```
In [1]:
#@title Licensed under the Apache License, Version 2.0 (the "License");
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# distributed under the License is distributed on an "AS IS" BASIS,
# WITHOUT WARRANTIES OR CONDITIONS OF ANY KIND, either express or implied.
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# limitations under the License.
In [2]:
!pip install tf-nightly-2.0-preview
ERROR: Could not find a version that satisfies the requirement tf-nightly-2.0-preview (from versio
ns: none)
ERROR: No matching distribution found for tf-nightly-2.0-preview
In [3]:
import tensorflow as tf
import numpy as np
import matplotlib.pyplot as plt
print(tf.__version__)
2.3.0
In [4]:
def plot series(time, series, format="-", start=0, end=None):
    plt.plot(time[start:end], series[start:end], format)
    plt.xlabel("Time")
    plt.ylabel("Value")
    plt.grid(False)
def trend(time, slope=0):
   return slope * time
def seasonal pattern(season time):
    """Just an arbitrary pattern, you can change it if you wish"""
    return np.where(season time < 0.1,</pre>
                    np.cos(season time * 6 * np.pi),
                    2 / np.exp(9 * season time))
def seasonality(time, period, amplitude=1, phase=0):
    """Repeats the same pattern at each period"""
    season_time = ((time + phase) % period) / period
    return amplitude * seasonal_pattern(season_time)
def noise(time, noise level=1, seed=None):
    rnd = np.random.RandomState(seed)
    return rnd.randn(len(time)) * noise level
time = np.arange(10 * 365 + 1, dtype="float32")
baseline = 10
series = trend(time, 0.1)
baseline = 10
amplitude = 40
slope = 0.005
noise level = 3
# Create the series
series = baseline + trend(time, slope) + seasonality(time, period=365, amplitude=amplitude)
# Update with noise
```

series += noise(time, noise level, seed=51)

```
split_time = 3000
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
plot_series(time, series)
```

In [5]:

```
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
```

In [6]:

```
tf.keras.backend.clear session()
tf.random.set_seed(51)
np.random.seed (51)
tf.keras.backend.clear session()
dataset = windowed dataset(x train, window size, batch size, shuffle buffer size)
model = tf.keras.models.Sequential([
  tf.keras.layers.Lambda(lambda x: tf.expand dims(x, axis=-1),
                      input shape=[None]),
  tf.keras.layers.Bidirectional(tf.keras.layers.LSTM(32, return sequences=True)),
  tf.keras.layers.Bidirectional(tf.keras.layers.LSTM(32)),
  tf.keras.layers.Dense(1),
  tf.keras.layers.Lambda(lambda x: x * 10.0)
1)
lr schedule = tf.keras.callbacks.LearningRateScheduler(
    lambda epoch: 1e-8 * 10**(epoch / 20))
optimizer = tf.keras.optimizers.SGD(lr=1e-8, momentum=0.9)
model.compile(loss=tf.keras.losses.Huber(),
              optimizer=optimizer,
              metrics=["mae"])
history = model.fit(dataset, epochs=100, callbacks=[lr schedule])
Epoch 1/100
```

```
Epoch 6/100
Epoch 7/100
Epoch 8/100
Epoch 9/100
Epoch 10/100
Epoch 11/100
Epoch 12/100
Epoch 13/100
Epoch 14/100
Epoch 15/100
Epoch 16/100
94/94 [=========== ] - 1s 11ms/step - loss: 19.4109 - mae: 19.9109
Epoch 17/100
Epoch 18/100
Epoch 19/100
Epoch 20/100
Epoch 21/100
Epoch 22/100
Epoch 23/100
Epoch 24/100
Epoch 25/100
Epoch 26/100
Epoch 27/100
Epoch 28/100
Epoch 29/100
Epoch 30/100
Epoch 31/100
Epoch 32/100
Epoch 33/100
94/94 [========= ] - 1s 11ms/step - loss: 13.7764 - mae: 14.2730
Epoch 34/100
Epoch 35/100
Epoch 36/100
Epoch 37/100
Epoch 38/100
94/94 [===========] - 1s 11ms/step - loss: 10.2310 - mae: 10.7178
Epoch 39/100
94/94 [===========] - 1s 11ms/step - loss: 9.5739 - mae: 10.0572
Epoch 40/100
Epoch 41/100
Epoch 42/100
Epoch 43/100
94/94 [======= 7.7375 - mae: 8.2186
```

```
Epoch 44/100
Epoch 45/100
Epoch 46/100
Epoch 47/100
Epoch 48/100
Epoch 49/100
Epoch 50/100
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
94/94 [=======] - 1s 11ms/step - loss: 4.5836 - mae: 5.0500
Epoch 63/100
94/94 [============ ] - 1s 11ms/step - loss: 4.5919 - mae: 5.0578
Epoch 64/100
Epoch 65/100
Epoch 66/100
Epoch 67/100
Epoch 68/100
Epoch 69/100
94/94 [=============] - 1s 11ms/step - loss: 4.1300 - mae: 4.5964
Epoch 70/100
Epoch 71/100
Epoch 72/100
Epoch 73/100
Epoch 74/100
Epoch 75/100
Epoch 76/100
Epoch 77/100
94/94 [========] - 1s 11ms/step - loss: 3.4824 - mae: 3.9487
Epoch 78/100
Epoch 79/100
Epoch 80/100
94/94 [=========] - 1s 11ms/step - loss: 3.3036 - mae: 3.7695
Epoch 81/100
Epoch 82/100
```

