

```
"""
```

プログラム 1 :

気象データセットをダウンロードし、展開しておく。

```
"""
```

```
import os
import urllib
import zipfile
```

```
dir_path = "/content/drive/My Drive/Python/RNN/"
os.chdir(dir_path)
```

```
if not os.path.exists('jena_climate'):
    os.mkdir('jena_climate')
os.chdir('./jena_climate')
```

```
url = 'https://s3.amazonaws.com/keras-datasets/jena_climate_2009_2016.csv.zip'
urllib.request.urlretrieve(url, "jena_climate_2009_2016.csv.zip")
```

```
f = zipfile.ZipFile('./jena_climate_2009_2016.csv.zip', 'r')
for file in f.namelist():
    f.extract(file, "./")
```

```
"""
```

プログラム 2 :

データを正規化し、

訓練、検証、テストに使用するジェネレータを準備し、  
GRUベースのモデルの訓練と評価をする

```
"""
```

```
import os
import numpy as np
import pprint
from keras.models import Sequential
from keras.layers import Dense, GRU
from keras.optimizers import RMSprop
import matplotlib.pyplot as plt
```

```

import matplotlib.pyplot as plt
from keras.callbacks import ModelCheckpoint

dir_path = "/content/drive/My Drive/Python/RNN/"
os.chdir(dir_path)

# 気象データセットのデータ調査
data_dir = '/content/drive/My Drive/Python/RNN/jena_climate'
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(',')
header = [x[1:-1] for x in header]
lines = lines[1:]

pprint.pprint(header)

# データの解析
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

print(float_data.shape)

# データの正規化
mean = float_data[:200000].mean(axis=0)
float_data -= mean
std = float_data[:200000].std(axis=0)
float_data /= std

# 時系列サンプルとそれらの目的値を生成するジェネレータ
def generator(data, lookback, delay, step, min_index, max_index,
              batch_size, shuffle=False):
    ..
    ..
    ..

```

```

if max_index is None:
    max_index = len(data) - delay
i = min_index + lookback
while 1:
    if shuffle:
        rows = np.random.randint(min_index + lookback, max_index, size=batch_size)
    else:
        if i >= 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(row - lookback, row, step)
        samples[j] = data[indices]
        targets[j] = data[row + delay][1]
    yield samples, targets

```

# 訓練、検証、テキストに使用するジェネレータの準備

```
lookback = 1440
```

```
delay = 144
```

```
step = 6
```

```
batch_size = 256
```

```

train_gen = generator(float_data,
                      lookback=lookback,
                      delay=delay,
                      step=step,
                      min_index=0,
                      max_index=200000,
                      batch_size=batch_size,
                      shuffle=True)

```

```

val_gen = generator(float_data,
                   lookback=lookback,
                   delay=delay,

```

```
        step=step,
        min_index=200000,
        max_index=300000,
        batch_size=batch_size)
```

```
test_gen = generator(float_data,
                    lookback=lookback,
                    delay=delay,
                    step=step,
                    min_index=300000,
                    max_index=None,
                    batch_size=batch_size)
```

# 全結合モデルの訓練と評価

```
train_steps = ((200000 - 0 - lookback) // batch_size) + 1
```

```
val_steps = ((300000 - 200000 - lookback) // batch_size) + 1
```

```
test_steps = ((len(float_data) - delay - 300000 - lookback) // batch_size) + 1
```

```
model = Sequential()
model.add(GRU(64, dropout=0.02, recurrent_dropout=0.02, input_shape=(None, float_data.shape[-1])))
model.add(Dense(1))
```

```
model.compile(optimizer=RMSprop(), loss='mae')
```

```
filepath = 'weights_min.hdf5'
checkpoint = ModelCheckpoint(filepath, monitor='val_loss', verbose=1,
                             save_best_only=True, mode='auto')
```

```
history = model.fit_generator(train_gen,
                             steps_per_epoch=train_steps,
                             epochs=40,
                             validation_data=val_gen,
                             validation_steps=val_steps,
                             callbacks=[checkpoint])
```

