```
imnort keras
keras.__version__
     2 4 3
from google.colab import drive
drive.mount('/content/drive')
     Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force remount=True).
import os, shutil
data_dir = '/content/drive/MyDrive/climate'
!ls '/content/drive/MyDrive/climate'
     iena climate 2009 2016.csv
import os
fname = os.path.join(data dir, 'jena climate 2009 2016.csv')
f = open(fname)
data = f.read()
f.close()
lines = data.split('\n')
header = lines[0].split(',')
lines = lines[1:]
print(header)
      ['"Date Time", '"p (mbar)", '"T (degC)"', '"Tpot (K)"', '"Tdew (degC)"', '"rh (%)"', '"VPmax (mbar)"', '"VPact (mbar)"', '"VPdef (mbar)"', '"sh (g/kg)"', '"H2OC (mmo1/mo1)"', '"rho (g/m**3)"', '"wv (m/s)"', '"max. wv (m/s)"', '"d (deg)"']
convert the 420,551 lines of data into a Numpy array: link text
import numpy as np
float_data = np.zeros((len(lines), len(header) - 1))
for i, line in enumerate(lines):

values = [float(x) for x in line.split(',')[1:]]
    float_data[i, :] = values
Preparing the data
Preprocess the data
mean = float_data[:200000].mean(axis=0)
float data -= mean
std = float_data[:200000].std(axis=0)
float_data /= std
Data Generation
def generator(data, lookback, delay, min_index, max_index,
              shuffle=False, batch_size=128, step=6):
    if max index is None:
        max_index = len(data) - delay - 1
    i = min_index + lookback
    while 1:
        if shuffle:
            rows = np.random.randint(
               min_index + lookback, max_index, size=batch_size)
            if i + batch_size >= max_index:
                i = min index + lookback
            rows = np.arange(i, min(i + batch_size, max_index))
        samples = np.zeros((len(rows),
                           lookback // step.
                            data.shape[-1]))
        targets = np.zeros((len(rows),))
        for j, row in enumerate(rows):
            indices = range(rows[j] - lookback, rows[j], step)
samples[j] = data[indices]
            targets[j] = data[rows[j] + delay][1]
        yield samples, targets
lookback = 1440
step = 6
delay = 144
```

```
train gen = generator(float data.
             lookback=lookback.
             min_index=0,
             may indov=200000
             shuffle=True.
             step=step.
             batch size=batch size)
val_gen = generator(float_data,
            lookhack=lookhack
            delav=delav
            min index=200001
            max index=300000,
            step=step,
            hatch size=batch size)
test gen = generator(float data,
             lookback=lookback
             delay=delay,
             min_index=300001
             max index=None.
             stenmsten.
             batch_size=batch_size)
# This is how many stens to draw from 'val gen
# in order to see the whole validation set
val stens = (300000 - 200001 - lookback) // batch size
# This is how many steps to draw from `test_gen
# in order to see the whole test set:
test steps = (len(float data) - 300001 - lookback) // batch size
A basic machine learning approach
from keras.models import Sequential
from keras import layers
from keras ontimizers import RMSprop
model = Sequential()
model.add(layers.Flatten(input_shape=(lookback // step, float_data.shape[-1])))
model.add(layers.Dense(32, activation='relu'))
model.add(layers.Dense(1))
model.compile(optimizer=RMSprop(), loss='mae')
history = model.fit_generator(train_gen,
                  steps_per_epoch=500
                  enochs=20.
                  validation data=val gen.
                  validation_steps=val steps)
   /usr/local/lib/python3.7/dist-packages/tensorflow/python/keras/engine/training.py:1844: UserWarning: `Model.fit generator` is deprecated and will be removed in a future version. Please use `Model.fit`, which supports generators.
    warnings.warn('`Model.fit_generator` is deprecated and
   Fnoch 1/20
   500/500 [====
              Epoch 2/20
              Fnoch 3/20
   500/500 [===
              Fnoch 4/20
   500/500 [===
                     Epoch 5/20
   500/500 [==
                Fnoch 6/20
   500/500 [===
                Epoch 7/20
   500/500 [===
                      Epoch 8/20
   500/500 [===
                 Fnoch 9/20
   500/500 [====
              Epoch 10/20
   500/500 [===
                Enoch 11/20
   500/500 [====
                     Enoch 12/20
   500/500 [====
                      Epoch 13/20
   500/500 [====
              Enoch 14/20
   500/500 [====
                Epoch 15/20
   500/500 [===
                     Epoch 16/20
   500/500 [====
                     Enoch 17/20
   500/500 [===
                     Epoch 18/20
   500/500 [===
