

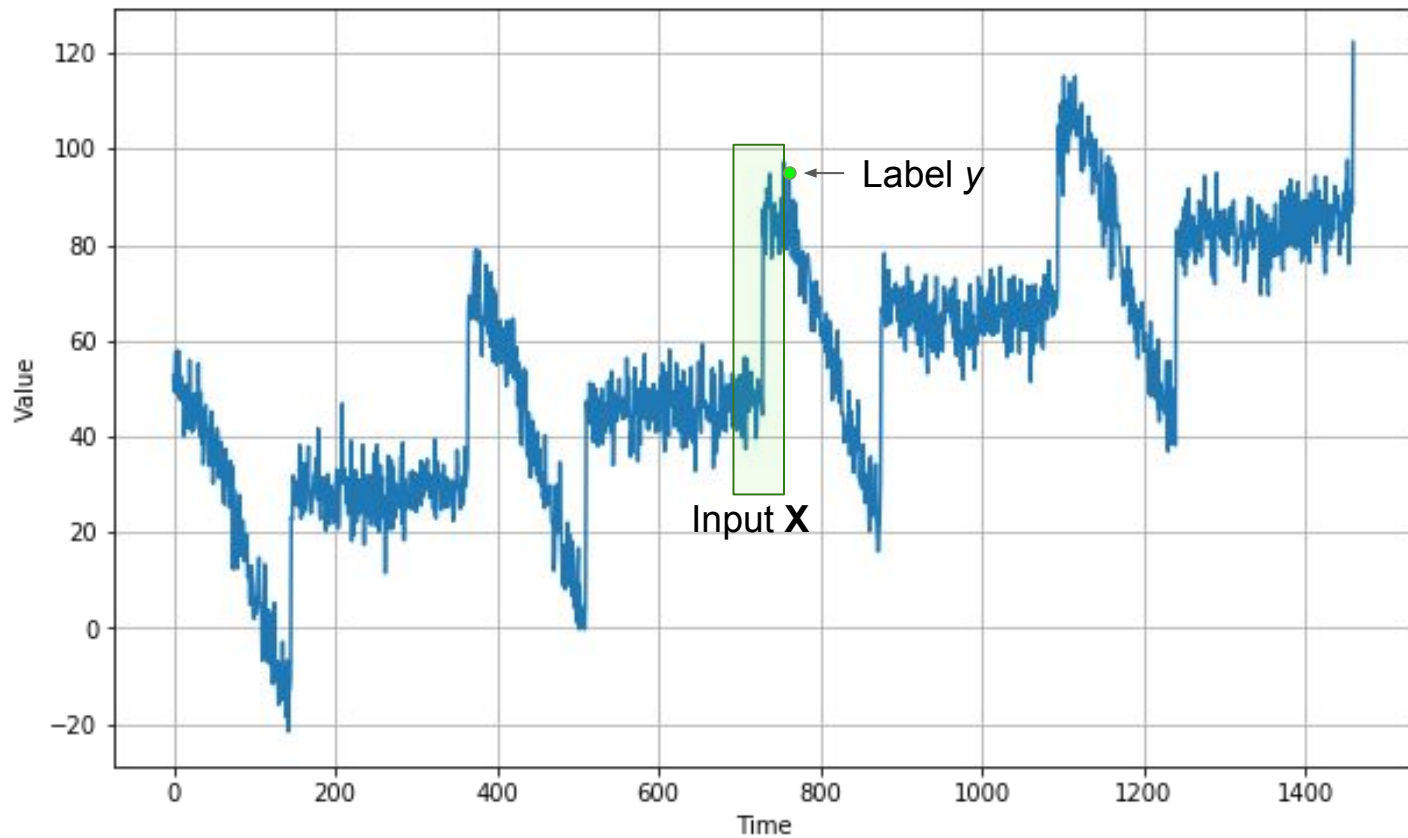
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Machine Learning on Time Windows



```
dataset = tf.data.Dataset.range(10)
for val in dataset:
    print(val.numpy())
```

```
dataset = tf.data.Dataset.range(10)
for val in dataset:
    print(val.numpy())
```

```
0
1
2
3
4
5
6
7
8
9
```

```
dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1)
for window_dataset in dataset:
    for val in window_dataset:
        print(val.numpy(), end=" ")
    print()
```

```
dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1)
for window_dataset in dataset:
    for val in window_dataset:
        print(val.numpy(), end=" ")
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    for val in window_dataset:
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```

```
0 1 2 3 4
1 2 3 4 5
2 3 4 5 6
3 4 5 6 7
4 5 6 7 8
5 6 7 8 9
6 7 8 9
7 8 9
8 9
9
```

```
dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1, drop_remainder=True)
for window_dataset in dataset:
    for val in window_dataset:
        print(val.numpy(), end=" ")
    print()
```



```
dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1, drop_remainder=True)
for window_dataset in dataset:
    for val in window_dataset:
        print(val.numpy(), end=" ")
    print()
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dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1, drop_remainder=True)
for window_dataset in dataset:
    for val in window_dataset:
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    print()
```

```
0 1 2 3 4
1 2 3 4 5
2 3 4 5 6
3 4 5 6 7
4 5 6 7 8
5 6 7 8 9
```

```
dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1, drop_remainder=True)
dataset = dataset.flat_map(lambda window: window.batch(5))
for window in dataset:
    print(window.numpy())
```

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dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1, drop_remainder=True)
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for window in dataset:
    print(window.numpy())
```

```
[0 1 2 3 4]
[1 2 3 4 5]
[2 3 4 5 6]
[3 4 5 6 7]
[4 5 6 7 8]
[5 6 7 8 9]
```

```
dataset = tf.data.Dataset.range(10)
dataset = dataset.window(5, shift=1, drop_remainder=True)
dataset = dataset.flat_map(lambda window: window.batch(5))
dataset = dataset.map(lambda window: (window[:-1], window[-1]))
for x,y in dataset:
    print(x.numpy(), y.numpy())
```