# 結果をプロットと保存

```
loss = history.history['loss']
val_loss = history.history['val_loss']

plt.plot(loss, label='Training loss')
plt.plot(val_loss, label='Validation loss')
plt.title('Training and validation loss')
plt.legend()

plt.show()

model.load_weights('weights_min.hdf5')
score = model.evaluate_generator(test_gen, steps=test_steps, verbose=1)
print("loss=", score)

model.save("RNN_model.h5")
```



Using TensorFlow backend.

```
['Date Time',  
'p (mbar)',  
'T (degC)',  
'Tpot (K)',  
'Tdew (degC)',  
'rh (%)',  
'VPmax (mbar)',  
'VPact (mbar)',  
'VPdef (mbar)',  
'sh (g/kg)',  
'H2OC (mmol/mol)',  
'rho (g/m**3)',  
'wv (m/s)',  
'max. wv (m/s)',  
'wd (deg)']
```

(420551, 14)

Epoch 1/40

776/776 [=====] - 459s 592ms/step - loss: 0.2957 - val\_loss: 0.2576

Epoch 00001: val\_loss improved from inf to 0.25756, saving model to weights\_min.hdf5

Epoch 2/40

776/776 [=====] - 465s 599ms/step - loss: 0.2716 - val\_loss: 0.2794

Epoch 00002: val\_loss did not improve from 0.25756

Epoch 3/40

776/776 [=====] - 464s 597ms/step - loss: 0.2547 - val\_loss: 0.1492

Epoch 00003: val\_loss improved from 0.25756 to 0.14920, saving model to weights\_min.hdf5

Epoch 4/40

776/776 [=====] - 458s 590ms/step - loss: 0.2394 - val\_loss: 0.1396

Epoch 00004: val\_loss improved from 0.14920 to 0.13964, saving model to weights\_min.hdf5

Epoch 5/40

776/776 [=====] - 458s 590ms/step - loss: 0.2233 - val\_loss: 0.2508

Epoch 00005: val\_loss did not improve from 0.13964

Epoch 6/40

776/776 [=====] - 455s 587ms/step - loss: 0.2093 - val\_loss: 0.1176

Epoch 00006: val\_loss improved from 0.13964 to 0.11757, saving model to weights\_min.hdf5

Epoch 7/40

Epoch 00038: val\_loss did not improve from 0.06192

Epoch 39/40

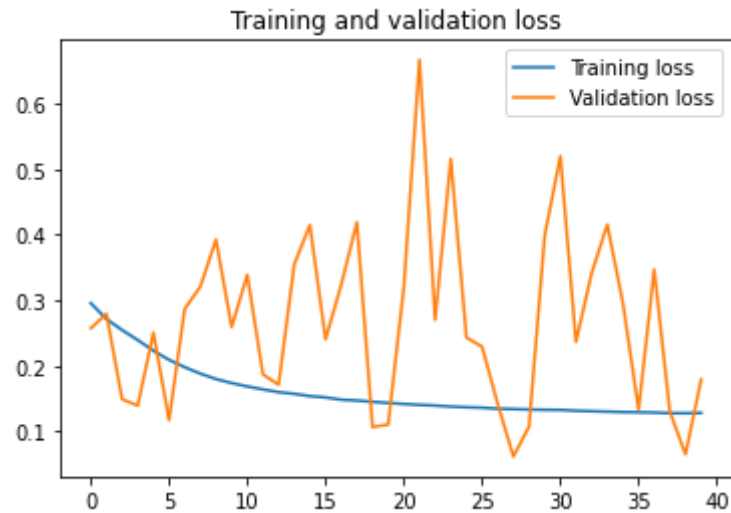
776/776 [=====] - 463s 596ms/step - loss: 0.1279 - val\_loss: 0.0654

Epoch 00039: val\_loss did not improve from 0.06192

Epoch 40/40

776/776 [=====] - 459s 591ms/step - loss: 0.1284 - val\_loss: 0.1797

Epoch 00040: val\_loss did not improve from 0.06192



465/465 [=====] - 57s 123ms/step

loss= 0.5328634977340698