                     Enoch 19/20
   500/500 [===
                     Epoch 20/20
              import matplotlib.pyplot as plt
loss = history.history['loss']
val_loss = history.history['val_loss']
epochs = range(len(loss))
```

```
plt.figure()
plt.plot(epochs, loss, 'bo', label='Training loss')
plt.plot(epochs, val loss, 'b', label='Validation loss')
plt.title('Training and validation loss')
plt.legend()
plt.show()
                Training and validation loss
       0.0 2.5 5.0 7.5 10.0 12.5 15.0 17.5
Using RNN
from keras.models import Sequential
from keras import layers
from keras.optimizers import RMSprop
model = Sequential()
model.add(layers.GRU(32, input_shape=(None, float_data.shape[-1])))
model.add(layers.Dense(1))
model.compile(optimizer=RMSprop(), loss='mae')
history = model.fit_generator(train_gen,
                       steps_per_epoch=500,
                       enochs=10.
                       validation data=val gen.
                       validation_steps=val steps)
    /usr/local/lib/python3.7/dist-packages/tensorflow/python/keras/engine/training.py:1844: UserWarning: `Model.fit generator' is deprecated and will be removed in a future version. Please use `Model.fit', which supports generators.
    warnings.warn('`Model.fit_generator` is deprecated and Epoch 1/10
    500/500 [==
                           Epoch 2/10
    500/500 [===
                   Fnoch 3/10
                           =======] - 94s 188ms/step - loss: 0.2782 - val loss: 0.2651
    Fnoch 4/10
    500/500 [===
                            Fnoch 5/10
    500/500 [===
                              Fnoch 6/10
    500/500 [===
Epoch 7/10
                           500/500 [===
                            Fnoch 8/10
    500/500 [==
                            Fnoch 9/10
    500/500 [===
                      Epoch 10/10
                  Let look at our results:
loss = history.history['loss']
val_loss = history.history['val_loss']
epochs = range(len(loss))
plt.figure()
plt.plot(epochs, loss, 'bo', label='Training loss')
plt.plot(epochs, val_loss, 'b', label='Validation loss')
plt.title('Training and validation loss')
plt.legend()
plt.show()
                Training and validation loss
     0.2
     0.21
     0.26
```

```
Using recurrent dropout to fight overfitting
from keras.models import Sequential
from kense import layers
from keras.optimizers import RMSnron
model = Sequential()
model.add(layers.GRU(32,
                dronout=0 ?
                 recurrent dronout=0 2
                 input shape=(None, float data,shape[-1])))
model.add(layers.Dense(1))
model.compile(optimizer=RMSprop(), loss='mae')
history = model.fit_generator(train_gen,
                        steps per epoch=500.
                        epochs=10,
                        validation_data=val_gen,
                        validation stens=val stens
    /usr/local/lib/python3.7/dist-packages/tensorflow/python/keras/engine/training.py:1844: UserWarning: `Model.fit generator` is deprecated and will be removed in a future version. Please use `Model.fit`, which supports generators.
     warnings.warn('`Model.fit_generator` is deprecated and
                  500/500 [====
    Epoch 2/10
500/500 [===
                   Epoch 3/10
500/500 [===
                            ======== 1 - 140s 281ms/sten - loss: 0.2999 - val loss: 0.2708
    Epoch 4/10
                   500/500 F---
    Epoch 5/10
500/500 [====
                  Epoch 6/10
    500/500 [==
                       Epoch 7/10
500/500 [===
                     Epoch 8/10
500/500 [===
                            ======] - 138s 276ms/step - loss: 0.2810 - val loss: 0.2658
    Epoch 9/10
                  500/500 [====
                  500/500 [====
loss = history.history['loss']
val_loss = history.history['val_loss']
epochs = range(len(loss))
plt.figure()
plt.plot(epochs, loss, 'bo', label='Training loss')
plt.plot(epochs, val_loss, 'b', label='Validation loss')
plt.title('Training and validation loss')
plt.legend()
plt.show()
                 Training and validation loss
     0.3
     0.30
    0.2
using Stacking recurrent layers
from keras.models import Sequential
from keras import layers
from keras.optimizers import RMSprop
model = Sequential()
model.add(layers.GRU(32,
                dropout=0.1,
                 recurrent_dropout=0.5,
                 return_sequences=True,
                 input_shape=(None, float_data.shape[-1])))
model.add(layers.GRU(64, activation='relu',
                 dropout=0.1,
                 recurrent_dropout=0.5))
model.add(layers.Dense(1))
model.compile(optimizer=RMSprop(), loss='mae')
history = model.fit_generator(train_gen,
```

