Preprocessing

```
[ ] → 18 cells hidden
```

Epoch 3/3

→ model 1

model1

```
ebc1.fit(train generator,
       epochs=epochz,
       steps_per_epoch=s_p_e,
       #validation data=val generator,
       callbacks=[batch_stats_callback],
   Epoch 1/3
   265/265 [============] - 6921s 26s/step - loss: 0.4547 - acc: 0.8750
    Epoch 2/3
   Epoch 3/3
   265/265 [============= ] - 7135s 27s/step - loss: 0.2894 - acc: 0.9062
    <keras.callbacks.History at 0x7fa5ddef4c50>
ebcl.fit(train generator,
       epochs=epochz,
       steps per epoch=s p e,
       #validation data=val generator,
       callbacks=[batch stats callback],
   Epoch 1/3
   265/265 [=========== ] - 7915s 30s/step - loss: 0.1661 - acc: 0.9375
   265/265 [=============== ] - 7450s 28s/step - loss: 0.2484 - acc: 0.9375
   Epoch 3/3
   265/265 [=============] - 7092s 27s/step - loss: 0.1019 - acc: 0.9688
    <keras.callbacks.History at 0x7fa5d5704f10>
ebcl.fit(train generator,
       epochs=epochz,
       steps_per_epoch=s_p_e,
       #validation data=val generator,
       callbacks=[batch_stats_callback],
   Epoch 1/3
   265/265 [============ ] - 7240s 27s/step - loss: 0.3580 - acc: 0.8696
    Epoch 2/3
```

265/265 [============] - 7554s 29s/step - loss: 0.1655 - acc: 0.9062

```
<keras.callbacks.History at 0x7fa5d4adf850>
ebcl.fit(train generator,
       epochs=epochz,
       steps_per_epoch=s_p_e,
       #validation data=val generator,
       callbacks=[batch stats callback],
       )
   Epoch 1/3
   Epoch 2/3
   265/265 [=========== ] - 7013s 26s/step - loss: 0.2897 - acc: 0.8438
   Epoch 3/3
   265/265 [============ ] - 6962s 26s/step - loss: 0.2257 - acc: 0.8750
   <keras.callbacks.History at 0x7f44693210d0>
ebcl.fit(train generator,
       epochs=epochz,
       steps per epoch=s p e,
       #validation data=val generator,
       callbacks=[batch stats callback],
       )
   Epoch 1/3
   265/265 [============== - 7014s 26s/step - loss: 0.1598 - acc: 0.9688
```

教師モデル学習

Epoch 2/3

Epoch 3/3

<keras.callbacks.History at 0x7f4455916f10>

mark

Model: "sequential_3"

Layer (type)	Output	Shape	Param #
	======		
keras_layer (KerasLayer)	(None,	1280)	207615832
dense_3 (Dense)	(None,	4)	5124

265/265 [=============] - 7031s 27s/step - loss: 0.4163 - acc: 0.9062

265/265 [==============] - 7097s 27s/step - loss: 0.1041 - acc: 0.9688

```
Trainable params: 5,124
   Non-trainable params: 207,615,832
ebcl.fit(train generator,
      epochs=epochz,
      steps per epoch=s p e,
      validation data=val generator,
      callbacks=[checkpoint1,batch stats callback],
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   265/265 [===========] - 10209s 39s/step - loss: 0.2897 - acc: 0.8438 - val loss: 0.5249 - val acc: 0.8094
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [=========== ] - 10196s 39s/step - loss: 0.2380 - acc: 0.9375 - val loss: 0.5457 - val acc: 0.7970
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [=========== ] - 10235s 39s/step - loss: 0.1190 - acc: 1.0000 - val loss: 0.4672 - val acc: 0.8256
   <keras.callbacks.History at 0x7f444d0a2490>
ebcl.fit(train generator,
      epochs=epochz,
      steps per epoch=s p e,
      validation data=val generator,
      callbacks=[checkpoint1,batch stats callback],
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   265/265 [============= ] - 6639s 25s/step - loss: 0.6026 - acc: 0.7500 - val loss: 0.5886 - val acc: 0.7780
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [===========] - 6606s 25s/step - loss: 0.5779 - acc: 0.8125 - val loss: 0.4927 - val acc: 0.8198
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [==========] - 6664s 25s/step - loss: 0.1671 - acc: 1.0000 - val loss: 0.4859 - val acc: 0.8185
   <keras.callbacks.History at 0x7fee82d5e490>
ebcl.fit(train generator,
      epochs=epochz,
      steps per epoch=s p e,
      validation data=val generator,
      callbacks=[checkpoint1,batch stats callback],
   Epoch 1/3
```