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dataset = tf.data.Dataset.range(10)
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[0 1 2 3] [4]
[1 2 3 4] [5]
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dataset = dataset.shuffle(buffer_size=10)
dataset = dataset.batch(2).prefetch(1)
for x,y in dataset:
    print("x = ", x.numpy())
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x = [[5 6 7 8] [0 1 2 3]]
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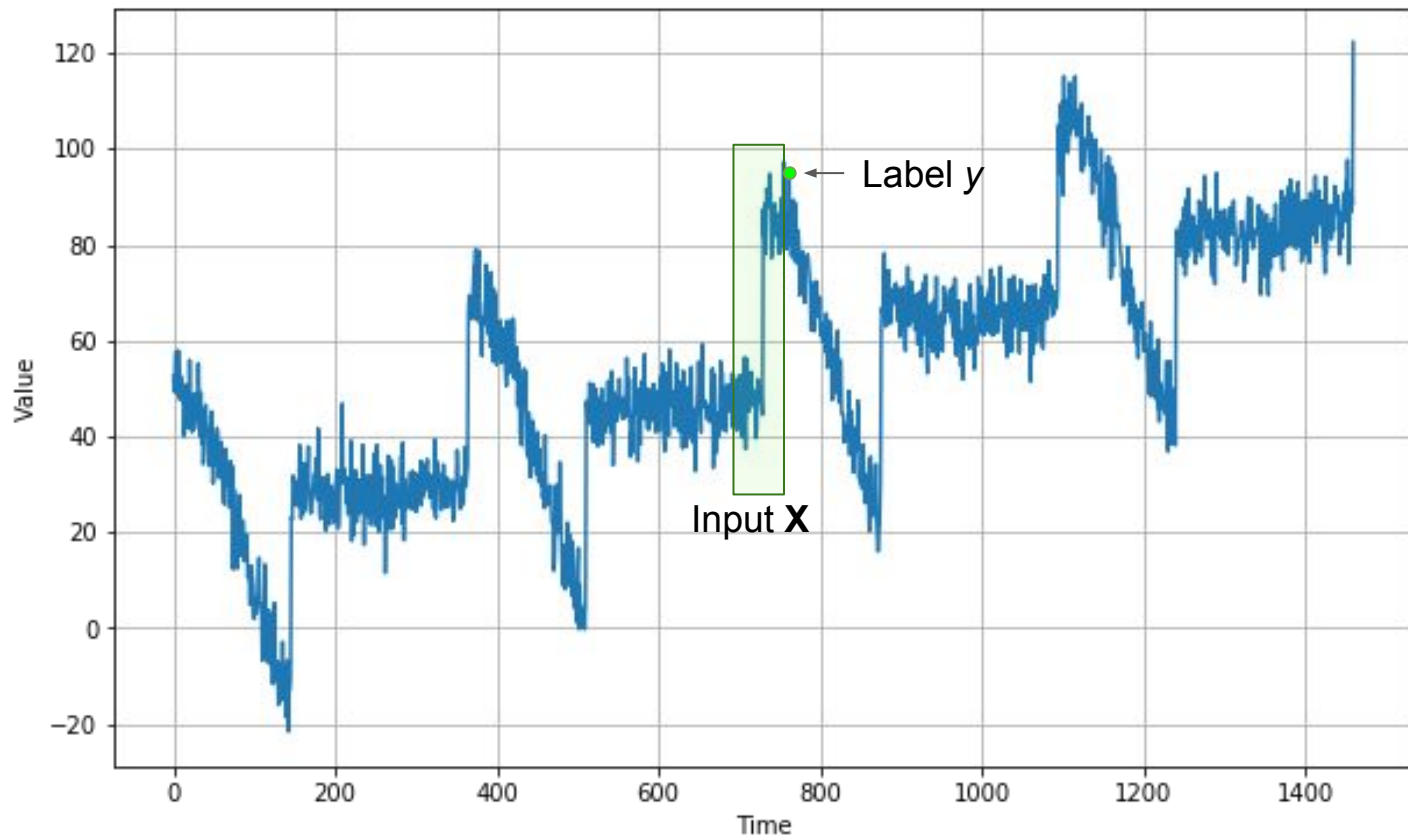
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x = [[5 6 7 8] [0 1 2 3]]
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```


Machine Learning on Time Windows



```
def windowed_dataset(series, window_size, batch_size, shuffle_buffer):  
    dataset = tf.data.Dataset.from_tensor_slices(series)  
    dataset = dataset.window(window_size + 1, shift=1, drop_remainder=True)  
    dataset = dataset.flat_map(lambda window: window.batch(window_size + 1))  
    dataset = dataset.shuffle(shuffle_buffer)  
                .map(lambda window: (window[:-1], window[-1]))  
    dataset = dataset.batch(batch_size).prefetch(1)  
    return dataset
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    return dataset
```



```
split_time = 1000  
time_train = time[:split_time]  
x_train = series[:split_time]  
time_valid = time[split_time:]  
x_valid = series[split_time:]
```

```
split_time = 1000  
time_train = time[:split_time]  
x_train = series[:split_time]  
time_valid = time[split_time:]  
x_valid = series[split_time:]
```

```
window_size = 20
```

```
batch_size = 32
```

```
shuffle_buffer_size = 1000
```

```
dataset = windowed_dataset(series, window_size, batch_size, shuffle_buffer_size)
```

```
l0 = tf.keras.layers.Dense(1, input_shape=[window_size])
```

```
model = tf.keras.models.Sequential([l0])
```

```
window_size = 20  
batch_size = 32  
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```

```
l0 = tf.keras.layers.Dense(1, input_shape=[window_size])
```

```
model = tf.keras.models.Sequential([l0])
```

```
model.compile(loss="mse", optimizer=tf.keras.optimizers.SGD(learning_rate=1e-6,  
momentum=0.9))  
model.fit(dataset, epochs=100, verbose=0)
```



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```

```
print("Layer weights {}".format(l0.get_weights()))
```

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print("Layer weights {}".format(l0.get_weights()))
```

```
Layer weights [array([[ 0.01633573],  
    [-0.02911791],  
    [ 0.00845617],  
    [-0.02175158],  
    [ 0.04962169],  
    [-0.03212642],  
    [-0.02596855],  
    [-0.00689476],  
    [ 0.0616533 ],  
    [-0.00668752],  
    [-0.02735964],  
    [ 0.0377918 ],  
    [-0.02855931],  
    [ 0.05299238],  
    [-0.0121608 ],  
    [ 0.00138755],  
    [ 0.0905595 ],  
    [ 0.19994621],  
    [ 0.2556632 ],  
    [ 0.41660047]], dtype=float32), array([0.01430958], dtype=float32)]
```