steps_per_epoch=500, epochs=10, validation_data=val_gen, validation_steps=val_steps)

```
weather timeseries - Colaboratory
   /usr/local/lib/python3.7/dist-packages/tensorflow/python/keras/engine/training.py:1844: UserWarning: `Model.fit generator' is deprecated and will be removed in a future version. Please use `Model.fit', which supports generators.
   warnings.warn('`Model.fit_generator` is deprecated and Epoch 1/10
            500/500 [----
             500/500 [====
              500/500 [---
               500/500 [===
   Epoch 5/10
             500/500 [===
   Epoch 7/10
   500/500 [===
               500/500 [===
   500/500 [---
             loss = history.history['loss']
val_loss = history.history['val_loss']
epochs = range(len(loss))
plt.figure()
plt.plot(epochs, loss, 'bo', label='Training loss')
plt.plot(epochs, val loss, 'b', label='Validation loss')
plt.title('Training and validation loss')
plt.legend()
plt.show()
            Training and validation loss
   0.32

    Training loss

   0.3
   0.30
   0.29
   0.2
Using bidirectional RNNs
def reverse_order_generator(data, lookback, delay, min_index, max_index,
                shuffle=False, batch_size=128, step=6):
  if max index is None:
    max_index = len(data) - delay - 1
```

```
i = min_index + lookback
    while 1:
             rows = np.random.randint(
                min_index + lookback, max_index, size=batch_size)
            if i + batch size >= max index:
                i = min_index + lookback
            rows = np.arange(i, min(i + batch_size, max_index))
            i += len(rows)
        samples = np.zeros((len(rows),
                            data.shape[-1]))
        targets = np.zeros((len(rows),))
        for j, row in enumerate(rows):
    indices = range(rows[i] - lookback, rows[i], step)
             samples[j] = data[indices]
            targets[j] = data[rows[j] + delay][1]
        yield samples[:, ::-1, :], targets
train_gen_reverse = reverse_order_generator(
    float_data,
    lookback=lookback
    delay=delay,
min_index=0,
    max_index=200000
    shuffle=True,
    step=step,
    batch_size=batch_size)
val gen reverse = reverse order generator(
    float_data,
    lookback=lookback,
    delay=delay,
    min_index=200001,
max_index=300000,
    step=step,
    batch_size=batch_size)
```

```
model = Sequential()
model.add(lavers.GRU(32, input shape=(None, float data.shape[-1])))
model.add(layers.Dense(1))
model.compile(optimizer=RMSprop(), loss='mae')
history = model.fit generator(train gen reverse.
                      steps per epoch=500
                      validation_data=val_gen_reverse,
                      validation stone-val stone)
    /usr/local/lib/python3.7/dist-packages/tensorflow/python/keras/engine/training.py:1844: UserWarning: `Model.fit generator` is deprecated and will be removed in a future version. Please use `Model.fit`, which supports generators.
     warnings.warn('`Model.fit_generator` is deprecated and
    Epoch 1/20
500/500 [===
                    Epoch 2/20
500/500 [===
                   Epoch 3/20
500/500 [===
                           Epoch 4/20
    500/500 [==
                          ********** - 91s 182ms/sten - loss: 0.3615 - val loss: 0.4039
   Epoch 5/20
500/500 [===
                          Epoch 6/20
                           Epoch 7/20
500/500 [===
                          Epoch 8/20
500/500 [==
                           ======] - 91s 183ms/step - loss: 0.2806 - val loss: 0.3650
    Epoch 9/20
    500/500 [===
                           Epoch 10/20
500/500 [===
                          Epoch 11/20
500/500 [===
                           Epoch 12/20
500/500 [===
                          Epoch 13/20
500/500 [===
                           Epoch 14/20
    500/500 [===
                           ========= 1 - 92s 184ms/sten - loss: 0.2382 - val loss: 0.3530
   Epoch 15/20
500/500 [====
                          ======== 1 - 92s 185ms/step - loss: 0.2339 - val loss: 0.3598
   Epoch 16/20
500/500 [===
                          ======== 1 - 94s 188ms/sten - loss: 0.2302 - val loss: 0.3593
    Epoch 17/20
500/500 [===
                           ======== 1 - 92s 184ms/step - loss: 0.2268 - val loss: 0.3665
    Epoch 18/20
                          500/500 [===
    Epoch 19/20
                   500/500 [===
    Epoch 20/20
    500/500 [====
                   import matplotlib.pyplot as plt
loss = history.history['loss']
val_loss = history.history['val_loss']
epochs = range(len(loss))
plt.figure()
plt.plot(epochs, loss, 'bo', label='Training loss')
plt.plot(epochs, val_loss, 'b', label='Validation loss')
plt.title('Training and validation loss')
nlt.legend()
plt.show()
                Training and validation loss

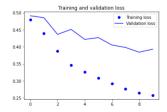
    Training loss

    0.4
    0.3
    0.30
           2.5 5.0 7.5 10.0 12.5 15.0 17.5
from keras import backend as K
K.clear_session()
from keras.models import Sequential
from keras import layers
from keras.optimizers import RMSprop
model = Sequential()
model.add(layers.Bidirectional(
   layers.GRU(32), input_shape=(None, float_data.shape[-1])))
model.add(layers.Dense(1))
model.compile(optimizer=RMSprop(), loss='mae')
history = model.fit_generator(train_gen,
```