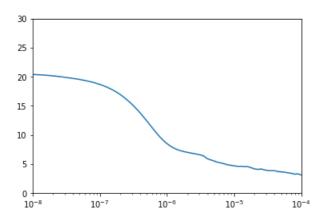
```
Epoch 83/100
Epoch 84/100
Epoch 85/100
Epoch 86/100
94/94 [======= 3.4709 - loss: 3.0089 - mae: 3.4709
Epoch 87/100
Epoch 88/100
Epoch 89/100
Epoch 90/100
Epoch 91/100
Epoch 92/100
Epoch 93/100
Epoch 94/100
94/94 [===========] - 1s 11ms/step - loss: 2.9083 - mae: 3.3719
Epoch 95/100
Epoch 96/100
Epoch 97/100
Epoch 98/100
Epoch 99/100
94/94 [========] - 1s 11ms/step - loss: 2.9151 - mae: 3.3793
Epoch 100/100
```

In [7]:

```
plt.semilogx(history.history["lr"], history.history["loss"])
plt.axis([1e-8, 1e-4, 0, 30])
```

Out[7]:

(1e-08, 0.0001, 0.0, 30.0)



In [8]:

```
tf.keras.backend.clear_session()
tf.random.set_seed(51)
np.random.seed(51)

tf.keras.backend.clear_session()
dataset = windowed_dataset(x_train, window_size, batch_size, shuffle_buffer_size)

model = tf.keras.models.Sequential([
    tf.keras.layers.Lambda(lambda x: tf.expand_dims(x, axis=-1),
```

```
input shape=[None]),
 tf.keras.layers.Bidirectional(tf.keras.layers.LSTM(32, return sequences=True)),
tf.keras.layers.Bidirectional(tf.keras.layers.LSTM(32)),
tf.keras.layers.Dense(1),
tf.keras.layers.Lambda(lambda x: x * 100.0)
1)
history = model.fit(dataset,epochs=500,verbose=1)
4
Epoch 1/500
Epoch 2/500
Epoch 3/500
94/94 [===========] - 1s 10ms/step - loss: 27.7103 - mae: 3.5518
Epoch 4/500
Epoch 5/500
Epoch 6/500
Epoch 7/500
Epoch 8/500
Epoch 9/500
Epoch 10/500
94/94 [===========] - 1s 11ms/step - loss: 28.0733 - mae: 3.6757
Epoch 11/500
94/94 [===========] - 1s 10ms/step - loss: 27.6546 - mae: 3.6672
Epoch 12/500
Epoch 13/500
Epoch 14/500
Epoch 15/500
Epoch 16/500
Epoch 17/500
Epoch 18/500
94/94 [=============] - 1s 11ms/step - loss: 26.4903 - mae: 3.5473
Epoch 19/500
Epoch 20/500
Epoch 21/500
Epoch 22/500
Epoch 23/500
94/94 [======] - 1s 11ms/step - loss: 28.0723 - mae: 3.7013
Epoch 24/500
Epoch 25/500
94/94 [============ ] - 1s 11ms/step - loss: 24.3323 - mae: 3.3488
Epoch 26/500
94/94 [======] - 1s 11ms/step - loss: 25.9359 - mae: 3.5183
Epoch 27/500
Epoch 28/500
Epoch 29/500
Epoch 30/500
Epoch 31/500
94/94 [======] - 1s 11ms/step - loss: 24.8964 - mae: 3.3859
Epoch 32/500
Epoch 33/500
01/01
        ______1 10 11mg/gton 1000. 24 5020 mag. 2 2002
```

	[======]	-	ΙS	ııms/scep	-	TOSS:	۷4.3939	-	ınae:	3.3903
-	34/500	_	1s	10ms/step	_	loss:	26.9419	_	mae:	3.6388
Epoch	35/500			-						
	[======] 36/500	-	1s	11ms/step	-	loss:	24.2124	-	mae:	3.3517
	[=======]	-	1s	11ms/step	-	loss:	26.1243	-	mae:	3.5010
	37/500 [======]		1.0	11mg/g+on		1000.	24 2100		m	2 2600
	38/500	_	15	IIMS/Step	_	1055:	24.2100	_	mae:	3.3090
	[======] 39/500	-	1s	11ms/step	-	loss:	25.1751	-	mae:	3.4867
-	[=======]	_	1s	11ms/step	_	loss:	29.6484	_	mae:	3.8720
	40/500 [======]	_	1 0	11mg/g+on	_	1000.	27 6396	_	m20.	3 6383
Epoch	41/500									
	[======] 42/500	-	1s	11ms/step	-	loss:	24.8158	-	mae:	3.4319
	[=======]	-	1s	11ms/step	-	loss:	24.1857	-	mae:	3.3383
	43/500 [=======]	_	1 e	11mg/sten	_	1000.	25 2320	_	mae.	3 4564
Epoch	44/500									
	[======] 45/500	-	1s	11ms/step	-	loss:	22.7423	-	mae:	3.2177
94/94	[=====]	-	1s	11ms/step	-	loss:	26.1130	-	mae:	3.5584
	46/500 [=======]	_	1s	10ms/step	_	loss:	26.3003	_	mae:	3.5451
Epoch	47/500									
	[======] 48/500	-	ls	llms/step	_	loss:	27.1847	_	mae:	3.6459
	[]	-	1s	11ms/step	-	loss:	25.0236	-	mae:	3.4406
-	49/500 [=======]	_	1s	10ms/step	_	loss:	24.7453	_	mae:	3.4041
	50/500 [=======]	_	1 c	11mg/gtan	_	1000.	2/ 1683	_	mae.	3 3799
Epoch	51/500									
	[======] 52/500	-	1s	11ms/step	-	loss:	23.7089	-	mae:	3.2937
94/94	[=====]	-	1s	11ms/step	-	loss:	26.3819	-	mae:	3.5666
	53/500 [=========]	_	1 s	11ms/step	_	loss:	24.5370	_	mae:	3.3710
Epoch	54/500									
	[======] 55/500	_	ls	11ms/step	-	loss:	23.6158	-	mae:	3.2934
94/94	[======]	-	1s	11ms/step	-	loss:	23.2196	-	mae:	3.2379
	56/500 [======]	_	1s	11ms/step	_	loss:	23.8406	_	mae:	3.3371
-	57/500		1	11ma/a+an		1	22 0206			2 2200
	[=====================================	_	IS	IIms/step	_	loss:	23.9306	_	mae:	3.3308
	[=======] 59/500	-	1s	11ms/step	-	loss:	24.5186	-	mae:	3.4204
-	[=======]	-	1s	11ms/step	-	loss:	23.6876	_	mae:	3.3415
-	60/500 [======]	_	1 e	11ms/sten	_	1000.	23 6655	_	mae.	3 2789
Epoch	61/500			-						
	[=======]	-	1s	11ms/step	-	loss:	24.8515	-	mae:	3.4363
94/94	[=====]	-	1s	11ms/step	-	loss:	23.4737	-	mae:	3.3026
-	63/500 [========]	_	1s	11ms/step	_	loss:	23.9637	_	mae:	3.3240
Epoch	64/500			-						
	[=======] 65/500	_	IS	ııms/step	_	TOSS:	∠4.U89I	_	шае:	3.3/32
	[======]	-	1s	11ms/step	-	loss:	23.1289	-	mae:	3.2762
	66/500 [======]	-	1s	11ms/step	_	loss:	25.2905	_	mae:	3.4505
-	67/500 [======]	_	10	11me/etan	_	1000	22 69NN	_	mae.	3 2022
Epoch	68/500			_						
	[=======] 69/500	-	1s	11ms/step	-	loss:	23.4361	-	mae:	3.2604
94/94	[=====]	-	1s	11ms/step	-	loss:	24.3627	-	mae:	3.4066
-	70/500	_	1s	11ms/step	_	loss:	22.6785	_	mae:	3.2219
Epoch	71/500			_						
	[======================================	_	ıs	ııms/step	_	TOSS:	22.84/0	_	mae:	3.23/9