Total params: 207,620,956

```
Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [============ ] - 6826s 26s/step - loss: 0.1740 - acc: 0.9062 - val loss: 0.4606 - val acc: 0.8240
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [==========] - 6715s 25s/step - loss: 0.1909 - acc: 0.9375 - val loss: 0.5256 - val acc: 0.8080
   <keras.callbacks.History at 0x7fedf0700710>
ebcl.fit(train generator,
      epochs=epochz,
      steps per epoch=s p e,
      validation data=val generator,
      callbacks=[checkpoint1,batch stats callback],
   Epoch 1/3
   265/265 [============] - ETA: 0s - loss: 0.4816 - acc: 0.7812
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   265/265 [============= 1 - 10370s 39s/step - loss: 0.4816 - acc: 0.7812 - val loss: 0.5300 - val acc: 0.7981
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [==========] - 10455s 39s/step - loss: 0.4023 - acc: 0.8750 - val loss: 0.5439 - val acc: 0.7948
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [=========== ] - 10709s 40s/step - loss: 0.2054 - acc: 0.9375 - val loss: 0.4732 - val acc: 0.8215
   <keras.callbacks.History at 0x7f57df077650>
ebcl.fit(train generator,
      epochs=epochz,
      steps per epoch=s p e,
      validation data=val generator,
      callbacks=[checkpoint1,batch stats callback],
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   265/265 [=========== ] - 10552s 40s/step - loss: 0.1071 - acc: 1.0000 - val loss: 0.4821 - val acc: 0.8209
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [=========== ] - 10481s 40s/step - loss: 0.2996 - acc: 0.9062 - val loss: 0.4500 - val acc: 0.8306
   Epoch 3/3
   265/265 [============] - ETA: 0s - loss: 0.2123 - acc: 0.9688
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [===========] - 10611s 40s/step - loss: 0.2123 - acc: 0.9688 - val loss: 0.4666 - val acc: 0.8262
```

mark

<keras.callbacks.History at 0x7f57d13aead0>

```
ebc1=Sequential([feature extractor layer,
                     layers.Dense(train generator.num classes,activation='softmax')])
ebc1.summary()
ebcl.compile(optimizer=tf.keras.optimizers.Adam(),
           loss='categorical_crossentropy',
           metrics=['acc'])
   Model: "sequential 4"
    Layer (type)
                          Output Shape
                                               Param #
   _____
                                               207615832
    keras layer (KerasLayer)
                          (None, 1280)
                                               5124
    dense 4 (Dense)
                          (None, 4)
   _____
   Total params: 207,620,956
   Trainable params: 5,124
   Non-trainable params: 207,615,832
```

```
Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [============ ] - 14036s 53s/step - loss: 0.0784 - acc: 0.9688 - val loss: 0.2820 - val acc: 0.8998
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [============] - 14110s 53s/step - loss: 0.1907 - acc: 0.9375 - val_loss: 0.2877 - val_acc: 0.8990
history=ebc1.fit(train generator,
            epochs=epochz,
            steps per epoch=s p e,
            validation data=gizi data,
            callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   265/265 [=========== ] - 17471s 66s/step - loss: 0.4968 - acc: 0.8438 - val_loss: 0.3886 - val_acc: 0.8619
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [============= 1 - 17397s 66s/step - loss: 0.1510 - acc: 0.9375 - val loss: 0.3450 - val acc: 0.8784
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [==========] - 17950s 68s/step - loss: 0.3350 - acc: 0.8438 - val loss: 0.3149 - val acc: 0.8881
history=ebc1.fit(train generator,
            epochs=epochz,
            steps per epoch=s p e,
            validation data=gizi data,
            callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   265/265 [============] - ETA: 0s - loss: 0.7040 - acc: 0.6562
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   265/265 [===========] - 17895s 67s/step - loss: 0.7040 - acc: 0.6562 - val_loss: 0.4171 - val_acc: 0.8446
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [=========== ] - 17959s 68s/step - loss: 0.5065 - acc: 0.8750 - val loss: 0.3282 - val acc: 0.8817
   Epoch 3/3
   history=ebc1.fit(train generator,
            epochs=epochz,
            steps per epoch=s p e,
            validation data=gizi data,
            callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
```