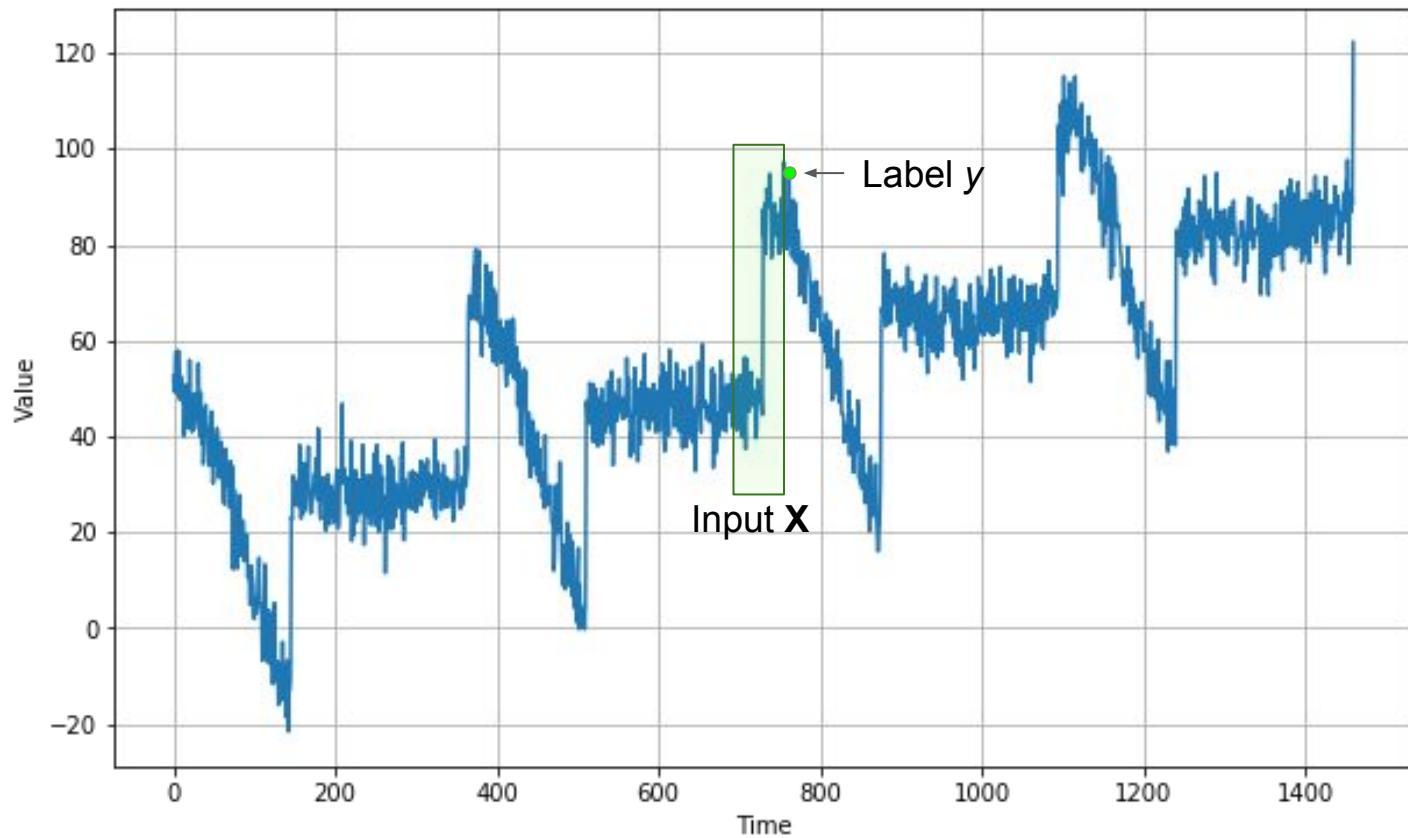
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                      [ 0.41660047]], dtype=float32), array([0.01430958], dtype=float32)]
```

Diagram illustrating the layer weights and bias vector:

- W_{t0} points to the first element: 0.01633573
- W_{t1} points to the second element: -0.02911791
- W_{t2} points to the third element: 0.00845617
- W_{t3} points to the fourth element: -0.02175158
- b points to the bias vector element: 0.01430958

Machine Learning on Time Windows



```
print("Layer weights {}".format(l0.get_weights()))
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```
Layer weights [array([[ 0.01633573],  
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- b points to the bias vector element: 0.01430958


```
print("Layer weights {}".format(l0.get_weights()))
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```
Layer weights [array([[ 0.01633573], ←  $W_{t0}$ 
 [-0.02911791], ←  $W_{t1}$ 
 [ 0.00845617], ←  $W_{t2}$ 
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 [ 0.41660047]], dtype=float32), array([0.01430958], dtype=float32)]
```

$$Y = W_{t0}X_0 + W_{t1}X_1 + W_{t2}X_2 + \dots + W_{t19}X_{19} + b$$

b



```
print(series[1:21])  
model.predict(series[1:21][np.newaxis])
```

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```

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print(series[1:21])  
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```

```
[49.35275  53.314735 57.711823 48.934444 48.931244 57.982895 53.897125  
 47.67393  52.68371  47.591717 47.506374 50.959415 40.086178 40.919415  
 46.612473 44.228207 50.720642 44.454983 41.76799  55.980938]
```

```
array([[49.08478]], dtype=float32)
```

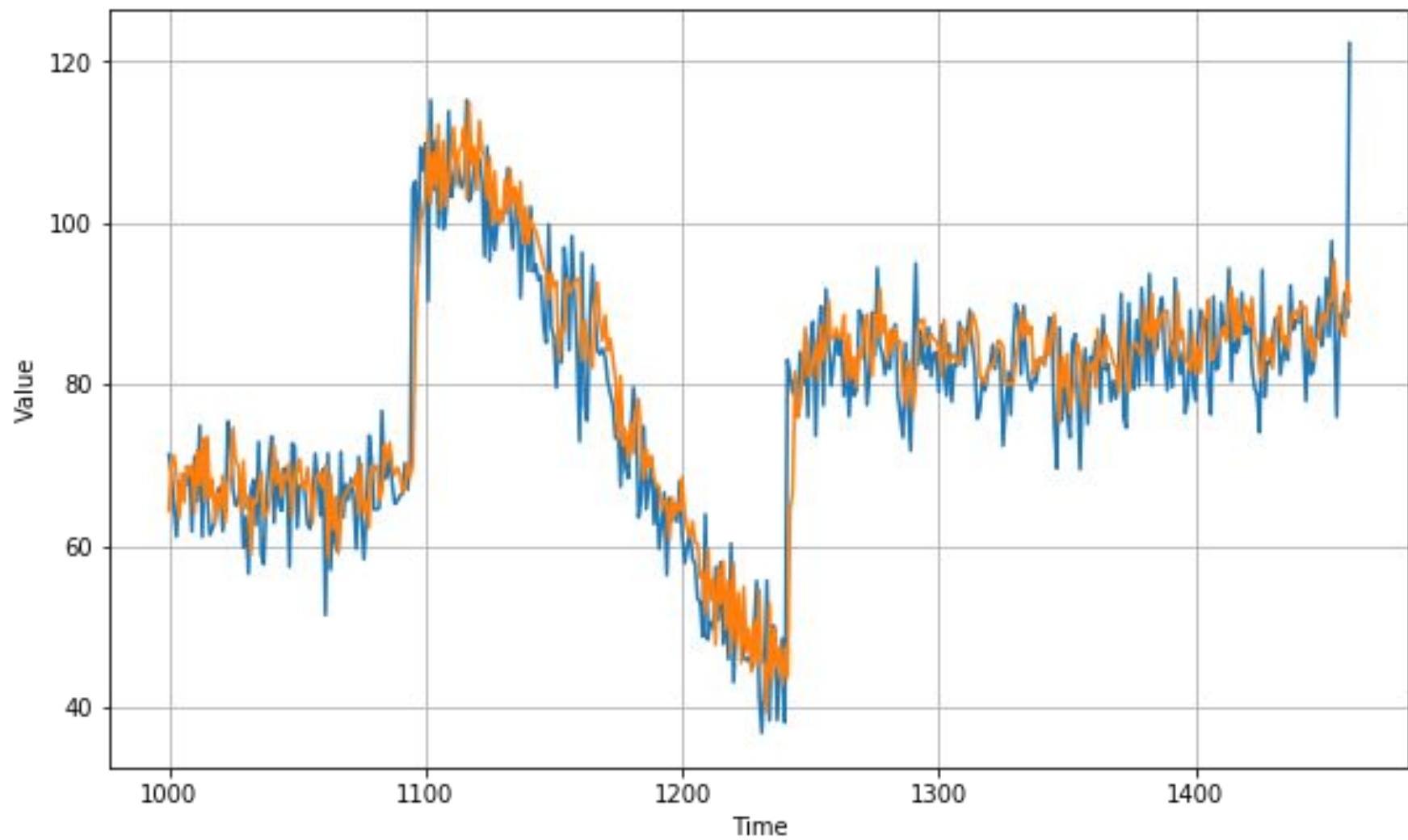
```
forecast = []  
for time in range(len(series) - window_size):  
    forecast.append(model.predict(series[time:time + window_size][np.newaxis]))  
  
forecast = forecast[split_time-window_size:]  
results = np.array(forecast)[: , 0, 0]
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```
tf.keras.metrics.mean_absolute_error(x_valid, results).numpy()
```

4.9526777

```
dataset = windowed_dataset(x_train, window_size, batch_size, shuffle_buffer_size)
```

```
model = tf.keras.models.Sequential([  
    tf.keras.layers.Dense(10, input_shape=[window_size], activation="relu"),  
    tf.keras.layers.Dense(10, activation="relu"),  
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```

```
model.compile(loss="mse", optimizer=tf.keras.optimizers.SGD(learning_rate=1e-6,  
momentum=0.9))
```

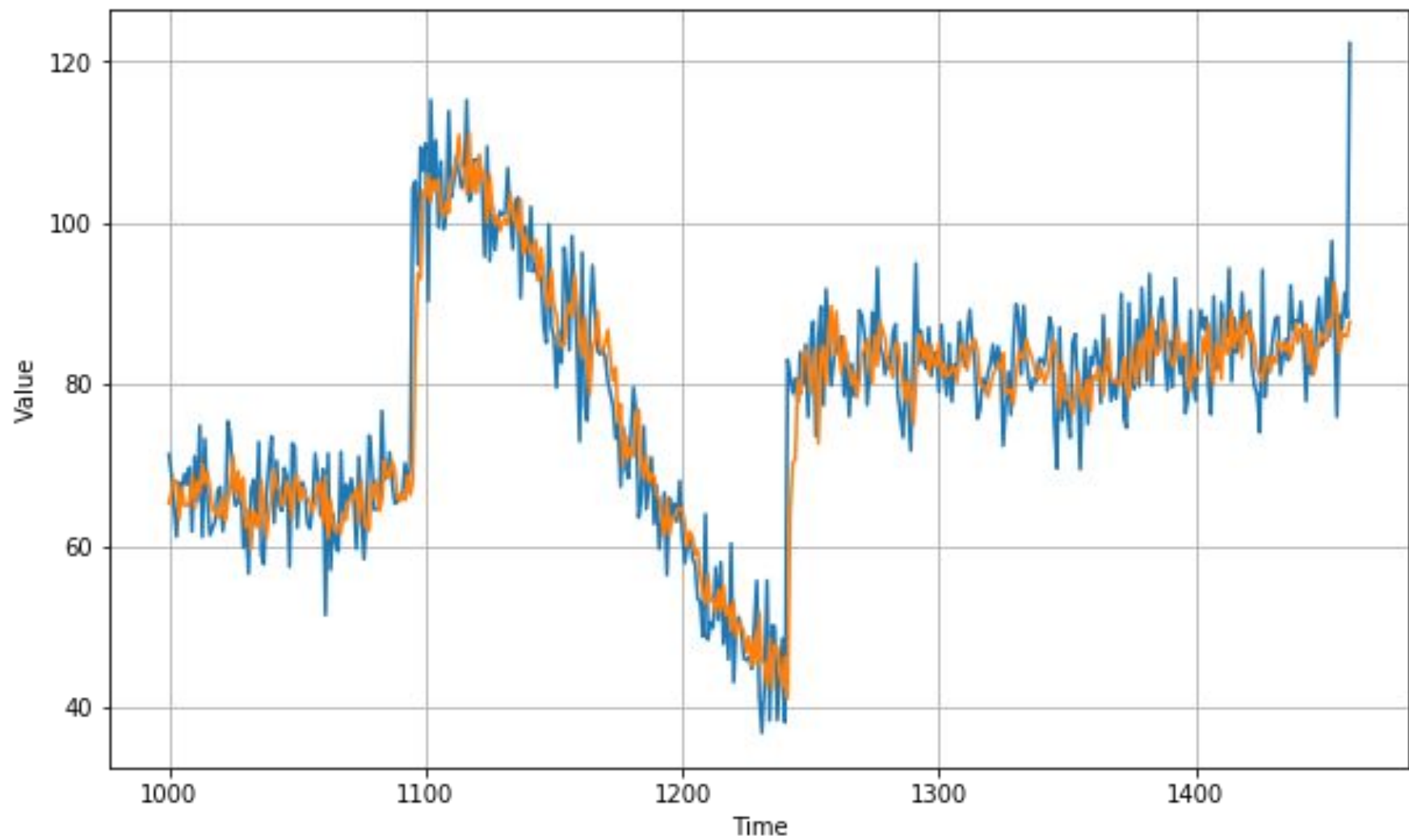
```
model.fit(dataset, epochs=100, verbose=0)
```