_	/2/500	_	1 s	11ms/step	_	loss:	22.8695	_	mae:	3.2511
	73/500									
	[=======]	-	1s	11ms/step	-	loss:	23.5616	-	mae:	3.3078
-	74/500	_	1s	11ms/step	_	loss:	23.4071	_	mae:	3.2647
Epoch	75/500			-						
	76/500	-	1s	11ms/step	-	loss:	23.5623	-	mae:	3.3068
-	[=========]	_	1s	11ms/step	_	loss:	23.1138	_	mae:	3.2700
Epoch	77/500									
	[=======] 78/500	-	1s	10ms/step	-	loss:	24.1217	-	mae:	3.3795
-	[======]	-	1s	11ms/step	_	loss:	21.9296	_	mae:	3.1299
	79/500		-	dd / 1			00 5545			2 1046
	[=====================================	_	ls	llms/step	_	loss:	22.5547	_	mae:	3.1946
-	[======]	-	1s	11ms/step	-	loss:	22.8248	-	mae:	3.2368
-	81/500		1.0	11mg/g+op		1000.	22 2670		maa.	2 2005
	82/500	_	15	11ms/scep	_	1055;	23.3070	_	mae:	3.2093
		-	1s	11ms/step	-	loss:	23.6419	-	mae:	3.3587
-	83/500 [========]	_	1 s	11ms/step	_	loss:	24.2519	_	mae:	3.4740
Epoch	84/500									
	[======] 85/500	-	1s	10ms/step	-	loss:	22.8469	-	mae:	3.2698
-	[======]	_	1s	10ms/step	_	loss:	21.5177	_	mae:	3.1069
-	86/500		-	dd / 1			00 5515			2 222
	[=======] 87/500	-	ls	llms/step	_	loss:	22.5515	_	mae:	3.2007
94/94	[=====]	-	1s	11ms/step	-	loss:	24.2311	-	mae:	3.4214
-	88/500 [=========]	_	1 e	11ms/sten	_	1000.	21 6834	_	mae.	3 1197
	89/500		10	TIMO, Deep		1000.	21.0001		mac.	3.1137
	90/500	-	1s	11ms/step	-	loss:	23.2963	-	mae:	3.2804
-	[=========]	_	1s	11ms/step	_	loss:	22.5803	_	mae:	3.2255
-	91/500		_							
	92/500	-	ls	llms/step	_	loss:	22.9435	_	mae:	3.26/8
94/94	[]	-	1s	11ms/step	-	loss:	22.9946	-	mae:	3.2492
Epoch 94/94	93/500	_	1 s	11ms/sten	_	1088.	21 8949	_	mae•	3 1521
Epoch	94/500									
	[======] 95/500	-	1s	11ms/step	-	loss:	22.7477	-	mae:	3.2445
-	[======]	_	1s	11ms/step	_	loss:	22.2517	_	mae:	3.1707
-	96/500		1 -	11/		1	22 5404			2 2424
	[=====================================	_	15	IIMS/Step	_	TOSS:	22.3404	_	mae:	3.2424
	[======]	-	1s	10ms/step	-	loss:	21.5473	-	mae:	3.1395
	98/500 [=======]	_	1s	11ms/step	_	loss:	22.4396	_	mae:	3.2505
Epoch	99/500									
	[======] 100/500	-	1s	11ms/step	-	loss:	24.8146	-	mae:	3.4763
	[=======]	-	1s	11ms/step	_	loss:	22.2609	_	mae:	3.2191
	101/500 [========]		1	11ma/a+an		1	22 2407			2 2240
	102/500	_	15	IIMS/Step	_	TOSS:	22.3407	_	mae:	3.2249
	[======]	-	1s	11ms/step	-	loss:	22.7516	-	mae:	3.2552
	103/500	_	1s	11ms/step	_	loss:	21.9434	_	mae:	3.1619
Epoch	104/500									
	[======] 105/500	-	1s	11ms/step	-	loss:	22.4822	-	mae:	3.2110
	[========]	_	1s	11ms/step	_	loss:	29.8769	_	mae:	3.9280
	106/500		1 ~	11ma/a+-		100-	22 4007		m = = :	2 2201
	[=======] 107/500	_	ΙS	ııms/step	_	TOSS:	23.499/	_	шае:	3.3321
94/94	[======]	-	1s	11ms/step	-	loss:	21.9463	-	mae:	3.1658
	108/500	_	1s	11ms/step	_	loss:	21.5499	_	mae:	3.1116
Epoch	109/500									
	[======]	-	1s	11ms/step	-	loss:	22.7138	-	mae:	3.2621
04/04			4	aa / .		٦	^^ ^^^			2 2056