delay=delay,
min_index=200001,

```
epochs=10,
                      validation data=val gen.
                      validation_data=val_gen;
validation steps=val steps)
   /usr/local/lib/python3.7/dist-packages/tensorflow/python/keras/engine/training.py:1844: UserWarning: `Model.fit_generator` is deprecated and will be removed in a future version. Please use `Model.fit`, which supports generators. warnings.warn('Model.fit generator' is deprecated and '
    500/500 [===
                Epoch 2/10
500/500 [==
                 Enoch 3/10
                 Enoch 4/10
    500/500 [==
                  Enoch 5/10
    500/500 [====
               Fnoch 6/10
                 Enoch 7/10
                  Fnoch 8/10
    500/500 [===
                  Enoch 9/10
                Enoch 10/10
    500/500 [=====
                loss = history.history['loss']
val loss = history.history['val loss']
epochs = range(len(loss))
plt.figure()
plt.plot(epochs, loss, 'bo', label='Training loss')
plt.plot(epochs, val_loss, 'b', label='Validation loss')
plt.title('Training and validation loss')
nlt.legend()
plt.show()
                Training and validation loss
    0.29
    0.28
    0.2
    0.26
    0.25
     0.24
     0.23
def reverse order generator(data, lookback, delay, min index, max index,
                     shuffle=False, batch_size=128, step=6):
   if max index is None:
      max_index = len(data) - delay - 1
   i = min_index + lookback
   while 1:
      if shuffle:
         rows = np.random.randint(
            min_index + lookback, max_index, size=batch_size)
      else:
        if i + batch size >= max index:
           i = min_index + lookback
         rows = np.arange(i, min(i + batch_size, max_index))
        i += len(rows)
      samples = np.zeros((len(rows),
                    lookback // step,
                    data.shape[-1]))
      targets = np.zeros((len(rows),))
      for j, row in enumerate(rows):
         indices = range(rows[j] - lookback, rows[j], step)
         samples[j] = data[indices]
         targets[j] = data[rows[j] + delay][1]
      yield samples[:, ::-1, :], targets
train gen reverse = reverse order generator(
   float_data,
   lookback=lookback,
   delay=delay,
   min index=0.
   max_index=200000
   shuffle=True,
   step=step,
   batch_size=batch_size)
test_gen_reverse = reverse_order_generator(
   float_data,
   lookback=lookback,
```

```
step=step.
  batch size=batch size)
model = Sequential()
model.add(lavers.GRU(32, input shape=(None, float data.shape[-1])))
model.add(layers.Dense(1))
model.compile(optimizer=RMSprop(), loss='mae')
history = model.fit generator(train gen reverse.
                  stens per enoch=500
                  validation_data=test_gen_reverse;
                  validation stens=test stens
   /usr/local/lib/python3.7/dist-packages/tensorflow/python/keras/engine/training.py:1844: UserWarning: `Model.fit generator` is deprecated and will be removed in a future version. Please use `Model.fit', which supports generators.
    warnings.warn('`Model.fit_generator` is deprecated and
            500/500 [----
   Epoch 2/10
500/500 [====
             500/500 [====
              Epoch 4/10
   500/500 [----
              500/500 [====
              Epoch 6/10
   500/500 [===
              Epoch 7/10
500/500 [====
              Epoch 8/10
   500/500 [==
                500/500 [----
   Epoch 10/10
              500/500 [====
loss = history.history['loss']
val loss = history.history['val loss']
epochs = range(len(loss))
plt.figure()
plt.plot(epochs, loss, 'bo', label='Training loss')
plt.plot(epochs, val_loss, 'b', label='Validation loss')
plt.title('Training and validation loss')
plt.legend()
plt.show()
```



Using RNN - We got a validation MAE of 0.2651 @ 3epochs before the model starts to overfit

Using recurrent drop out - we got a validation MAE of 0.2658 @4epochs before the model starts to overfit

 $Using \ stacking \ recurrent \ layers - we got \ a \ validation \ MAE \ of \ 0.2724 @ \ 5 epochs \ before \ the \ model \ starts \ to \ overfit$

Using Bidirectional RNN's (reverse order) - we got a validation MAE of 0.3493 @ 10epochs before the model starts to overfit

Adjusting the bidirectional RNN's to chronological order- we got a validation MAE of 0.2780 @ 2epochs before the model starts to overfit

Applying Bidirectional RNN (reverse order) to our test data - we got a validation MAE of 0.4363 @ 3epochs before the model starts to overfit

Double-click (or enter) to edit

Double-click (or enter) to edit

✓ 0s completed at 12:53 AM