265/265 [===========] - 13634s 51s/step - loss: 0.4689 - acc: 0.8125 - val_loss: 0.3824 - val_acc: 0.8625

```
Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   Epoch 3/3
   #疑似ラベルの予測
gizi label1=ebc1.predict(gizi data)
   379/379 [=========== ] - 7531s 20s/step
mark
feature extractor layer.trainable=False
#入力画像ノイズ(rand augmentation)の設定
data augmentation=Sequential([layers.RandomRotation(2.10)])
#モデルノイズ (stochastic depth) の設定
stochastic Depth=Sequential([tfa.layers.StochasticDepth(0.35)])
#モデルにrand augmentationを適用
model1=Sequential([data augmentation])
#モデルにstochastic depthを適用
model1=Sequential([stochastic Depth])
#モデルノイズ (dropout) の設定と適用
model1=Sequential([feature extractor layer,
                  layers.Dense(train generator.num classes,activation='softmax'),
                  #layers.Dropout(0.2)
            ])
```

mark

Model: "sequential 9"

Layer (type)	Output	Shape	Param #
keras_layer (KerasLayer)	(None,	1280)	207615832
dense_5 (Dense)	(None,	4)	5124
Total params: 207,620,956 Trainable params: 5,124 Non-trainable params: 207,61	====== 5,832		

```
#model1
history=model1.fit(gizi data,
           epochs=epochz,
           steps per epoch=np.ceil(gizi data.samples/batch size),
           validation data=val generator,
           callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   379/379 [=========== ] - 8853s 23s/step - loss: 0.2881 - acc: 0.9062 - val loss: 0.3884 - val acc: 0.8656
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   379/379 [=========== ] - 8914s 24s/step - loss: 0.2952 - acc: 0.8750 - val loss: 0.3308 - val acc: 0.8771
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   history=model1.fit(gizi data,
           epochs=epochz,
           steps per epoch=np.ceil(gizi data.samples/batch size),
           validation data=val generator,
           callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   379/379 [==========] - 11872s 31s/step - loss: 0.4209 - acc: 0.8438 - val loss: 0.4004 - val acc: 0.8512
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   379/379 [===========] - 11836s 31s/step - loss: 0.2977 - acc: 0.9062 - val_loss: 0.3136 - val_acc: 0.8840
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   history=model1.fit(gizi data,
           epochs=epochz,
           steps per epoch=np.ceil(gizi data.samples/batch size),
           validation data=val generator,
           callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   379/379 [==========] - 13618s 36s/step - loss: 0.2713 - acc: 0.9062 - val loss: 0.4174 - val acc: 0.8526
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   379/379 [===========] - 13586s 36s/step - loss: 0.1294 - acc: 1.0000 - val_loss: 0.3399 - val_acc: 0.8752
```