	[======]	-	ls	llms/step	-	loss:	23.0800	-	mae:	3.3056
	111/500 [=======]	_	1 s	11ms/step	_	loss:	21.2873	_	mae:	3.0915
Epoch	112/500									
	[=====================================	-	1s	11ms/step	-	loss:	22.5083	-	mae:	3.2165
	[=========]	_	1s	11ms/step	_	loss:	21.4437	_	mae:	3.1083
	114/500		-1	11 / 1		,	01 4050			2 1475
	[======] 115/500	_	ıs	lims/step	_	loss:	21.4252	_	mae:	3.14/5
	[=======]	-	1s	11ms/step	-	loss:	21.6504	-	mae:	3.1260
	116/500 [=========]	_	1s	11ms/step	_	loss:	22.0850	_	mae:	3.1667
Epoch	117/500									
	[=======] 118/500	_	ls	llms/step	_	loss:	21.3929	_	mae:	3.1136
	[======================================	-	1s	11ms/step	-	loss:	21.7492	-	mae:	3.1652
	119/500 [========]	_	1s	10ms/step	_	loss:	21.6794	_	mae:	3.1390
Epoch	120/500									
	[=======] 121/500	-	1s	11ms/step	-	loss:	21.8048	_	mae:	3.1431
94/94	[=======]	-	1s	10ms/step	-	loss:	21.8563	-	mae:	3.1721
-	122/500 [=========]	_	1s	11ms/step	_	loss:	21.1373	_	mae:	3.0954
Epoch	123/500			_						
	[======] 124/500	-	ls	11ms/step	-	loss:	21.6882	_	mae:	3.1588
94/94	[======]	-	1s	11ms/step	-	loss:	21.6074	-	mae:	3.1725
	125/500 [=======]	_	1s	11ms/step	_	loss:	22.5727	_	mae:	3.2897
Epoch	126/500									
	[========] 127/500	_	ls	llms/step	-	loss:	22.1914	_	mae:	3.1933
	[=======]	-	1s	11ms/step	-	loss:	21.9813	-	mae:	3.1896
	128/500 [=======]	_	1s	10ms/step	_	loss:	22.8436	_	mae:	3.2698
Epoch	129/500									
	[=====================================	_	15	IIMS/Step	_	1055:	22.43/3	_	mae:	3.2214
	[======================================	-	1s	11ms/step	-	loss:	22.6592	-	mae:	3.2470
	131/500 [========]	_	1s	11ms/step	_	loss:	20.9384	_	mae:	3.0797
_	132/500 [======]		1.0	11mg/g+op		1000.	20 4070		maa.	2 0165
Epoch	133/500									
	[======] 134/500	-	1s	11ms/step	-	loss:	20.5846	-	mae:	3.0416
-	[========]	-	1s	11ms/step	_	loss:	21.7864	_	mae:	3.1241
	135/500 [===========]	_	1 0	11me/etan	_	1000	24 9256	_	mae.	3 /52/
Epoch	136/500									
	[======] 137/500	-	1s	11ms/step	-	loss:	21.5886	-	mae:	3.1170
94/94	[======]	-	1s	11ms/step	_	loss:	21.0990	-	mae:	3.1106
	138/500 [===================================	_	1s	11ms/step	_	loss:	21.7004	_	mae:	3.1476
Epoch	139/500			-						
	[=======] 140/500	-	1s	10ms/step	-	loss:	21.0300	_	mae:	3.0783
94/94	[=======]	-	1s	11ms/step	-	loss:	25.7582	-	mae:	3.5320
-	141/500 [=======]	_	1s	11ms/step	_	loss:	20.8388	_	mae:	3.0338
Epoch	142/500									
	[========] 143/500	_	ls	llms/step	-	loss:	20.2664	_	mae:	3.0033
		-	1s	11ms/step	-	loss:	21.7753	-	mae:	3.1638
-	144/500 [========]	_	1s	11ms/step	_	loss:	21.1958	_	mae:	3.0857
Epoch	145/500			_						
	[=====================================	-	1S	11ms/step	-	loss:	22.2606	_	mae:	3.2245
94/94	[=======]	-	1s	10ms/step	-	loss:	21.6560	-	mae:	3.1214
	147/500 [========]	_	1s	11ms/step	_	loss:	20.7867	_	mae:	3.0714
Epoch	148/500									
		_	ıS	ııms/step	_	TOSS:	22.4344	_	шае:	J. Z4IU

