

Network 종류 변경하여 비교해보기

2021. 07. 29

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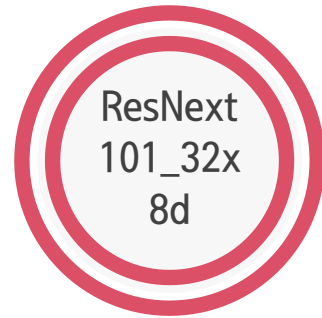
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1 Network 종류와 기본 설정

- Network 종류
- 기본 설정

1 Network 종류와 기본 설정 - Network 종류





1 Network 종류와 기본 설정

- Network 종류
- 기본 설정

1 Network 종류와 기본 설정 - 기본 설정

● 설정

- Batch_size = 1, Epoch = 300으로 고정.
- Epoch를 늘리고 싶었으나, 시간이 너무 오래 걸려 하지 못함.
- resnet 50과 resnet34의 경우, 총 65개의 이미지를 학습시킴. 그러나 시간이 너무 오래 걸려 그 외 나머지는 총 20개의 이미지만 학습시킴.

● 실행할 수 없는 Network

- 다음의 경우, 코드가 실행되지 않았다. 메모리 문제인 것 같다.
- Resnet152
- ResNext101_32x8d
- DenseNet 169, DenseNet 161, DenseNet 201

