main_SRCNN

March 27, 2019

0.0.1 Super-Resolution Convolutional Neural Network

```
In [9]: import os
    import cv2
    import h5py
    import math
    import numpy
    import matplotlib.pyplot as plt
    import tensorflow as tf
    import time
    %run "../lib/SRCNN/main_SRCNN_prepare_data.py" #import functions for prepare data
    %run "../lib/SRCNN/main_SRCNN_train_predict.py" #import train and predict model
```

0.0.2 Feature and Label Construction

Please make sure you have the following directories with trianing LR HR images and testing LR HR images along with our entire folder!

```
In [13]: #Set train data directories
         train_LR_dir = "../data/train_set/LR/"
         train_HR_dir = "../data/train_set/HR/"
         LR_dir_name = os.listdir(train_LR_dir)
         HR_dir_name = os.listdir(train_HR_dir)
         #Set test data directories
         test lr dir = "../data/test set/LR/"
         test_super_dir = "../data/test_set/SR-I/"
         test_hr_dir = "../data/test_set/HR/"
         test_lr_name = os.listdir(test_lr_dir)
         n_test_files = len(test_lr_name)
         #weight path
         weight_path = "../lib/SRCNN/YCrCb_entire_weight.h5"
         #initial values
         n_files = len(LR_dir_name)
         Random_Crop =30 #number of sample patches
         Patch_size = 33
         learn_rate = 0.0003
```

```
In [11]: #RGB_feature, RGB_label, RGB_feature_time= feature_RGB(n_files,Random_Crop,Patch_si
In [5]: YCrCb feature , YCrCb label , YCrCb feature time = feature_YCrCb(n_files,Random_Crop,Pe
In [6]: YCrCb_feature.shape
Out[6]: (45000, 33, 33, 3)
In [7]: YCrCb_label.shape
Out[7]: (45000, 33, 33, 3)
In [129]: #Y_feature , Y_label , Y_feature_time = feature_Y_color(n_files,Random_Crop,Patch_si
In []: #Save train feature h5py file
       #write_h5py(RGB_feature,RGB_label,"../lib/RGB_feature.h5")
       #write_h5py(YCrCb_feature, YCrCb_label, ".../lib/YCrCb_feature.h5")
       #write_h5py(Y_feature,Y_label,"../lib/Y_feature.h5")
0.0.3 Train Images on three color channel with validation split
In [ ]: #RGB feature, RGB label = read training data("../lib/RGB feature.h5")
       #YCrCb_feature, YCrCb_label = read_training_data("../lib/YCrCb_feature.h5")
       #Y_feature,Y_label = read_training_data("../lib/Y_feature.h5")
Training RGB channel
In [156]: \#RGB \mod el = train \mod el (n1=64, n2=32, n3=3, k1=9, k2=1, k3=5, Patch size=Patch size, lear
In [157]: #print(RGB_model.summary())
Layer (type)
                         Output Shape
                                                 Param #
______
                          (None, 33, 33, 64)
conv2d_45 (Conv2D)
                                                  15616
conv2d 46 (Conv2D)
                          (None, 33, 33, 32)
                                                  2080
conv2d 47 (Conv2D)
                          (None, 33, 33, 3)
                                                   2403
______
Total params: 20,099
Trainable params: 20,099
Non-trainable params: 0
None
```

In [158]: #RGB_train, RGB_train_time = training(RGB_feature, RGB_label, RGB_model, batch=128, epoch