94/94 [Epoch	149/500							
94/94 [====================================	94/94	[======]	-	1s	11ms/step - 1	loss:	23.5756 -	mae:	3.3757
94/94 [-		-	1s	11ms/step - 1	loss:	21.8291 -	mae:	3.2086
94/94 [-		_	1s	11ms/step - 1	loss:	22.4077 -	mae:	3.2051
Proch 153/500 154/500 154/500 154/500 154/500 154/500 154/500 154/500 156/50	-		_	1s	11ms/step - 1	loss:	21.1873 -	mae:	3.0776
Epoch 154/500 154/500 156/500	Epoch	153/500			_				
Report 155/500	Epoch	154/500			_				
Ropoch 156/500 - - - - - - - - -			-	1s	11ms/step - 1	loss:	23.3142 -	mae:	3.3304
94/94			-	1s	11ms/step - 1	loss:	20.4681 -	mae:	3.0309
94/94 [====================================	94/94	[======]	-	1s	11ms/step - 1	loss:	23.1925 -	mae:	3.3332
94/94 [94/94	[=====]	-	1s	11ms/step - 1	loss:	20.3855 -	mae:	3.0087
94/94 [-	1s	11ms/step - 1	loss:	21.2074 -	mae:	3.1344
94/94 [====================================	-		_	1s	11ms/step - 1	loss:	21.6414 -	mae:	3.1906
Epoch 161/500 94/94 163/500 183/500	-		_	1s	11ms/step - 1	loss:	20.5427 -	mae:	3.0115
Epoch 162/500 - 15 11ms/step 10ss; 20.8446 - mae; 3.0469 Epoch 163/500 34/94 - 15 11ms/step 10ss; 20.9991 - mae; 3.0612 Epoch 164/500 34/94 [Epoch	161/500			_				
Epoch 163/500 94/94	Epoch	162/500			_				
Epoch 164/500 94/94 [===================================	Epoch	163/500			_				
Epoch 165/500 94/94 [===================================			-	1s	11ms/step - 1	loss:	20.9991 -	mae:	3.0612
94/94 [====================================			-	1s	10ms/step - 1	loss:	21.2175 -	mae:	3.1015
94/94 [====================================	94/94	[======]	-	1s	11ms/step - 1	loss:	22.3292 -	mae:	3.2423
94/94 [====================================	94/94	[=====]	-	1s	11ms/step - 1	loss:	21.0130 -	mae:	3.0750
94/94 [============] - 1s 11ms/step - loss: 21.3695 - mae: 3.1401 Epoch 169/500 94/94 [==========] - 1s 11ms/step - loss: 20.9859 - mae: 3.077 Epoch 170/500 94/94 [==========] - 1s 11ms/step - loss: 20.1615 - mae: 3.0056 Epoch 171/500 94/94 [========] - 1s 11ms/step - loss: 20.8315 - mae: 3.0901 Epoch 172/500 94/94 [========] - 1s 11ms/step - loss: 20.2492 - mae: 2.9919 Epoch 173/500 94/94 [=========] - 1s 11ms/step - loss: 20.5532 - mae: 3.0338 Epoch 174/500 94/94 [=========] - 1s 11ms/step - loss: 20.7731 - mae: 3.0725 Epoch 175/500 94/94 [=========] - 1s 11ms/step - loss: 20.5776 - mae: 3.0553 Epoch 176/500 94/94 [=========] - 1s 11ms/step - loss: 20.8999 - mae: 3.0842 Epoch 177/500 94/94 [=========] - 1s 11ms/step - loss: 20.4238 - mae: 3.0239 Epoch 178/500 94/94 [==========] - 1s 11ms/step - loss: 20.4238 - mae: 3.0239 Epoch 178/500 94/94 [==========] - 1s 11ms/step - loss: 21.4502 - mae: 3.1252 Epoch 179/500 94/94 [===========] - 1s 11ms/step - loss: 21.4502 - mae: 3.1437 Epoch 181/500 94/94 [==========] - 1s 11ms/step - loss: 20.5348 - mae: 3.0162 Epoch 180/500 94/94 [==========] - 1s 11ms/step - loss: 20.6607 - mae: 3.0970 Epoch 183/500 94/94 [===========] - 1s 11ms/step - loss: 21.4011 - mae: 3.0970 Epoch 183/500 94/94 [===========] - 1s 11ms/step - loss: 21.5404 - mae: 3.1434 Epoch 186/500 94/94 [===========] - 1s 11ms/step - loss: 21.5404 - mae: 3.1434 Epoch 186/500 94/94 [============] - 1s 11ms/step - loss: 21.5404 - mae: 3.1434 Epoch 186/500 94/94 [============] - 1s 11ms/step - loss: 21.5404 - mae: 3.1434 Epoch 186/500 94/94 [====================================	94/94	[]	-	1s	11ms/step - 1	loss:	20.7085 -	mae:	3.0631
94/94 [====================================	-		_	1s	11ms/step - 1	loss:	21.3695 -	mae:	3.1401
Epoch 170/500 94/94 [====================================	-		_	1s	11ms/step - 1	loss:	20.9859 -	mae:	3.0777
Epoch 171/500 94/94 [====================================	Epoch	170/500							
Epoch 172/500 94/94 [====================================	Epoch	171/500							
Epoch 173/500 94/94 [====================================	Epoch	172/500							
Epoch 174/500 94/94 [====================================	Epoch	173/500							
Epoch 175/500 94/94 [====================================	Epoch	174/500							
Epoch 176/500 94/94 [====================================			-	1s	11ms/step - 1	loss:	20.7731 -	mae:	3.0725
94/94 [====================================			-	1s	11ms/step - 1	loss:	20.5776 -	mae:	3.0553
94/94 [====================================	94/94	[=====]	-	1s	11ms/step - 1	loss:	20.8999 -	mae:	3.0842
94/94 [====================================	94/94	[======]	-	1s	11ms/step - 1	loss:	20.4238 -	mae:	3.0239
94/94 [====================================	-		_	1s	11ms/step - 1	loss:	21.4502 -	mae:	3.1252
Epoch 180/500 94/94 [====================================			_	1s	11ms/step - 1	loss:	20.5348 -	mae:	3.0162
Epoch 181/500 94/94 [====================================	Epoch	180/500							
Epoch 182/500 94/94 [====================================	Epoch	181/500			_				
Epoch 183/500 94/94 [====================================	Epoch	182/500							
Epoch 184/500 94/94 [====================================	Epoch	183/500							
Epoch 185/500 94/94 [====================================	Epoch	184/500							
94/94 [====================================			-	1s	11ms/step - 1	loss:	20.6521 -	mae:	3.0206
94/94 [====================================	94/94	[=====]	-	1s	11ms/step - 1	loss:	21.5404 -	mae:	3.1434
	94/94	[======]	-	1s	11ms/step - 1	loss:	21.6742 -	mae:	3.1443
				-		-			

```
Epoch 188/500
Epoch 189/500
94/94 [==============] - 1s 11ms/step - loss: 20.9441 - mae: 3.0719
Epoch 190/500
94/94 [======== ] - 1s 10ms/step - loss: 20.3819 - mae: 3.0243
Epoch 191/500
Epoch 192/500
Epoch 193/500
Epoch 194/500
Epoch 195/500
Epoch 196/500
Epoch 197/500
94/94 [============ ] - 1s 11ms/step - loss: 20.9707 - mae: 3.0891
Epoch 198/500
Epoch 199/500
Epoch 200/500
Epoch 201/500
Epoch 202/500
Epoch 203/500
Epoch 204/500
94/94 [=======] - 1s 10ms/step - loss: 21.0335 - mae: 3.0975
Epoch 205/500
94/94 [=============] - 1s 11ms/step - loss: 20.0976 - mae: 2.9756
Epoch 206/500
Epoch 207/500
Epoch 208/500
Epoch 209/500
Epoch 210/500
Epoch 211/500
Epoch 212/500
94/94 [============ ] - 1s 11ms/step - loss: 19.9527 - mae: 3.0070
Epoch 213/500
Epoch 214/500
Epoch 215/500
Epoch 216/500
Epoch 217/500
94/94 [======] - 1s 11ms/step - loss: 20.2658 - mae: 3.0085
Epoch 218/500
Epoch 219/500
94/94 [=============] - 1s 11ms/step - loss: 21.2198 - mae: 3.0916
Epoch 220/500
94/94 [======] - 1s 11ms/step - loss: 20.1959 - mae: 3.0016
Epoch 221/500
Epoch 222/500
Epoch 223/500
94/94 [============= - 1s 11ms/step - loss: 19.9920 - mae: 2.9865
Epoch 224/500
Epoch 225/500
94/94 [===========] - 1s 10ms/step - loss: 20.4834 - mae: 3.0233
```

```
Epoch 226/500
Epoch 227/500
Epoch 228/500
Epoch 229/500
94/94 [============== ] - 1s 11ms/step - loss: 20.4744 - mae: 3.0407
Epoch 230/500
Epoch 231/500
Epoch 232/500
Epoch 233/500
94/94 [=============] - 1s 11ms/step - loss: 21.2955 - mae: 3.0976
Epoch 234/500
Epoch 235/500
Epoch 236/500
94/94 [==============] - 1s 11ms/step - loss: 20.8176 - mae: 3.0433
Epoch 237/500
94/94 [===========] - 1s 11ms/step - loss: 21.9545 - mae: 3.2219
Epoch 238/500
Epoch 239/500
Epoch 240/500
Epoch 241/500
Epoch 242/500
Epoch 243/500
94/94 [===========] - 1s 11ms/step - loss: 21.5194 - mae: 3.1192
Epoch 244/500
94/94 [============ ] - 1s 11ms/step - loss: 20.9909 - mae: 3.1037
Epoch 245/500
Epoch 246/500
Epoch 247/500
Epoch 248/500
Epoch 249/500
Epoch 250/500
Epoch 251/500
Epoch 252/500
94/94 [============] - 1s 11ms/step - loss: 21.0175 - mae: 3.0600
Epoch 253/500
Epoch 254/500
Epoch 255/500
94/94 [=============] - 1s 11ms/step - loss: 20.8168 - mae: 3.0846
Epoch 256/500
Epoch 257/500
Epoch 258/500
94/94 [==============] - 1s 10ms/step - loss: 19.8521 - mae: 2.9595
Epoch 259/500
94/94 [===========] - 1s 11ms/step - loss: 21.0645 - mae: 3.1025
Epoch 260/500
Epoch 261/500
Epoch 262/500
Epoch 263/500
Epoch 264/500
```

```
Epoch 265/500
94/94 [============= - 1s 11ms/step - loss: 20.9269 - mae: 3.0748
Epoch 266/500
Epoch 267/500
Epoch 268/500
Epoch 269/500
Epoch 270/500
Epoch 271/500
Epoch 272/500
Epoch 273/500
94/94 [============= - 1s 11ms/step - loss: 20.8637 - mae: 3.0835
Epoch 274/500
Epoch 275/500
94/94 [========] - 1s 11ms/step - loss: 20.0291 - mae: 2.9863
Epoch 276/500
94/94 [============] - 1s 11ms/step - loss: 20.0255 - mae: 2.9702
Epoch 277/500
Epoch 278/500
Epoch 279/500
Epoch 280/500
Epoch 281/500
Epoch 282/500
94/94 [==========] - 1s 11ms/step - loss: 19.8317 - mae: 2.9583
Epoch 283/500
94/94 [=============] - 1s 11ms/step - loss: 21.1762 - mae: 3.1102
Epoch 284/500
Epoch 285/500
Epoch 286/500
94/94 [==============] - 1s 11ms/step - loss: 20.5029 - mae: 3.0271
Epoch 287/500
Epoch 288/500
Epoch 289/500
94/94 [======== ] - 1s 11ms/step - loss: 20.7957 - mae: 3.0680
Epoch 290/500
94/94 [===========] - 1s 11ms/step - loss: 19.6834 - mae: 2.9487
Epoch 291/500
94/94 [============ ] - 1s 11ms/step - loss: 20.0955 - mae: 2.9706
Epoch 292/500
Epoch 293/500
Epoch 294/500
Epoch 295/500
Epoch 296/500
Epoch 297/500
94/94 [==============] - 1s 11ms/step - loss: 21.5185 - mae: 3.1188
Epoch 298/500
94/94 [=======] - 1s 11ms/step - loss: 20.0247 - mae: 2.9898
Epoch 299/500
Epoch 300/500
Epoch 301/500
Epoch 302/500
```

```
Epoch 303/500
   94/94 [====
Epoch 304/500
Epoch 305/500
94/94 [======] - 1s 10ms/step - loss: 21.7470 - mae: 3.1606
Epoch 306/500
94/94 [=======] - 1s 10ms/step - loss: 19.7005 - mae: 2.9708
Epoch 307/500
94/94 [===========] - 1s 10ms/step - loss: 20.3173 - mae: 3.0184
Epoch 308/500
94/94 [==============] - 1s 11ms/step - loss: 20.2947 - mae: 3.0025
Epoch 309/500
Epoch 310/500
Epoch 311/500
Epoch 312/500
Epoch 313/500
94/94 [======] - 1s 11ms/step - loss: 19.7361 - mae: 2.9476
Epoch 314/500
Epoch 315/500
94/94 [=======] - 1s 11ms/step - loss: 19.8656 - mae: 2.9867
Epoch 316/500
Epoch 317/500
Epoch 318/500
Epoch 319/500
Epoch 320/500
Epoch 321/500
Epoch 322/500
94/94 [==============] - 1s 10ms/step - loss: 19.8593 - mae: 2.9576
Epoch 323/500
Epoch 324/500
Epoch 325/500
Epoch 326/500
Epoch 327/500
Epoch 328/500
Epoch 329/500
94/94 [===========] - 1s 11ms/step - loss: 22.6375 - mae: 3.2417
Epoch 330/500
Epoch 331/500
Epoch 332/500
Epoch 333/500
94/94 [===========] - 1s 11ms/step - loss: 20.5551 - mae: 3.0252
Epoch 334/500
Epoch 335/500
Epoch 336/500
Epoch 337/500
94/94 [==========] - 1s 11ms/step - loss: 20.0707 - mae: 2.9655
Epoch 338/500
Epoch 339/500
Epoch 340/500
Epoch 341/500
```

```
Epoch 342/500
Epoch 343/500
Epoch 344/500
94/94 [============= - 1s 11ms/step - loss: 20.0868 - mae: 2.9748
Epoch 345/500
94/94 [======] - 1s 11ms/step - loss: 20.3465 - mae: 3.0003
Epoch 346/500
Epoch 347/500
Epoch 348/500
94/94 [============] - 1s 11ms/step - loss: 19.6917 - mae: 2.9660
Epoch 349/500
Epoch 350/500
94/94 [===========] - 1s 11ms/step - loss: 20.1338 - mae: 2.9843
Epoch 351/500
Epoch 352/500
Epoch 353/500
94/94 [===========] - 1s 11ms/step - loss: 20.1603 - mae: 2.9854
Epoch 354/500
94/94 [=======] - 1s 11ms/step - loss: 19.6834 - mae: 2.9550
Epoch 355/500
94/94 [=============] - 1s 11ms/step - loss: 20.2000 - mae: 3.0038
Epoch 356/500
Epoch 357/500
Epoch 358/500
94/94 [============== ] - 1s 11ms/step - loss: 20.2883 - mae: 3.0384
Epoch 359/500
94/94 [===========] - 1s 11ms/step - loss: 19.8416 - mae: 2.9785
Epoch 360/500
94/94 [======] - 1s 11ms/step - loss: 19.9178 - mae: 2.9744
Epoch 361/500
94/94 [==========] - 1s 11ms/step - loss: 20.4117 - mae: 3.0360
Epoch 362/500
Epoch 363/500
94/94 [============= ] - 1s 11ms/step - loss: 20.7742 - mae: 3.0530
Epoch 364/500
Epoch 365/500
Epoch 366/500
Epoch 367/500
Epoch 368/500
94/94 [=======] - 1s 11ms/step - loss: 20.6335 - mae: 3.0484
Epoch 369/500
94/94 [==============] - 1s 11ms/step - loss: 19.4817 - mae: 2.9516
Epoch 370/500
Epoch 371/500
Epoch 372/500
Epoch 373/500
Epoch 374/500
Epoch 375/500
Epoch 376/500
94/94 [======== ] - 1s 11ms/step - loss: 20.1796 - mae: 3.0104
Epoch 377/500
Epoch 378/500
Epoch 379/500
```