1 Network 종류와 기본 설정 - 기본 설정

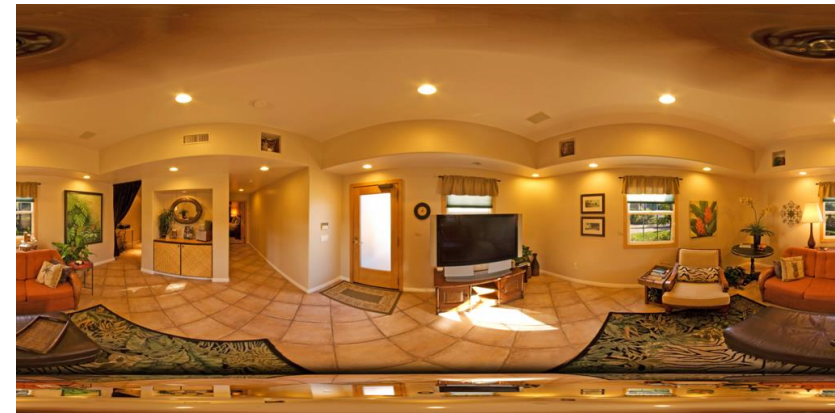
● 입력 이미지



Pano_01.png



Pano_07.png



Pano_13.png



Pano_15.png



Pano_18.png



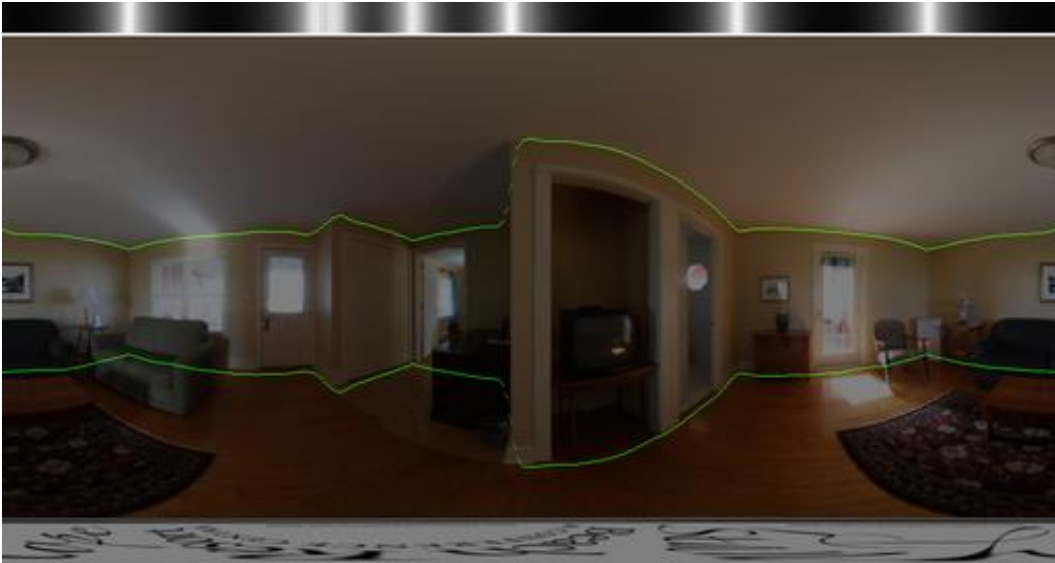



Pano_20.png



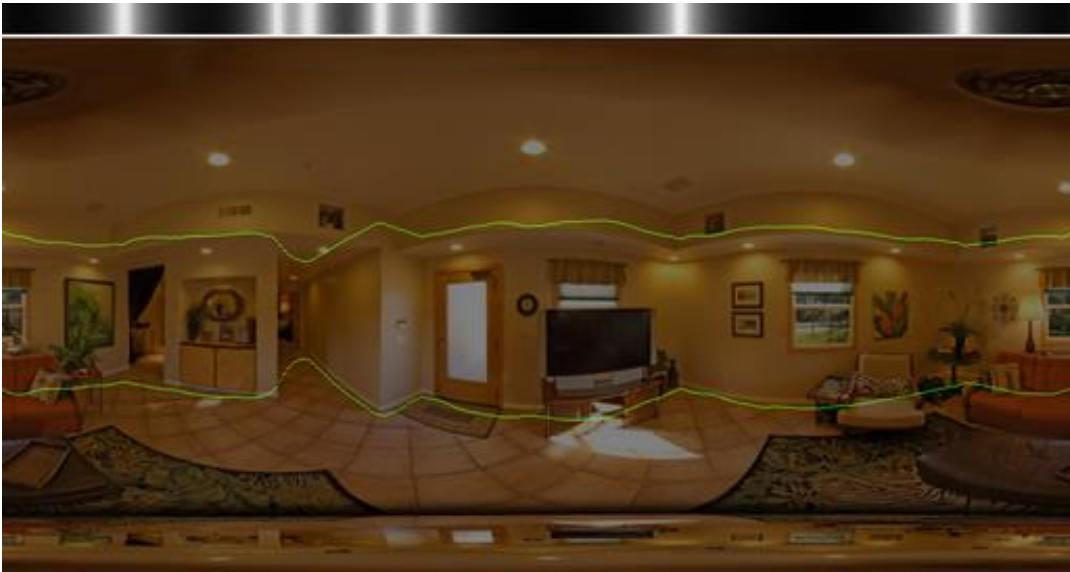



2 ResNet

- **ResNet50**
- ResNet101
- ResNet34
- ResNet152

2 ResNet - resnet50

Img_name	Estimating layout	결과
Pano_01	 A panoramic view of a living room with wooden floors, a patterned rug, and a fireplace. Green lines are overlaid on the image, indicating the estimated layout of the room.	 A 3D floor plan visualization of the living room, showing the layout of the furniture and the room's structure. The visualization is rendered in a perspective view, showing the room's depth and the placement of the furniture.
Pano_07	 A panoramic view of a large hall with a high ceiling and large windows. Green lines are overlaid on the image, indicating the estimated layout of the room.	 A 3D floor plan visualization of the large hall, showing the layout of the furniture and the room's structure. The visualization is rendered in a perspective view, showing the room's depth and the placement of the furniture.