```
dataset = windowed_dataset(x_train, window_size, batch_size, shuffle_buffer_size)
```

```
model = tf.keras.models.Sequential([  
    tf.keras.layers.Dense(10, input_shape=[window_size], activation="relu"),  
    tf.keras.layers.Dense(10, activation="relu"),  
    tf.keras.layers.Dense(1)  
])
```

```
model.compile(loss="mse", optimizer=tf.keras.optimizers.SGD(learning_rate=1e-6,  
momentum=0.9))
```

```
model.fit(dataset, epochs=100, verbose=0)
```




```
tf.keras.metrics.mean_absolute_error(x_valid, results).numpy()
```

```
4.9833784
```

```
dataset = windowed_dataset(x_train, window_size, batch_size, shuffle_buffer_size)
```

```
model = tf.keras.models.Sequential([  
    tf.keras.layers.Dense(10, input_shape=[window_size], activation="relu"),  
    tf.keras.layers.Dense(10, activation="relu"),  
    tf.keras.layers.Dense(1)  
])
```

```
lr_schedule = tf.keras.callbacks.LearningRateScheduler(  
    lambda epoch: 1e-8 * 10**(epoch / 20))
```

```
optimizer = tf.keras.optimizers.SGD(learning_rate=1e-8, momentum=0.9)
```

```
model.compile(loss="mse", optimizer=optimizer)
```

```
history = model.fit(dataset, epochs=100, callbacks=[lr_schedule])
```

```
dataset = windowed_dataset(x_train, window_size, batch_size, shuffle_buffer_size)
```

```
model = tf.keras.models.Sequential([  
    tf.keras.layers.Dense(10, input_shape=[window_size], activation="relu"),  
    tf.keras.layers.Dense(10, activation="relu"),  
    tf.keras.layers.Dense(1)  
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    tf.keras.layers.Dense(10, activation="relu"),  
    tf.keras.layers.Dense(1)  
])
```

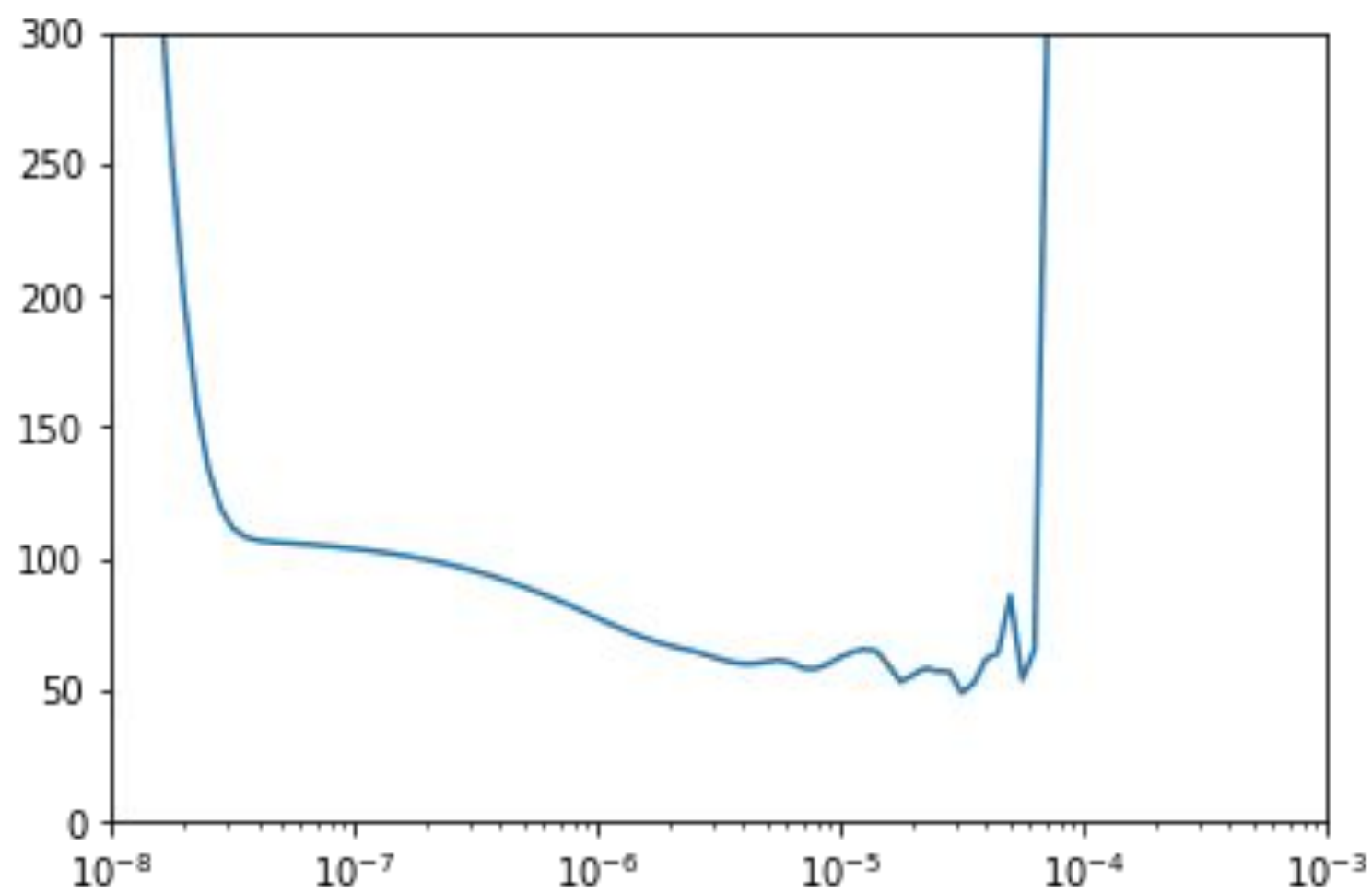
```
lr_schedule = tf.keras.callbacks.LearningRateScheduler(  
    lambda epoch: 1e-8 * 10**(epoch / 20))
```

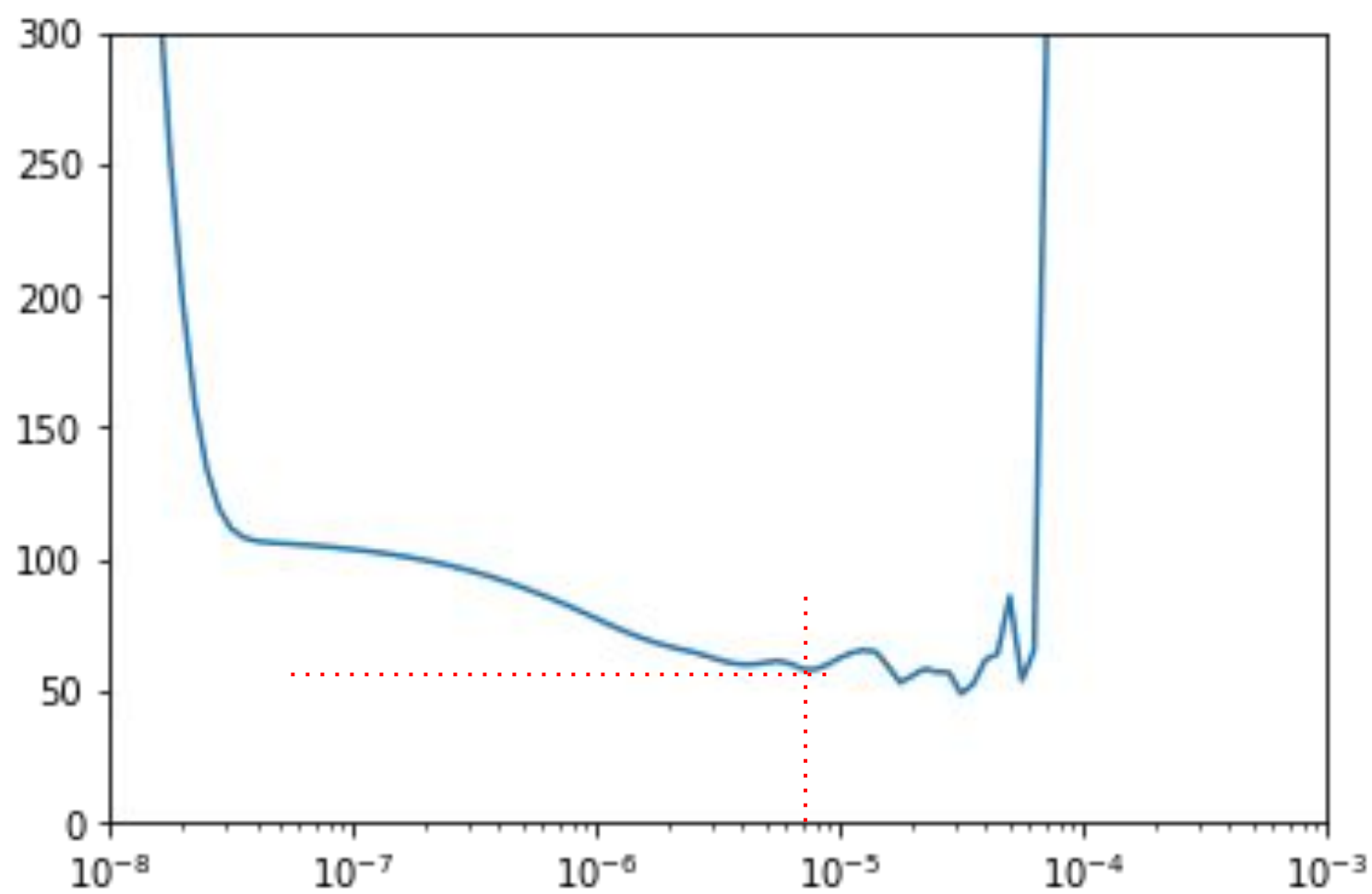
```
optimizer = tf.keras.optimizers.SGD(learning_rate=1e-8, momentum=0.9)
```

```
model.compile(loss="mse", optimizer=optimizer)
```

```
history = model.fit(dataset, epochs=100, callbacks=[lr_schedule])
```

```
lrs = 1e-8 * (10 ** (np.arange(100) / 20))  
plt.semilogx(lrs, history.history["loss"])  
plt.axis([1e-8, 1e-3, 0, 300])
```





```
window_size = 30
dataset = windowed_dataset(x_train, window_size, batch_size, shuffle_buffer_size)

model = tf.keras.models.Sequential([
    tf.keras.layers.Dense(10, activation="relu", input_shape=[window_size]),
    tf.keras.layers.Dense(10, activation="relu"),
    tf.keras.layers.Dense(1)
])

optimizer = tf.keras.optimizers.SGD(learning_rate=7e-6, momentum=0.9)
model.compile(loss="mse", optimizer=optimizer)
history = model.fit(dataset, epochs=500)
```

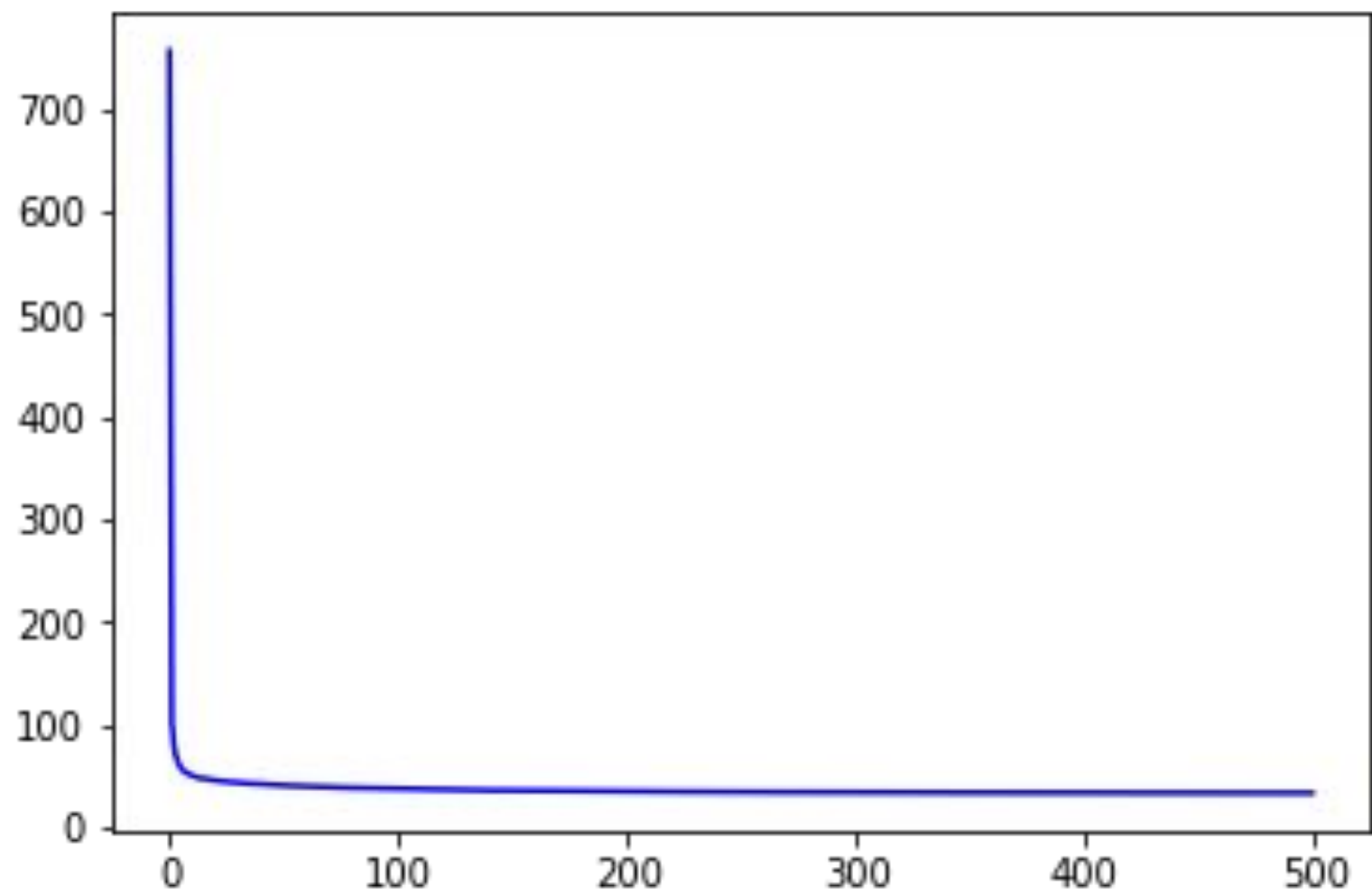


```
window_size = 30
dataset = windowed_dataset(x_train, window_size, batch_size, shuffle_buffer_size)

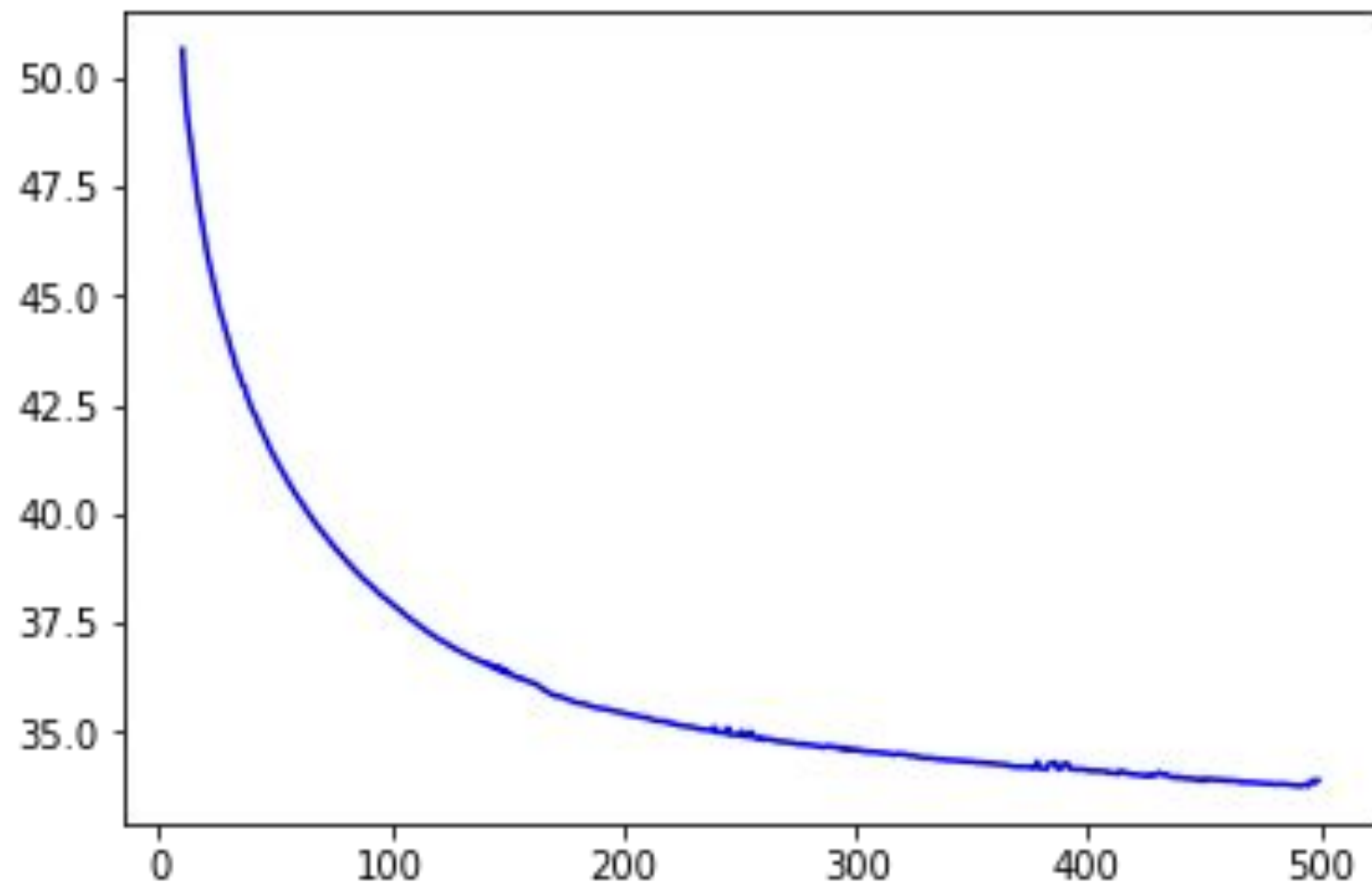
model = tf.keras.models.Sequential([
    tf.keras.layers.Dense(10, activation="relu", input_shape=[window_size]),
    tf.keras.layers.Dense(10, activation="relu"),
    tf.keras.layers.Dense(1)
])

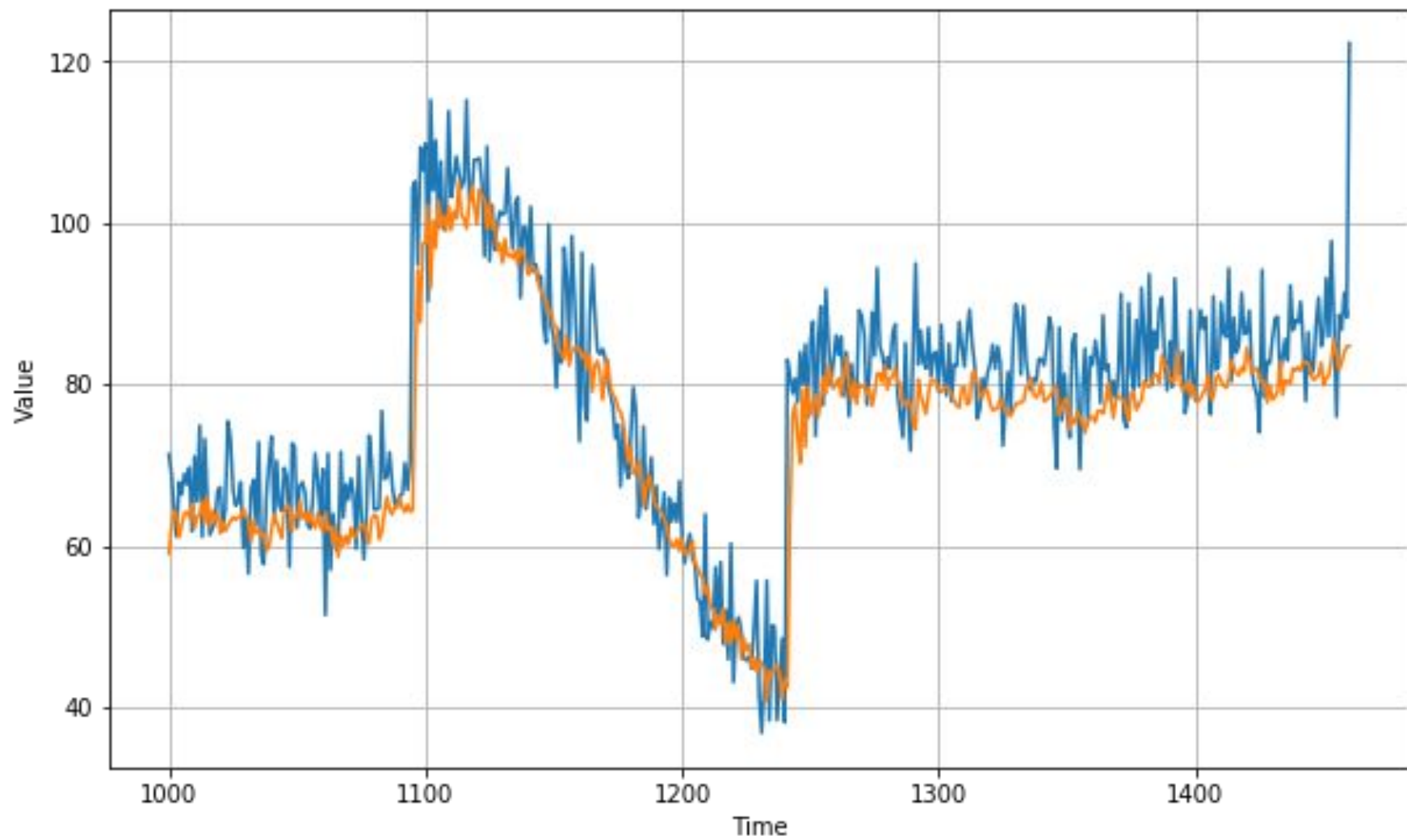
optimizer = tf.keras.optimizers.SGD(learning_rate=7e-6, momentum=0.9)
model.compile(loss="mse", optimizer=optimizer)
history = model.fit(dataset, epochs=500)
```

```
# Plot the loss
loss = history.history['loss']
epochs = range(len(loss))
plt.plot(epochs, loss, 'b', label='Training Loss')
plt.show()
```



```
# Plot all but the first 10
loss = history.history['loss']
epochs = range(10, len(loss))
plot_loss = loss[10:]
print(plot_loss)
plt.plot(epochs, plot_loss, 'b', label='Training Loss')
plt.show()
```





```
tf.keras.metrics.mean_absolute_error(x_valid, results).numpy()
```

```
4.4847784
```