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Epoch 380/500
Epoch 381/500
Epoch 382/500
Epoch 383/500
Epoch 384/500
94/94 [============ ] - 1s 11ms/step - loss: 19.8157 - mae: 2.9628
Epoch 385/500
Epoch 386/500
Epoch 387/500
Epoch 388/500
Epoch 389/500
Epoch 390/500
Epoch 391/500
Epoch 392/500
Epoch 393/500
Epoch 394/500
Epoch 395/500
Epoch 396/500
Epoch 397/500
Epoch 398/500
Epoch 399/500
94/94 [===========] - 1s 11ms/step - loss: 21.6251 - mae: 3.1401
Epoch 400/500
94/94 [======] - 1s 11ms/step - loss: 20.0713 - mae: 2.9976
Epoch 401/500
Epoch 402/500
Epoch 403/500
Epoch 404/500
Epoch 405/500
94/94 [========= ] - 1s 11ms/step - loss: 19.5479 - mae: 2.9403
Epoch 406/500
94/94 [===========] - 1s 11ms/step - loss: 19.9967 - mae: 2.9827
Epoch 407/500
94/94 [======] - 1s 11ms/step - loss: 19.5811 - mae: 2.9466
Epoch 408/500
Epoch 409/500
Epoch 410/500
Epoch 411/500
94/94 [======] - 1s 11ms/step - loss: 19.5090 - mae: 2.9467
Epoch 412/500
Epoch 413/500
Epoch 414/500
94/94 [========= ] - 1s 11ms/step - loss: 20.3733 - mae: 3.0405
Epoch 415/500
94/94 [===========] - 1s 11ms/step - loss: 21.8227 - mae: 3.1987
Epoch 416/500
Epoch 417/500
Epoch 418/500
```