Epoch 3/3

```
Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   379/379 [=========== ] - 13776s 36s/step - loss: 0.2835 - acc: 0.9062 - val_loss: 0.2847 - val_acc: 0.8967
history=model1.fit(gizi data,
            epochs=epochz,
            steps per epoch=np.ceil(gizi data.samples/batch size),
            validation data=val generator,
            callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   379/379 [==========] - 13107s 34s/step - loss: 0.2840 - acc: 0.9062 - val loss: 0.3823 - val acc: 0.8634
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   379/379 [=========== ] - 13223s 35s/step - loss: 0.1438 - acc: 0.9688 - val_loss: 0.3278 - val_acc: 0.8785
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   379/379 [==========] - 13253s 35s/step - loss: 0.2193 - acc: 0.9375 - val loss: 0.3272 - val acc: 0.8788
history=model1.fit(gizi data,
            epochs=epochz,
            steps per epoch=np.ceil(gizi data.samples/batch size),
            validation data=val generator,
            callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   379/379 [===========] - 11820s 31s/step - loss: 0.3353 - acc: 0.8750 - val loss: 0.4554 - val acc: 0.8204
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   379/379 [==========] - 11922s 31s/step - loss: 0.3131 - acc: 0.9375 - val loss: 0.3254 - val acc: 0.8821
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   379/379 [=========== ] - 11771s 31s/step - loss: 0.4790 - acc: 0.9062 - val loss: 0.3037 - val acc: 0.8895
1
history=model1.fit(train generator,
             epochs=epochz,
             steps per epoch=s p e,
             validation data=val generator,
             callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
```

```
265/265 [=========== ] - 10556s 40s/step - loss: 0.3432 - acc: 0.8438 - val loss: 0.5175 - val acc: 0.8069
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   265/265 [=========== ] - 10392s 39s/step - loss: 0.3482 - acc: 0.8125 - val loss: 0.5115 - val acc: 0.8069
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   265/265 [============] - 10318s 39s/step - loss: 0.2299 - acc: 0.9062 - val_loss: 0.4722 - val_acc: 0.8187
history=model1.fit(train generator,
            epochs=epochz,
            steps per epoch=s p e,
            validation data=val generator,
            callbacks=[checkpoint1,batch stats callback]
   Epoch 1/3
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   263/263 [===========] - 6985s 27s/step - loss: 0.2462 - acc: 0.8750 - val loss: 0.4538 - val acc: 0.8292
history=model1.fit(train generator,
            epochs=epochz,
            steps per epoch=s p e,
            validation data=val generator,
            callbacks=[checkpoint1,batch stats callback]
   Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
   263/263 [===========] - 9131s 35s/step - loss: 0.6212 - acc: 0.7500 - val loss: 0.5230 - val acc: 0.8067
   Epoch 2/3
   Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
   263/263 [============= ] - 9154s 35s/step - loss: 0.3511 - acc: 0.8125 - val loss: 0.5031 - val acc: 0.8161
   Epoch 3/3
   Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
   263/263 [============ ] - 9292s 35s/step - loss: 0.2121 - acc: 0.9062 - val_loss: 0.4716 - val_acc: 0.8197
history=model1.fit(train generator,
            epochs=epochz,
            steps per epoch=s p e,
            validation data=val generator,
            callbacks=[checkpoint1,batch stats callback]
```

```
Epoch 1/3
       263/263 [============] - ETA: 0s - loss: 0.4961 - acc: 0.8125
       Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
       263/263 [===========] - 10169s 39s/step - loss: 0.4961 - acc: 0.8125 - val_loss: 0.5128 - val_acc: 0.8008
       Epoch 2/3
       Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
       263/263 [=========== ] - 10244s 39s/step - loss: 0.1695 - acc: 0.9375 - val loss: 0.5022 - val acc: 0.8144
       Epoch 3/3
       Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
       263/263 [============ ] - 10246s 39s/step - loss: 0.1772 - acc: 0.9688 - val loss: 0.4740 - val acc: 0.8239
history=model1.fit(train generator,
                              epochs=epochz,
                              steps per epoch=s p e,
                              validation data=val generator,
                              callbacks=[checkpoint1,batch stats callback]
       Epoch 1/3
       Epoch 1: saving model to /content/drive/MyDrive/result11/model01-01.h5
       263/263 [===========] - 10270s 39s/step - loss: 0.3926 - acc: 0.7812 - val loss: 0.5872 - val acc: 0.7833
       Epoch 2/3
       Epoch 2: saving model to /content/drive/MyDrive/result11/model01-02.h5
       263/263 [============] - 10242s 39s/step - loss: 0.3009 - acc: 0.8750 - val loss: 0.4631 - val acc: 0.8289
       Epoch 3/3
       Epoch 3: saving model to /content/drive/MyDrive/result11/model01-03.h5
       263/263 [============] - 10304s 39s/step - loss: 0.3336 - acc: 0.8438 - val loss: 0.4634 - val acc: 0.8264
# HDF5フォーマットでモデルを保存するために必要
!pip install -q pyyaml h5py
model1.save('/content/drive/MyDrive/result11/model1.h5/')
 - WARNING: absl: Found untraced function such as restored function body, resto
```

→ model 2

[] → 38 cells hidden

model 3

[] → 38 cells hidden

VotingClassifier

[] → 11 cells hidden

✓ 1m 12s completed at 11:19 PM

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