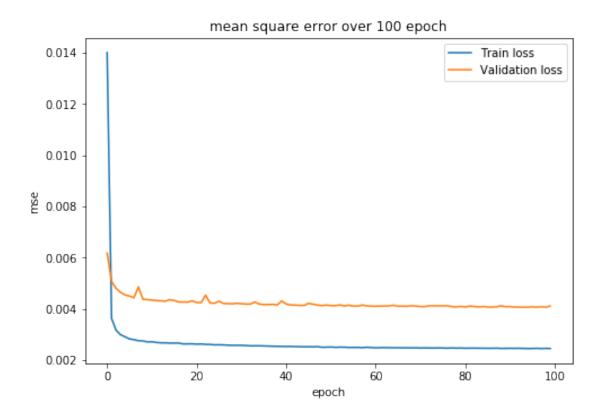
```
Train on 36000 samples, validate on 9000 samples
Epoch 1/100
Epoch 2/100
Epoch 3/100
36000/36000 [=============== ] - 5s 150us/step - loss: 0.0032 - val loss: 0.0048
Epoch 4/100
Epoch 5/100
36000/36000 [=============== ] - 5s 148us/step - loss: 0.0029 - val loss: 0.0045
Epoch 6/100
36000/36000 [=============== ] - 5s 150us/step - loss: 0.0028 - val loss: 0.0045
Epoch 7/100
36000/36000 [=============== ] - 5s 149us/step - loss: 0.0028 - val loss: 0.0044
Epoch 8/100
Epoch 9/100
Epoch 10/100
Epoch 11/100
Epoch 12/100
Epoch 13/100
36000/36000 [=============== ] - 5s 149us/step - loss: 0.0027 - val loss: 0.0043
Epoch 14/100
Epoch 15/100
Epoch 16/100
36000/36000 [=============== ] - 5s 149us/step - loss: 0.0027 - val loss: 0.0043
Epoch 17/100
36000/36000 [=============== ] - 5s 149us/step - loss: 0.0027 - val loss: 0.0043
Epoch 18/100
Epoch 19/100
Epoch 20/100
Epoch 21/100
Epoch 22/100
Epoch 23/100
36000/36000 [=================== ] - 5s 148us/step - loss: 0.0026 - val_loss: 0.0045
Epoch 24/100
```

```
Epoch 25/100
36000/36000 [=============== ] - 5s 145us/step - loss: 0.0026 - val loss: 0.0042
Epoch 26/100
Epoch 27/100
Epoch 28/100
Epoch 29/100
36000/36000 [=============== ] - 5s 145us/step - loss: 0.0026 - val loss: 0.0042
Epoch 30/100
Epoch 31/100
Epoch 32/100
Epoch 33/100
Epoch 34/100
Epoch 35/100
Epoch 36/100
Epoch 37/100
36000/36000 [=============== ] - 5s 148us/step - loss: 0.0025 - val loss: 0.0042
Epoch 38/100
Epoch 39/100
Epoch 40/100
36000/36000 [=============== ] - 5s 147us/step - loss: 0.0025 - val loss: 0.0043
Epoch 41/100
36000/36000 [============== ] - 5s 146us/step - loss: 0.0025 - val loss: 0.0042
Epoch 42/100
Epoch 43/100
Epoch 44/100
Epoch 45/100
Epoch 46/100
Epoch 47/100
Epoch 48/100
```

```
Epoch 49/100
36000/36000 [=============== ] - 5s 147us/step - loss: 0.0025 - val loss: 0.0041
Epoch 50/100
Epoch 51/100
Epoch 52/100
Epoch 53/100
36000/36000 [=============== ] - 5s 148us/step - loss: 0.0025 - val loss: 0.0042
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
Epoch 63/100
Epoch 64/100
Epoch 65/100
36000/36000 [=============== ] - 5s 146us/step - loss: 0.0025 - val loss: 0.0041
Epoch 66/100
Epoch 67/100
Epoch 68/100
Epoch 69/100
Epoch 70/100
Epoch 71/100
36000/36000 [=================== ] - 5s 147us/step - loss: 0.0025 - val_loss: 0.0041
Epoch 72/100
```

```
Epoch 73/100
36000/36000 [=============== ] - 5s 151us/step - loss: 0.0025 - val loss: 0.0041
Epoch 74/100
Epoch 75/100
Epoch 76/100
Epoch 77/100
Epoch 78/100
Epoch 79/100
Epoch 80/100
Epoch 81/100
Epoch 82/100
Epoch 83/100
Epoch 84/100
Epoch 85/100
Epoch 86/100
Epoch 87/100
Epoch 88/100
Epoch 89/100
36000/36000 [============== ] - 6s 157us/step - loss: 0.0025 - val loss: 0.0041
Epoch 90/100
Epoch 91/100
Epoch 92/100
Epoch 93/100
Epoch 94/100
Epoch 95/100
Epoch 96/100
```

In [268]: #show_error(RGB_train,valid=True)



In [206]: #show_psnr(RGB_train,valid=True)

Training mse: 0.0024530321784938377 psnr : 26.102967547489143 Validation mse: 0.004112832445444332 psnr : 23.85858983051289

Training YCrCb channel

In [162]: #print(YCrCb_model.summary())

Epoch 14/100

Layer (type)	Output Shape	Param #
conv2d_48 (Conv2D)	(None, 33, 33, 64)	15616
conv2d_49 (Conv2D)	(None, 33, 33, 32)	2080
conv2d_50 (Conv2D)	(None, 33, 33, 3)	2403
Total params: 20,099 Trainable params: 20,099 Non-trainable params: 0		
None		

In [163]: #YCrCb_train , YCrCb_train_time = training(YCrCb_feature, YCrCb_label, YCrCb_model, bat

```
Train on 36000 samples, validate on 9000 samples
Epoch 1/100
Epoch 2/100
Epoch 3/100
Epoch 4/100
36000/36000 [=================== ] - 5s 144us/step - loss: 0.0012 - val_loss: 0.0018
Epoch 5/100
Epoch 6/100
Epoch 7/100
Epoch 8/100
Epoch 9/100
Epoch 10/100
Epoch 11/100
Epoch 12/100
Epoch 13/100
```

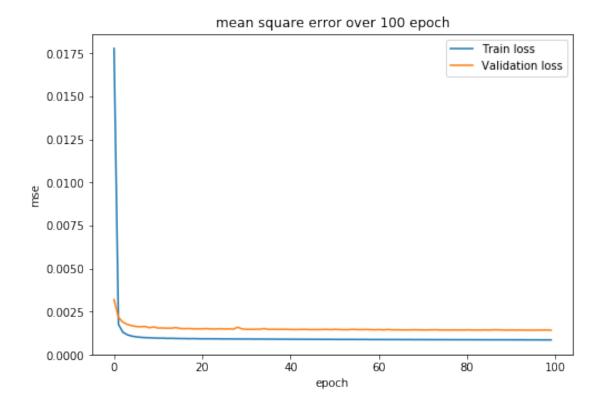
```
Epoch 15/100
Epoch 16/100
Epoch 17/100
Epoch 18/100
Epoch 19/100
Epoch 20/100
Epoch 21/100
Epoch 22/100
Epoch 23/100
Epoch 24/100
Epoch 25/100
Epoch 26/100
Epoch 27/100
Epoch 28/100
Epoch 29/100
Epoch 30/100
Epoch 31/100
Epoch 32/100
Epoch 33/100
Epoch 34/100
Epoch 35/100
Epoch 36/100
Epoch 37/100
Epoch 38/100
```

```
Epoch 39/100
Epoch 40/100
Epoch 41/100
Epoch 42/100
Epoch 43/100
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
```

```
Epoch 63/100
Epoch 64/100
Epoch 65/100
Epoch 66/100
Epoch 67/100
Epoch 68/100
Epoch 69/100
Epoch 70/100
Epoch 71/100
Epoch 72/100
Epoch 73/100
Epoch 74/100
Epoch 75/100
Epoch 76/100
Epoch 77/100
Epoch 78/100
Epoch 79/100
Epoch 80/100
Epoch 81/100
Epoch 82/100
Epoch 83/100
Epoch 84/100
Epoch 85/100
Epoch 86/100
```

```
Epoch 87/100
Epoch 88/100
Epoch 89/100
Epoch 90/100
Epoch 91/100
Epoch 92/100
Epoch 93/100
Epoch 94/100
Epoch 95/100
Epoch 96/100
Epoch 97/100
Epoch 98/100
Epoch 99/100
Epoch 100/100
```

In [269]: #show_error(YCrCb_train,valid=True)



In [207]: #show_psnr(YCrCb_train,valid=True)

Training mse: 0.0008714968221676018 psnr: 30.597341921656817 Validation mse: 0.0014337077744615574 psnr: 28.43539359736457

Training only Y color channel

 $\label{eq:in_model} \textbf{In [166]: } \#Y_model = train_model(n1=64,n2=32,n3=1,k1=9,k2=1,k3=5,\ Patch_size=Patch_size,learn_size)$

In [133]: #print(Y_model.summary())

Layer (type)	Output Shape	Param #
conv2d_42 (Conv2D)	(None, 33, 33, 64)	5248
conv2d_43 (Conv2D)	(None, 33, 33, 32)	2080
conv2d_44 (Conv2D)	(None, 33, 33, 1)	801

Total params: 8,129
Trainable params: 8,129

None

In [167]: #Y_train , Y_train_time = training(Y_feature, Y_label, Y_model, batch=128, epoch=100)

```
Train on 36000 samples, validate on 9000 samples
Epoch 1/100
Epoch 2/100
Epoch 3/100
Epoch 4/100
Epoch 5/100
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
Epoch 17/100
Epoch 18/100
Epoch 19/100
Epoch 20/100
```

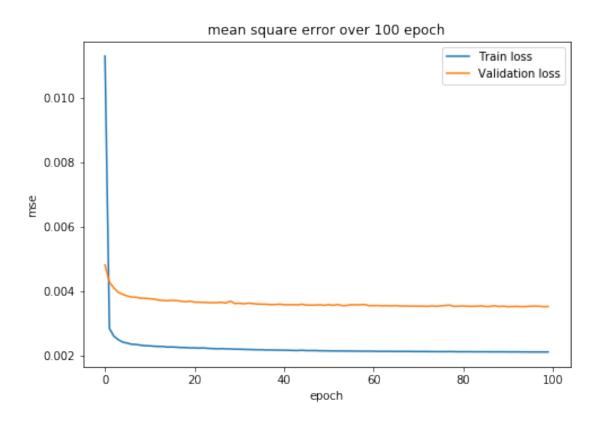
```
Epoch 21/100
Epoch 22/100
Epoch 23/100
Epoch 24/100
Epoch 25/100
Epoch 26/100
Epoch 27/100
Epoch 28/100
Epoch 29/100
Epoch 30/100
Epoch 31/100
Epoch 32/100
Epoch 33/100
Epoch 34/100
Epoch 35/100
Epoch 36/100
Epoch 37/100
Epoch 38/100
Epoch 39/100
Epoch 40/100
Epoch 41/100
Epoch 42/100
Epoch 43/100
Epoch 44/100
```

```
Epoch 45/100
Epoch 46/100
Epoch 47/100
Epoch 48/100
36000/36000 [=================== ] - 4s 103us/step - loss: 0.0021 - val_loss: 0.0036
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
Epoch 63/100
Epoch 64/100
Epoch 65/100
Epoch 66/100
Epoch 67/100
36000/36000 [=============== ] - 4s 102us/step - loss: 0.0021 - val loss: 0.0035
Epoch 68/100
36000/36000 [=============== ] - 4s 102us/step - loss: 0.0021 - val loss: 0.0035
```

```
Epoch 69/100
Epoch 70/100
Epoch 71/100
Epoch 72/100
Epoch 73/100
Epoch 74/100
Epoch 75/100
Epoch 76/100
Epoch 77/100
Epoch 78/100
Epoch 79/100
Epoch 80/100
Epoch 81/100
Epoch 82/100
Epoch 83/100
Epoch 84/100
Epoch 85/100
Epoch 86/100
Epoch 87/100
Epoch 88/100
Epoch 89/100
Epoch 90/100
Epoch 91/100
Epoch 92/100
```

```
Epoch 93/100
Epoch 94/100
Epoch 95/100
       ========= ] - 4s 102us/step - loss: 0.0021 - val_loss: 0.0035
36000/36000 [==
Epoch 96/100
Epoch 97/100
36000/36000 [==
         ========] - 4s 102us/step - loss: 0.0021 - val_loss: 0.0035
Epoch 98/100
Epoch 99/100
Epoch 100/100
```

In [270]: #show_error(Y_train,valid=True)



In [204]: #show_psnr(Y_train,valid=True)

Training mse: 0.0021034414246678354 psnr : 26.770695774419625 Validation mse: 0.003515105029154155 psnr : 24.540616940010196

0.0.4 Train images on YCrCb color channel with entire training set

```
In [170]: YCrCb_model_entire = train_model(n1=64,n2=32,n3=3,k1=9,k2=1,k3=5, Patch_size=Patch_s
In [172]: train_start_time = time.time()
    YCrCb_train_entire = YCrCb_model_entire.fit(YCrCb_feature,YCrCb_label,batch_size=128
    train_entire_time = time.time() - train_start_time
Epoch 1/100
Epoch 2/100
45000/45000 [============== ] - 6s 130us/step - loss: 0.0016
Epoch 3/100
45000/45000 [============== ] - 6s 129us/step - loss: 0.0013
Epoch 4/100
Epoch 5/100
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
45000/45000 [============== ] - 6s 129us/step - loss: 0.0011
Epoch 16/100
45000/45000 [============== ] - 6s 130us/step - loss: 0.0011
Epoch 17/100
45000/45000 [============== ] - 6s 131us/step - loss: 0.0011
Epoch 18/100
45000/45000 [============== ] - 6s 132us/step - loss: 0.0010
```

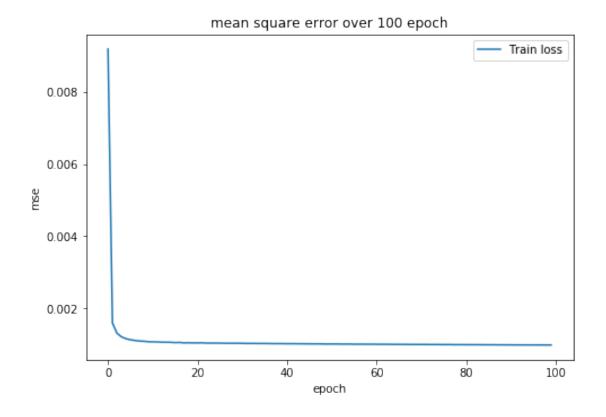
Epoch 19/100							
	[======]	_	6s	133us/step	_	loss:	0.0010
Epoch 20/100				1			
	[======]	_	6s	131us/step	_	loss:	0.0010
Epoch 21/100							
	[======]	_	6s	128us/step	_	loss:	0.0010
Epoch 22/100				•			
45000/45000	[======]	-	6s	130us/step	_	loss:	0.0010
Epoch 23/100							
45000/45000	[======]	-	6s	131us/step	-	loss:	0.0010
Epoch 24/100							
45000/45000	[======]	-	6s	128us/step	-	loss:	0.0010
Epoch 25/100							
	[=====]	-	6s	130us/step	-	loss:	0.0010
Epoch 26/100							
	[=====]	-	6s	128us/step	-	loss:	0.0010
Epoch 27/100							
	[=====]	-	6s	127us/step	-	loss:	0.0010
Epoch 28/100							
	[=====]	-	6s	126us/step	-	loss:	0.0010
Epoch 29/100							
	[=====]	-	6s	127us/step	-	loss:	0.0010
Epoch 30/100			_			_	
	[=====]	-	6s	127us/step	-	loss:	0.0010
Epoch 31/100			_			_	
	[======]	-	6s	126us/step	_	loss:	0.0010
Epoch 32/100			•	107 / .		-	0 0010
	[=======]	_	68	12/us/step	_	loss:	0.0010
Epoch 33/100			C	100/		7	0 0010
	[=======]	_	ิงร	12ous/step	_	loss:	0.0010
Epoch 34/100	[======]	_	60	197ug /gton		1000.	0 0010
Epoch 35/100			US	12/us/scep		TOSS.	0.0010
-	[======]	_	60	197ug/gton	_	loggi	0 0010
Epoch 36/100			05	12/us/scep		TOSS.	0.0010
	[======]	_	69	197119/sten	_	1088.	0 0010
Epoch 37/100			OB	12/ db/ b0cp		TOBB.	0.0010
	[======]	_	6s	127us/sten	_	loss:	0.0010
Epoch 38/100				12. dz, z c p			0.0020
-	[=====]	_	6s	127us/step	_	loss:	0.0010
Epoch 39/100							
_	[======]	_	6s	127us/step	_	loss:	0.0010
Epoch 40/100							
	[======]	_	6s	127us/step	_	loss:	0.0010
Epoch 41/100				1			
-	[======]	_	6s	126us/step	_	loss:	0.0010
Epoch 42/100				•			
	[======]	-	6s	127us/step	-	loss:	0.0010