```
Epoch 419/500
Epoch 420/500
Epoch 421/500
Epoch 422/500
Epoch 423/500
94/94 [=============] - 1s 11ms/step - loss: 19.7165 - mae: 2.9603
Epoch 424/500
94/94 [======] - 1s 11ms/step - loss: 20.4419 - mae: 3.0556
Epoch 425/500
Epoch 426/500
Epoch 427/500
94/94 [============] - 1s 11ms/step - loss: 20.9387 - mae: 3.0853
Epoch 428/500
Epoch 429/500
Epoch 430/500
94/94 [=============] - 1s 11ms/step - loss: 20.4837 - mae: 3.0320
Epoch 431/500
94/94 [=============] - 1s 11ms/step - loss: 19.9459 - mae: 2.9730
Epoch 432/500
Epoch 433/500
Epoch 434/500
Epoch 435/500
Epoch 436/500
Epoch 437/500
Epoch 438/500
94/94 [============ ] - 1s 11ms/step - loss: 20.3398 - mae: 3.0013
Epoch 439/500
94/94 [======] - 1s 11ms/step - loss: 19.7846 - mae: 2.9389
Epoch 440/500
Epoch 441/500
Epoch 442/500
Epoch 443/500
Epoch 444/500
Epoch 445/500
Epoch 446/500
94/94 [=============] - 1s 11ms/step - loss: 21.1824 - mae: 3.1109
Epoch 447/500
Epoch 448/500
Epoch 449/500
Epoch 450/500
Epoch 451/500
Epoch 452/500
Epoch 453/500
94/94 [============ ] - 1s 11ms/step - loss: 19.6014 - mae: 2.9476
Epoch 454/500
Epoch 455/500
Epoch 456/500
```

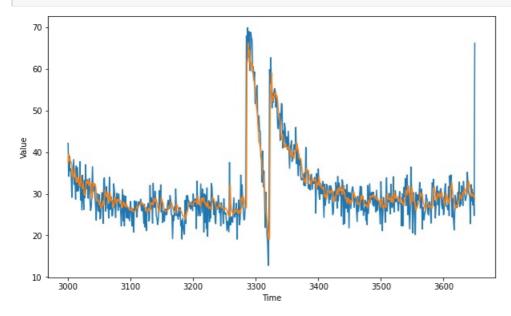
```
Epoch 457/500
Epoch 458/500
Epoch 459/500
Epoch 460/500
Epoch 461/500
Epoch 462/500
Epoch 463/500
94/94 [============ ] - 1s 11ms/step - loss: 19.5025 - mae: 2.9270
Epoch 464/500
Epoch 465/500
Epoch 466/500
Epoch 467/500
Epoch 468/500
Epoch 469/500
94/94 [=======] - 1s 11ms/step - loss: 20.1634 - mae: 2.9885
Epoch 470/500
94/94 [========] - 1s 11ms/step - loss: 19.8561 - mae: 2.9412
Epoch 471/500
Epoch 472/500
Epoch 473/500
Epoch 474/500
Epoch 475/500
Epoch 476/500
Epoch 477/500
94/94 [==============] - 1s 11ms/step - loss: 21.5276 - mae: 3.1443
Epoch 478/500
94/94 [=============] - 1s 11ms/step - loss: 19.8143 - mae: 2.9628
Epoch 479/500
Epoch 480/500
94/94 [============== ] - 1s 11ms/step - loss: 20.3447 - mae: 3.0457
Epoch 481/500
Epoch 482/500
Epoch 483/500
Epoch 484/500
Epoch 485/500
94/94 [============ ] - 1s 11ms/step - loss: 19.1437 - mae: 2.9070
Epoch 486/500
Epoch 487/500
Epoch 488/500
Epoch 489/500
Epoch 490/500
Epoch 491/500
Epoch 492/500
94/94 [========= ] - 1s 11ms/step - loss: 21.2750 - mae: 3.1124
Epoch 493/500
94/94 [=============] - 1s 11ms/step - loss: 19.6858 - mae: 2.9468
Epoch 494/500
Epoch 495/500
```

In [9]:

```
forecast = []
results = []
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]

plt.figure(figsize=(10, 6))
plot_series(time_valid, x_valid)
plot_series(time_valid, results)
```



In [10]:

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

Out[10]:

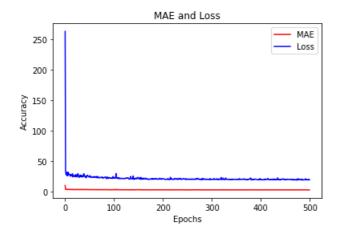
2.920534

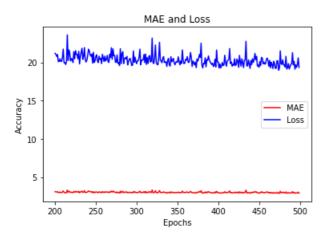
In [11]:

```
# Plot MAE and Loss
plt.plot(epochs, mae, 'r')
plt.plot(epochs, loss, 'b')
plt.title('MAE and Loss')
plt.xlabel("Epochs")
plt.ylabel("Accuracy")
plt.legend(["MAE", "Loss"])
plt.figure()
epochs_zoom = epochs[200:]
mae zoom = mae[200:]
loss_zoom = loss[200:]
# Plot Zoomed MAE and Loss
plt.plot(epochs zoom, mae zoom, 'r')
plt.plot(epochs_zoom, loss_zoom, 'b')
plt.title('MAE and Loss')
plt.xlabel("Epochs")
plt.ylabel("Accuracy")
plt.legend(["MAE", "Loss"])
plt.figure()
```

Out[11]:

<Figure size 432x288 with 0 Axes>





<Figure size 432x288 with 0 Axes>

In []: