - start
plot_history(history_model_gru)
histories_list.append(history_model_gru)
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Epoch 88/100

Model Accuracy



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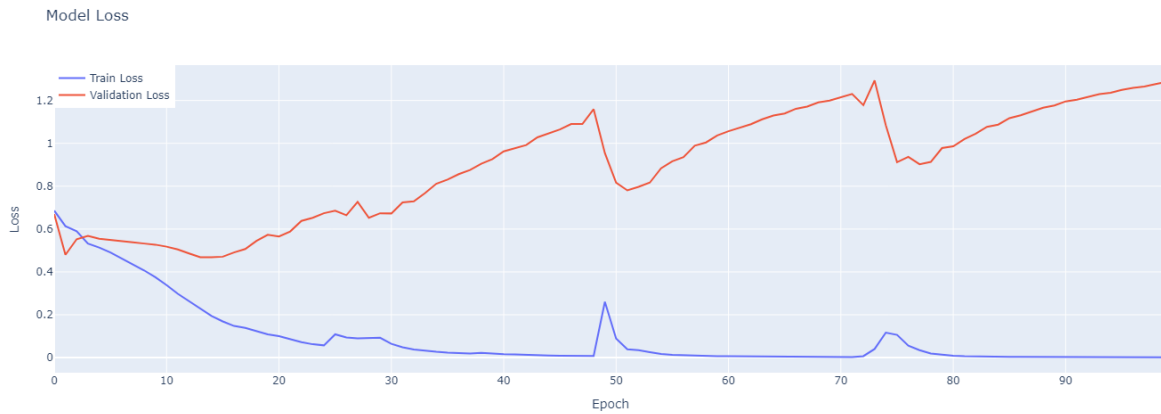
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```
[8]: # 4. Bi-RNN
model_birnn = Sequential([
    Embedding(input_dim=vocab_size, output_dim=embedding_dim,
    ↪input_length=max_length),
    Bidirectional(SimpleRNN(units=128, activation='tanh')),
    Dense(1, activation='sigmoid')
])
# Cấu hình chung
model_birnn.compile(optimizer=Adam(learning_rate=0.001),
                    loss='binary_crossentropy',
                    metrics=['accuracy'])

# Huấn luyện
start = time.time()
history_model_birnn = model_birnn.fit(x_train, y_train, epochs=100,
    ↪batch_size=2048, validation_split=0.2, verbose="False")
Bi_RNN_time = time.time() - start
plot_history(history_model_birnn)
histories_list.append(history_model_birnn)
```

Epoch 1/100

/opt/conda/lib/python3.10/site-packages/keras/src/layers/core/embedding.py:90:  
UserWarning:

Argument `input\_length` is deprecated. Just remove it.

Epoch 2/100

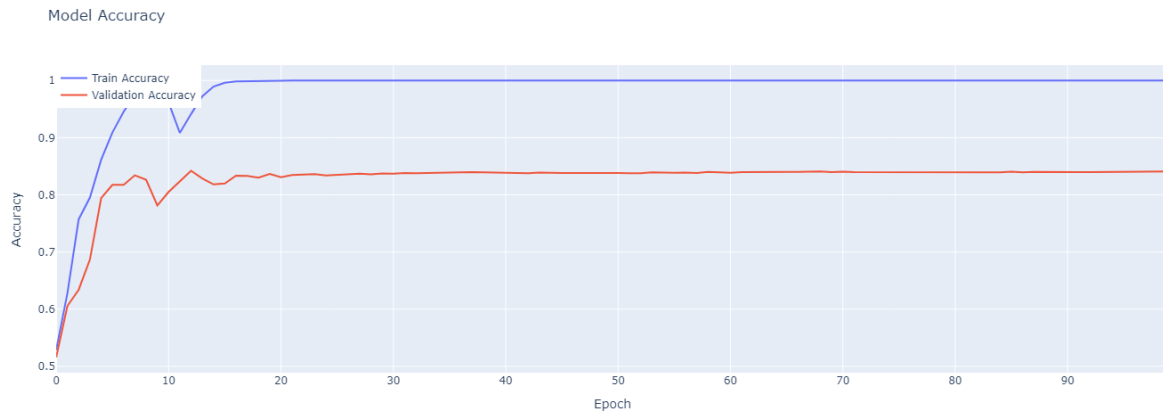
Epoch 3/100

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Model Loss

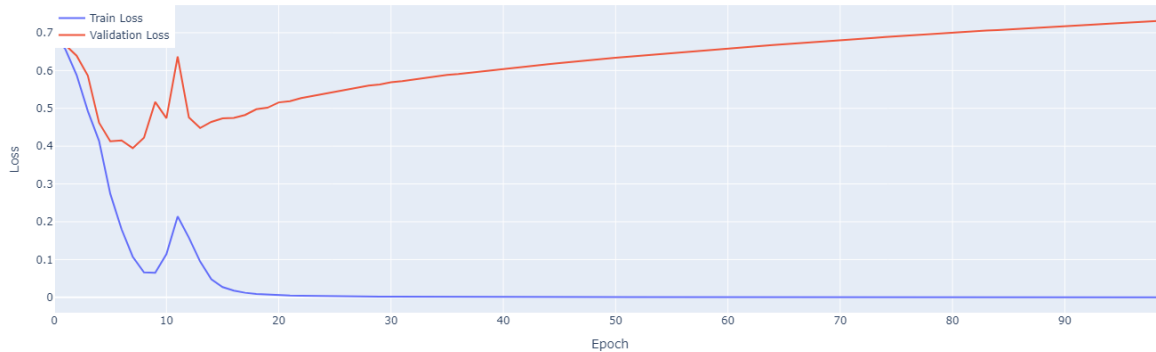
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```
# 5. Bi-LSTM
model_bilstm = Sequential([
    Embedding(input_dim=vocab_size, output_dim=embedding_dim,
    ↪input_length=max_length),
    Bidirectional(LSTM(units=128, activation='tanh')),
    Dense(1, activation='sigmoid')
])
# Cấu hình chung
model_bilstm.compile(optimizer=Adam(learning_rate=0.001),
    loss='binary_crossentropy',
    metrics=['accuracy'])

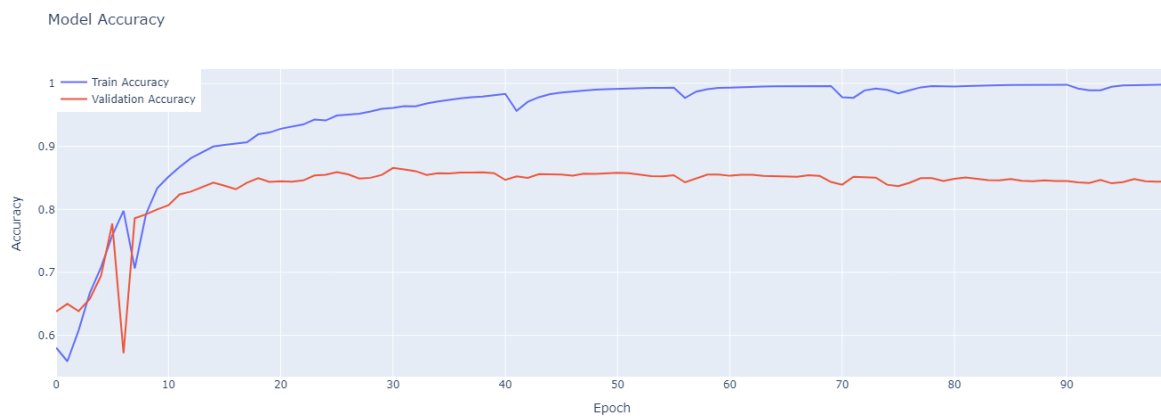
# Huấn luyện
start = time.time()
history_model_bilstm = model_bilstm.fit(x_train, y_train, epochs=100,
    ↪batch_size=2048, validation_split=0.2, verbose="False")
Bi_LSTM_time = time.time() - start
plot_history(history_model_bilstm)
histories_list.append(history_model_bilstm)
```

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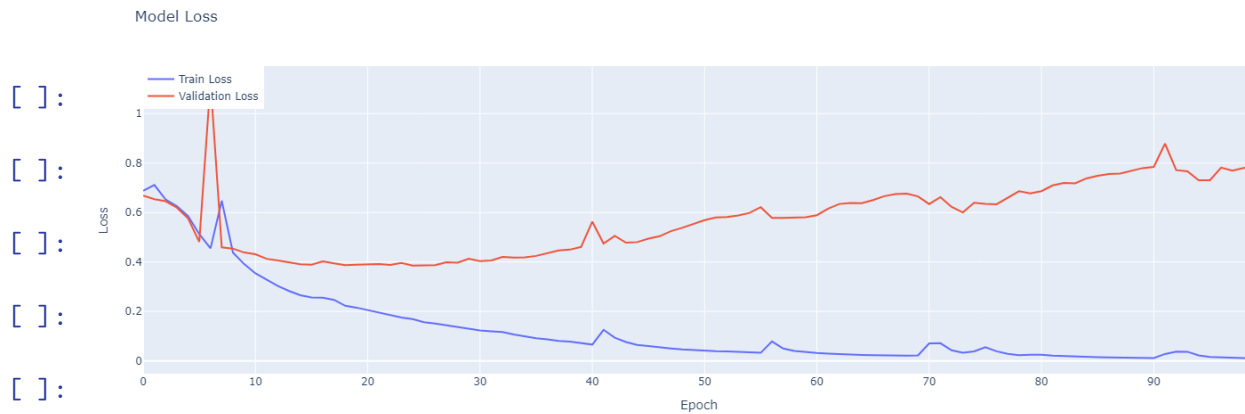
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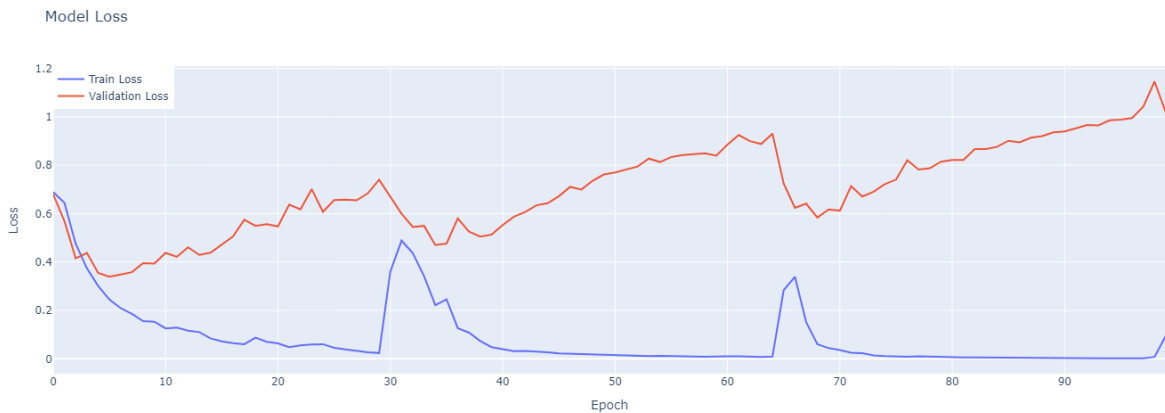
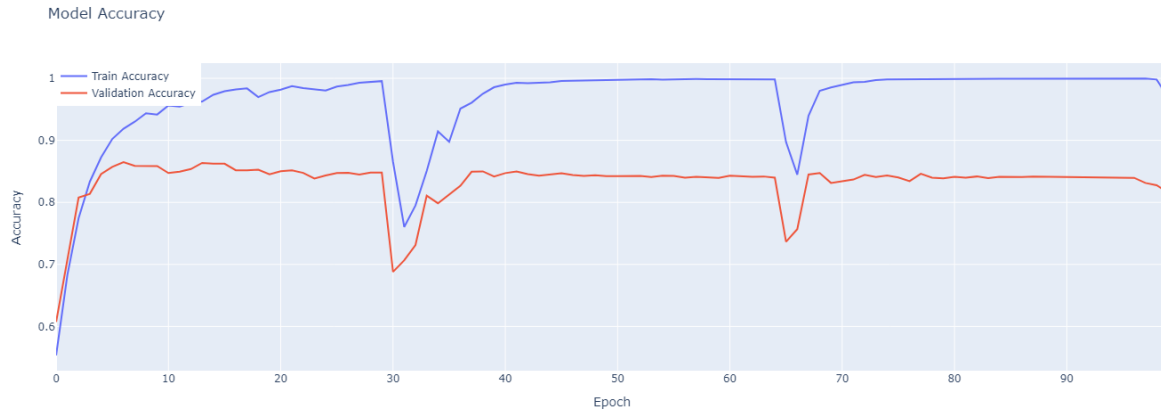
```
[10]: # 6. Bi-GRU
model_bigru = Sequential([
    Embedding(input_dim=vocab_size, output_dim=embedding_dim,
    ↪input_length=max_length),
    Bidirectional(GRU(units=128, activation='tanh')),
    Dense(1, activation='sigmoid')
])
# Cấu hình chung
model_bigru.compile(optimizer=Adam(learning_rate=0.001),
                    loss='binary_crossentropy',
                    metrics=['accuracy'])

# Huấn luyện
start = time.time()
history_model_bigru = model_bigru.fit(x_train, y_train, epochs=100,
    ↪batch_size=2048, validation_split=0.2, verbose="False")
Bi_GRU_time = time.time() - start
plot_history(history_model_bigru)
histories_list.append(history_model_bigru)
```

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Epoch 51/100  
Epoch 52/100  
Epoch 53/100  
Epoch 54/100  
Epoch 55/100  
Epoch 56/100  
Epoch 57/100  
Epoch 58/100  
Epoch 59/100  
Epoch 60/100  
Epoch 61/100  
Epoch 62/100  
Epoch 63/100  
Epoch 64/100  
Epoch 65/100

Epoch 66/100  
Epoch 67/100  
Epoch 68/100  
Epoch 69/100  
Epoch 70/100  
Epoch 71/100  
Epoch 72/100  
Epoch 73/100  
Epoch 74/100  
Epoch 75/100  
Epoch 76/100  
Epoch 77/100  
Epoch 78/100  
Epoch 79/100  
Epoch 80/100  
Epoch 81/100  
Epoch 82/100  
Epoch 83/100  
Epoch 84/100  
Epoch 85/100  
Epoch 86/100  
Epoch 87/100  
Epoch 88/100



```
[ ]:
```

```
[ ]:
```

```
[11]: data = {'RNN_time': RNN_time, 'LSTM_time': LSTM_time, 'GRU_time': GRU_time,
↳ 'Bi_RNN_time': Bi_RNN_time, 'Bi_LSTM_time': Bi_LSTM_time, 'Bi_GRU_time':
↳ Bi_GRU_time}
sorted_by_key = dict(sorted(data.items(), key=lambda item: item[1])) # Sắp xếp
↳ key theo thứ tự tăng dần
print(sorted_by_key)
```

```
{'RNN_time': 270.2134635448456, 'GRU_time': 279.0114424228668, 'LSTM_time':
307.46430110931396, 'Bi_RNN_time': 323.57692217826843, 'Bi_GRU_time':
521.9530775547028, 'Bi_LSTM_time': 573.4361057281494}
```

```
[12]: plot_histories(histories_list)
```

## 1 7. Conclusion

The training time comparison is as follows: Bi\_LSTM\_time > Bi\_GRU\_time > Bi\_RNN\_time > LSTM\_time > GRU\_time > RNN\_time.

Most models achieve high accuracy during training, but their performance on the validation set is not as strong as on the training set. Among the models, Bi-LSTM and Bi-RNN show the lowest error rates on the validation set. But in opposite, GRU is highest error rates.

LSTM, Bi-LSTM is the highest accuracy model in vali. RNN and GRU is lower than the other models.