Epoch 43/100						
-	[======]	_	6s	127us/step - lo	ss:	0.0010
Epoch 44/100						
	[======]	_	6s	126us/step - lo	ss:	0.0010
Epoch 45/100						
	[======]	_	6s	127us/step - lo	ss:	0.0010
Epoch 46/100				•		
45000/45000	[=======]	-	6s	127us/step - lo	ss:	0.0010
Epoch 47/100						
45000/45000	[======]	-	6s	127us/step - lo	ss:	0.0010
Epoch 48/100						
45000/45000	[======]	-	6s	126us/step - lo	ss:	0.0010
Epoch 49/100						
45000/45000	[======]	-	6s	127us/step - lo	ss:	0.0010
Epoch 50/100						
45000/45000	[======]	-	6s	131us/step - lo	ss:	0.0010
Epoch 51/100						
	[======]	-	6s	128us/step - lo	ss:	0.0010
Epoch 52/100						
45000/45000	[======]	-	6s	130us/step - lo	ss:	0.0010
Epoch 53/100						
	[======]	-	6s	131us/step - lo	ss:	0.0010
Epoch 54/100						
45000/45000	[======]	-	6s	131us/step - lo	ss:	0.0010
Epoch 55/100						
	[======]	-	6s	129us/step - lo	ss:	0.0010
Epoch 56/100						
	[=====]	-	6s	130us/step - lo	ss:	0.0010
Epoch 57/100						
	[=====]	-	6s	129us/step - lo	ss:	0.0010
Epoch 58/100						
	[]	-	6s	128us/step - lo	ss:	0.0010
Epoch 59/100						
	[======]	-	6s	128us/step - lo	ss:	0.0010
Epoch 60/100			_			
	[=====]	-	6s	129us/step - lo	ss:	0.0010
Epoch 61/100			_	100 /		
	[======]	-	68	130us/step - Io	ss:	0.0010
Epoch 62/100			•	100 / 1		0 0010
	[======]	-	68	129us/step - lo	ss:	0.0010
Epoch 63/100			_	100 /		
	[======]	-	6s	130us/step - lo	ss:	0.0010
Epoch 64/100			_	100 /		
	[======]	-	68	129us/step - lo	ss:	0.0010
Epoch 65/100			C	100/		0 0040
	[=====]	-	ธร	129us/step - lo	ss:	0.0010
Epoch 66/100			C	100/		0 0010
45000/45000	[======]	-	ซธ	129us/step - lo	ss:	0.0010

```
Epoch 67/100
45000/45000 [============== ] - 6s 128us/step - loss: 0.0010
Epoch 68/100
Epoch 69/100
Epoch 70/100
Epoch 71/100
Epoch 72/100
Epoch 73/100
Epoch 74/100
Epoch 75/100
Epoch 76/100
Epoch 77/100
Epoch 78/100
Epoch 79/100
Epoch 80/100
Epoch 81/100
Epoch 82/100
Epoch 83/100
Epoch 84/100
45000/45000 [============== ] - 6s 128us/step - loss: 9.9282e-04
Epoch 85/100
Epoch 86/100
Epoch 87/100
Epoch 88/100
45000/45000 [============== ] - 6s 128us/step - loss: 9.8934e-04
Epoch 89/100
Epoch 90/100
```

```
Epoch 91/100
45000/45000 [============== ] - 6s 128us/step - loss: 9.8727e-04
Epoch 92/100
Epoch 93/100
Epoch 94/100
Epoch 95/100
Epoch 96/100
Epoch 97/100
45000/45000 [=============== ] - 6s 129us/step - loss: 9.8459e-04
Epoch 98/100
Epoch 99/100
Epoch 100/100
========= ] - 6s 130us/step - loss: 9.8564e-04
```

In [271]: show_error(YCrCb_train_entire,valid=False)



```
In [203]: show_psnr(YCrCb_train_entire,valid=False)
Training mse: 0.000985644418704841 psnr: 30.06279732976197
In [218]: #Save weights
          #save_weight(RGB_model,"../lib/RGB_weight.h5")
          #save_weight(YCrCb_model,"../lib/YCrCb_weight.h5")
          #save_weight(Y_model,"../lib/Y_weight.h5")
          save_weight(YCrCb_model_entire, weight_path)
0.0.5 Predict Images
In [9]: #Load model and weights
        SRCNN_pred= predict_model(n1=64,n2=32,n3=3,k1=9,k2=1,k3=5,learn_rate=learn_rate,channe
        SRCNN_pred.load_weights(weight_path)
In [10]: predict_time = predicting(SRCNN_pred,n_test_files,test_lr_dir,test_hr_dir,test_lr_nam.
0.0.6 Summarize Running Time
In [11]: print('Feature and label construction time : {} sec'.format(YCrCb_feature_time))
Feature and label construction time: 25.709649562835693 sec
In [244]: #Training time recorded by using gpu-gtx1070
          print('Training time : {} sec'.format(YCrCb_train_time))
Training time: 528.7112383842468 sec
In [ ]: print('writing SR images time : {} sec'.format(predict_time))
In [13]: PSNR = []
         for i in range(n_test_files):
             SR = cv2.imread(os.path.join(test_super_dir,test_lr_name[i]))
             HR = cv2.imread(os.path.join(test_hr_dir,test_lr_name[i]))
             PSNR.append(get_psnr(HR,SR))
In [ ]: print('Testing data average psnr: {} '.format(numpy.mean(PSNR)))
0.0.7 References
https://github.com/MarkPrecursor/SRCNN-keras
  https://github.com/tegg89/SRCNN-Tensorflow
   Dong, C., Loy, C. C., He, K., & Tang, X. (2016). Image super-resolution using deep convo-
lutional networks. IEEE transactions on pattern analysis and machine intelligence, 38(2), 295-
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