2 ResNet - resnet50

Img_name	Estimating layout	결과
Pano_13		
Pano_15		

2 ResNet - resnet50

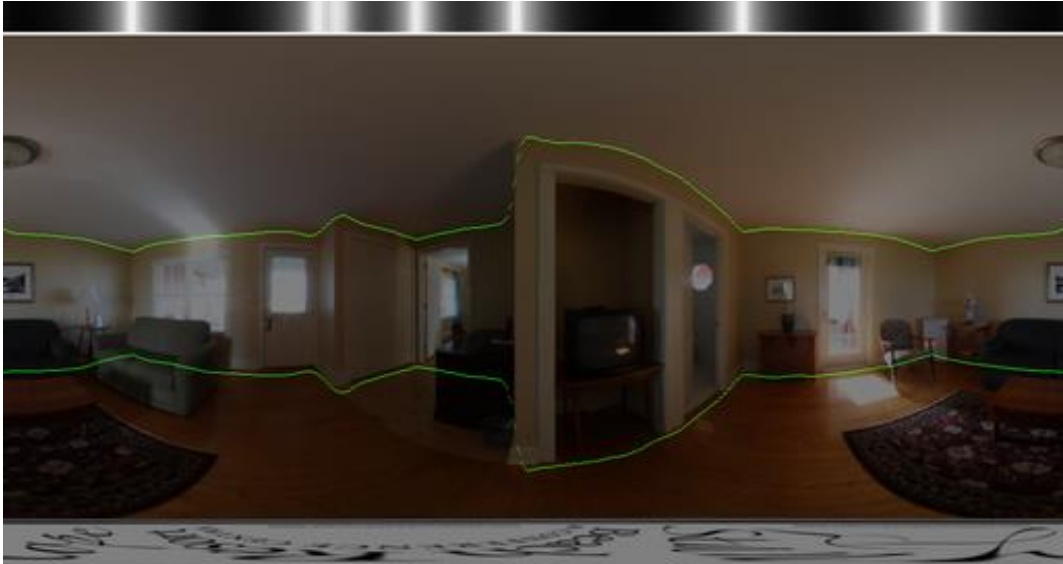

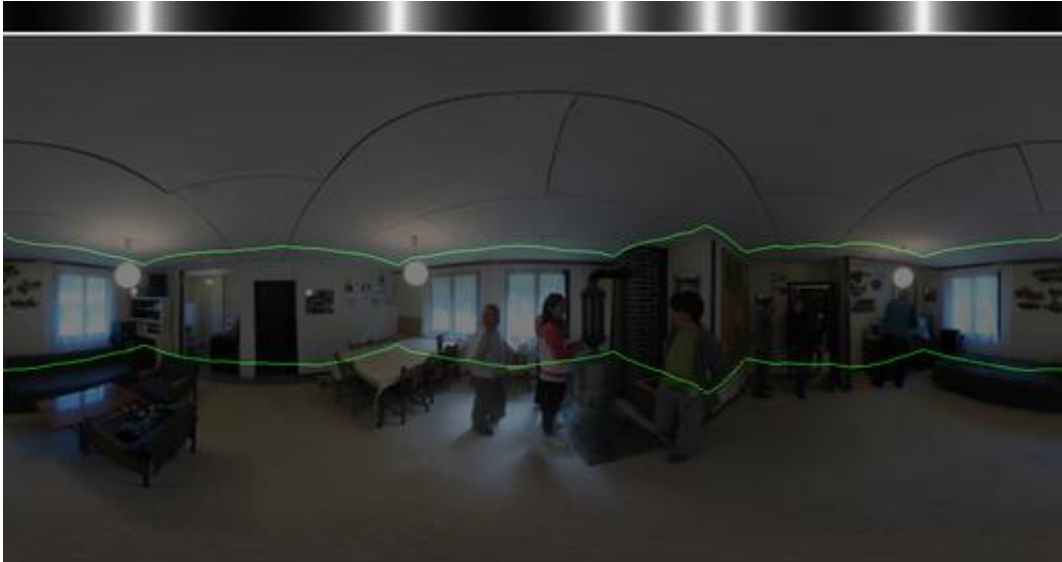

Img_name	Estimating layout	결과
Pano_18		
Pano_20		



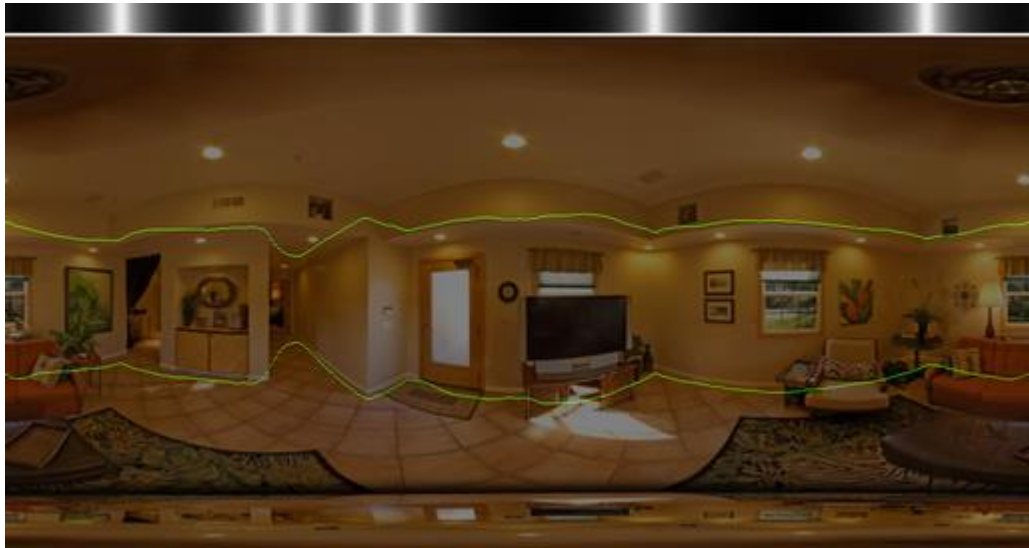



2 ResNet

- ResNet50
- **ResNet101**
- ResNet34
- ResNet152





2 ResNet - resnet101

Img_name	Estimating layout	결과
Pano_01		
Pano_07		

2 ResNet - resnet101

Img_name	Estimating layout	결과
Pano_13		
Pano_15		

2 ResNet - resnet101

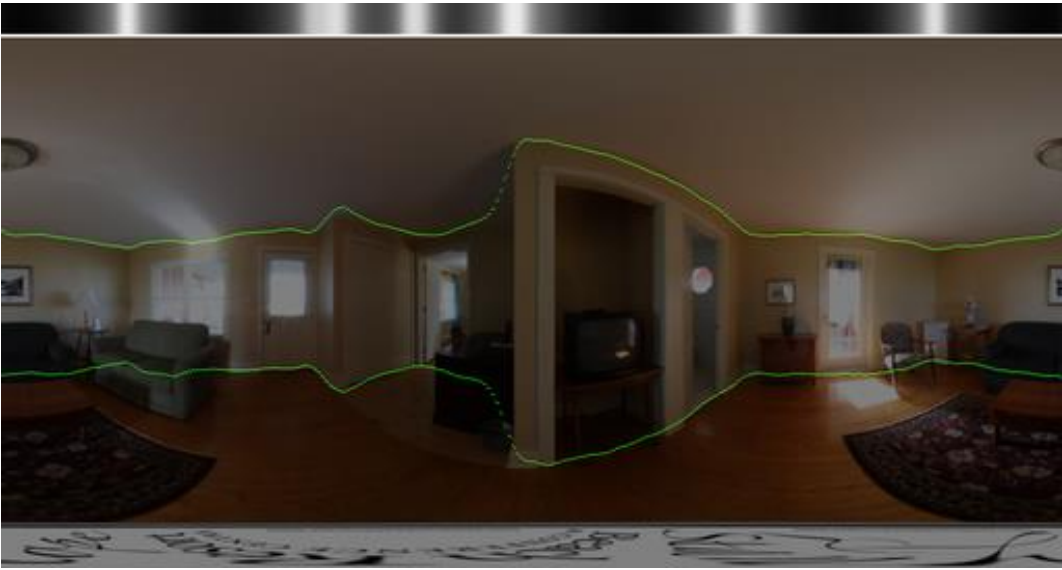

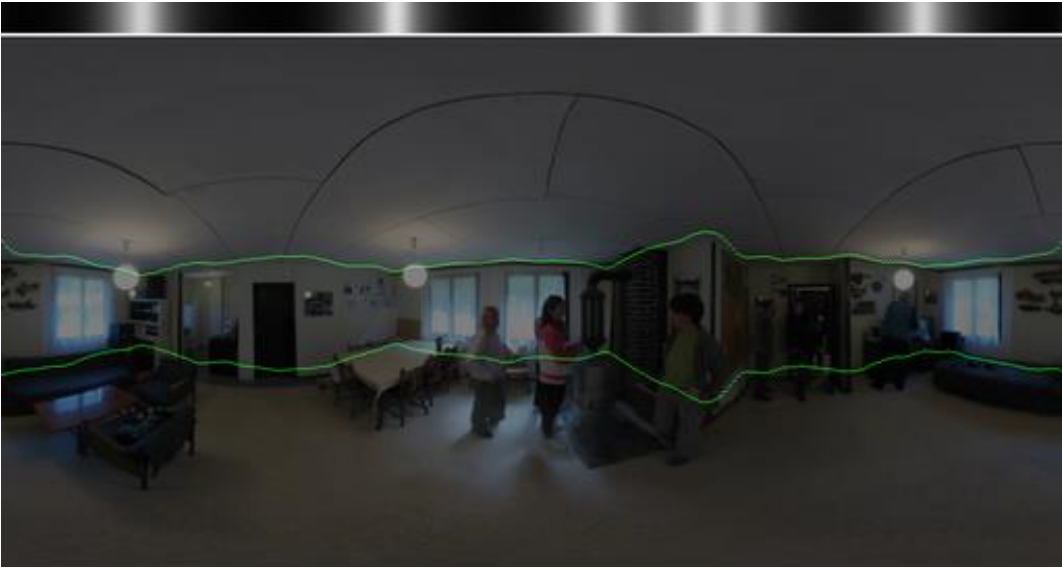

Img_name	Estimating layout	결과
Pano_18		
Pano_20		



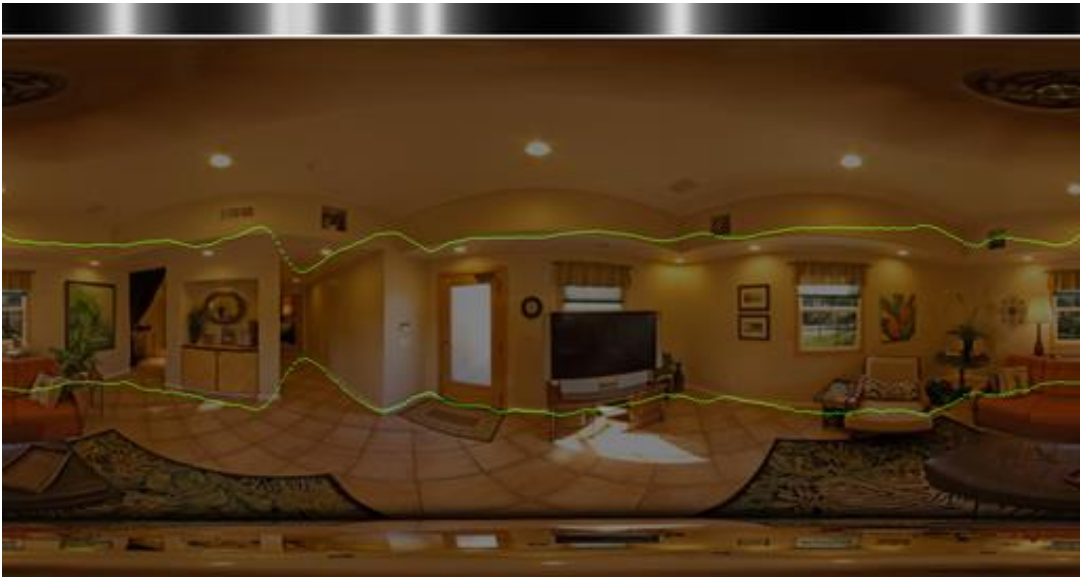
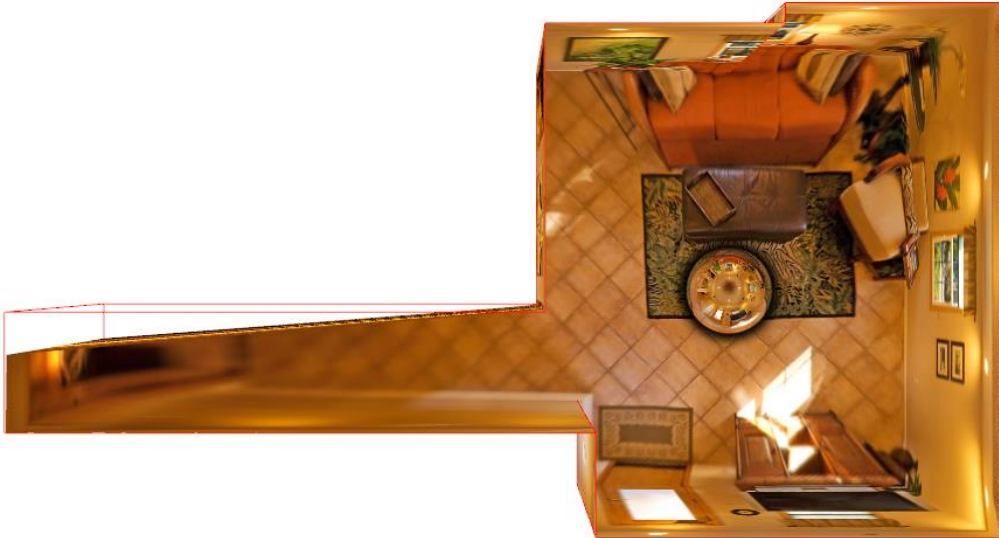


2 ResNet

- ResNet50
- ResNet101
- **ResNet34**
- ResNet152



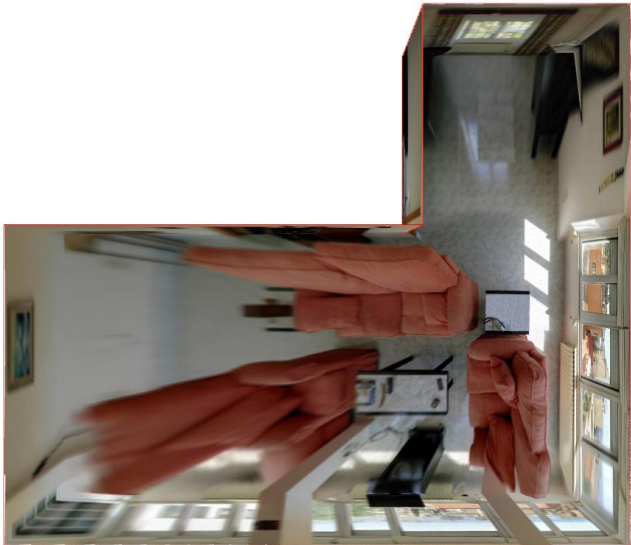
2 ResNet - resnet34

Img_name	Estimating layout	결과
Pano_01	 A panoramic photograph of a living room. A green dashed line is overlaid on the image, tracing the boundaries of the room's layout, including the walls, doorways, and furniture placement.	 A 3D floor plan visualization of the living room shown in Pano_01. The layout is rendered in a top-down perspective, showing the walls, furniture, and the estimated layout lines in a 3D format.
Pano_07	 A panoramic photograph of a large hall or gymnasium. A green dashed line is overlaid on the image, tracing the boundaries of the room's layout, including the walls, doorways, and furniture placement.	 A 3D floor plan visualization of the hall shown in Pano_07. The layout is rendered in a top-down perspective, showing the walls, furniture, and the estimated layout lines in a 3D format.

2 ResNet - resnet34

Img_name	Estimating layout	결과
Pano_13	 A panoramic photograph of a living room. The room features a large television on a stand, a sofa, and a coffee table. A green line overlay indicates the estimated layout of the room, showing the boundaries of the furniture and the overall room shape.	 A 3D perspective view of the living room layout estimated from the panoramic image. The layout shows the room's shape, including the sofa, coffee table, and television area, rendered in a 3D perspective.
Pano_15	 A panoramic photograph of a bedroom. The room features a bed, a desk, and a chair. A green line overlay indicates the estimated layout of the room, showing the boundaries of the furniture and the overall room shape.	 A 3D perspective view of the bedroom layout estimated from the panoramic image. The layout shows the room's shape, including the bed, desk, and chair, rendered in a 3D perspective.

2 ResNet - resnet34

Img_name	Estimating layout	결과
Pano_18		
Pano_20		



2 ResNet

- ResNet50
- ResNet101
- ResNet34
- **ResNet152**

2 ResNet - resnet152

- 다음의 에러가 발생하여 진행하지 못함. 메모리 문제인가..? 😞

```
C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\functional.py:718: UserWarning: Named tensors and all their associated APIs are an experimental feature and subject to change. Please do not use them for anything important until they are released as stable. (Triggered internally at ..\c10\core\TensorImpl.h:1156.)
  return torch.max_pool2d(input, kernel_size, stride, padding, dilation, ceil_mode)

Epoch:  0% | 0/500 [00:01<?, ?ep/s]
Traceback (most recent call last):
  File "train.py", line 190, in <module>
    losses = feed_forward(net, x, y_bon, y_cor)
  File "train.py", line 26, in feed_forward
    y_bon_, y_cor_ = net(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\HorizonNet\model.py", line 242, in forward
    feature = self.reduce_height_module(conv_list, x.shape[3]//self.step_cols)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\HorizonNet\model.py", line 164, in forward
    feature = torch.cat([
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\HorizonNet\model.py", line 165, in <listcomp>
    f(x, out_w).reshape(bs, -1, out_w)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\HorizonNet\model.py", line 138, in forward
    x = self.layer(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\container.py", line 139, in forward
    input = module(input)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\HorizonNet\model.py", line 124, in forward
    return self.layers(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\container.py", line 139, in forward
    input = module(input)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\HorizonNet\model.py", line 31, in forward
    return lr_pad(x, self.padding)
  File "C:\Users\user\PycharmProjects\HorizonNet-resnet152\HorizonNet\model.py", line 21, in lr_pad
    return torch.cat([x[..., -padding:], x, x[..., :padding]], dim=3)
RuntimeError: CUDA out of memory. Tried to allocate 34.00 MiB (GPU 0; 12.00 GiB total capacity; 2.33 GiB already allocated; 27.40 MiB free; 2.41 GiB reserved in total by PyTorch)
```



3 ResNext

- ResNext50_32x4d
- ResNext101_32x8d



3 ResNext

- ResNext50_32x4d
- **ResNext101_32x8d**

3 ResNext - ResNext101_32x8d

- 다음의 에러가 발생하여 진행하지 못함. 메모리 문제인가..? 😞

```
(venv) C:\Users\user\PycharmProjects\HorizonNet-ResNext101\HorizonNet>python train.py --train_root_dir epoch_batch_dataset/train --valid_root_dir epoch_batch_dataset/valid --batch_size_train 1 --num_workers 0 --id model_bs1 --epochs 30
0 --backbone resnext101_32x8d
C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\functional.py:718: UserWarning: Named tensors and all their associated APIs are an experimental feature and subject to change. Please do not use them f
or anything important until they are released as stable. (Triggered internally at ..\c10\core\TensorImpl.h:1156.)
  return torch.max_pool2d(input, kernel_size, stride, padding, dilation, ceil_mode)
Train ep1:  5%|███████|                                     | 1/20 [00:02<00:39,  2.07s/it]
Epoch:  0%|                                                  | 0/300 [00:02<?, ?ep/s]
Traceback (most recent call last):
  File "train.py", line 190, in <module>
    losses = feed_forward(net, x, y_bon, y_cor)
  File "train.py", line 26, in feed_forward
    y_bon_, y_cor_ = net(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\HorizonNet\model.py", line 241, in forward
    conv_list = self.feature_extractor(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\HorizonNet\model.py", line 69, in forward
    x = self.encoder.layer3(x);  features.append(x) # 1/16
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\container.py", line 139, in forward
    input = module(input)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torchvision\models\resnet.py", line 132, in forward
    out = self.conv3(out)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\conv.py", line 443, in forward
    return self._conv_forward(input, self.weight, self.bias)
  File "C:\Users\user\PycharmProjects\HorizonNet-ResNext101\venv\lib\site-packages\torch\nn\modules\conv.py", line 439, in _conv_forward
    return F.conv2d(input, weight, bias, self.stride,
RuntimeError: CUDA out of memory. Tried to allocate 20.00 MiB (GPU 0; 12.00 GiB total capacity; 4.91 GiB already allocated; 12.80 MiB free; 5.30 GiB reserved in total by PyTorch)
```




4 DenseNet

- DenseNet 121
- DenseNet 169
- DenseNet 161
- DenseNet 201



4 DenseNet

- DenseNet 121
- **DenseNet 169**
- DenseNet 161
- DenseNet 201

4 DenseNet - DenseNet169

- 다음의 에러가 발생하여 진행하지 못함. 메모리 문제인가..? 😞

```
(venv) C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet>python train.py --train_root_dir epoch_batch_dataset/train --valid_root_dir epoch_batch_dataset/valid --batch_size_train 1 --num_workers 0 --id model_bs1 --epochs 300 --backbone densenet169
C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\functional.py:718: UserWarning: Named tensors and all their associated APIs are an experimental feature and subject to change. Please do not use them for anything important until they are released as stable. (Triggered internally at ..\c10\core\TensorImpl.h:1156.)
  return torch.max_pool2d(input, kernel_size, stride, padding, dilation, ceil_mode)
Train ep1:  5%|██████████|                                     | 1/20 [00:02<00:49,  2.58s/it]
Epoch:  0%|                                                    | 0/300 [00:02<?, ?ep/s]
Traceback (most recent call last):
  File "train.py", line 190, in <module>
    losses = feed_forward(net, x, y_bon, y_cor)
  File "train.py", line 26, in feed_forward
    y_bon_, y_cor_ = net(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet\model.py", line 241, in forward
    conv_list = self.feature_extractor(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet\model.py", line 94, in forward
    x = m(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torchvision\models\densenet.py", line 127, in forward
    new_features = layer(features)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torchvision\models\densenet.py", line 92, in forward
    bottleneck_output = self.bn_function(prev_features)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torchvision\models\densenet.py", line 52, in bn_function
    concatenated_features = torch.cat(inputs, 1)
RuntimeError: CUDA out of memory. Tried to allocate 20.00 MiB (GPU 0; 12.00 GiB total capacity; 2.48 GiB already allocated; 2.76 MiB free; 2.52 GiB reserved in total by PyTorch)
```



4 DenseNet

- DenseNet 121
- DenseNet 169
- **DenseNet 161**
- DenseNet 201

4 DenseNet - DenseNet161

- 다음의 에러가 발생하여 진행하지 못함. 메모리 문제인가..? 😞

```
(venv) C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet>python train.py --train_root_dir epoch_batch_dataset/train --valid_root_dir epoch_batch_dataset/valid --batch_size_train 1 --num_workers 0 --id model_bs1 --epochs 300 --backbone densenet161
Downloading: "https://download.pytorch.org/models/densenet161-8d451a50.pth" to C:\Users\user\.cache\torch\hub\checkpoints\densenet161-8d451a50.pth
100%|#####| 110M/110M [00:18<00:00, 6.23MB/s]
C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\functional.py:718: UserWarning: Named tensors and all their associated APIs are an experimental feature and subject to change. Please do not use them for anything important until they are released as stable. (Triggered internally at ..\c10\core\TensorImpl.h:1156.)
  return torch.max_pool2d(input, kernel_size, stride, padding, dilation, ceil_mode)
Train ep1: 0%|#####| 0/20 [00:00<?, ?it/s]
Epoch: 0%|#####| 0/300 [00:00<?, ?ep/s]
Traceback (most recent call last):
  File "train.py", line 190, in <module>
    losses = feed_forward(net, x, y_bon, y_cor)
  File "train.py", line 26, in feed_forward
    y_bon_, y_cor_ = net(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet\model.py", line 241, in forward
    conv_list = self.feature_extractor(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet\model.py", line 94, in forward
    x = m(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torchvision\models\densenet.py", line 127, in forward
    new_features = layer(features)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torchvision\models\densenet.py", line 94, in forward
    new_features = self.conv2(self.relu2(self.norm2(bottleneck_output)))
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\batchnorm.py", line 167, in forward
    return F.batch_norm(
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\functional.py", line 2281, in batch_norm
    return torch.batch_norm(
RuntimeError: CUDA out of memory. Tried to allocate 20.00 MiB (GPU 0; 12.00 GiB total capacity; 2.59 GiB already allocated; 0 bytes free; 2.60 GiB reserved in total by PyTorch)
```



4 DenseNet

- DenseNet 121
- DenseNet 169
- DenseNet 161
- **DenseNet 201**

4 DenseNet – DenseNet201

- 다음의 예러가 발생하여 진행하지 못함. 메모리 문제인가..? 😞

```
(venv) C:\Users\user\PycharmProjects\HorizonNet-densenet169>python train.py --train_dir epoch_batch_dataset/train --valid_root_dir epoch_batch_dataset/valid --batch_size_train 1 -num_workers 0 --id model_bs1 --epochs 300 --backbone densenet201
Downloading: "https://download.pytorch.org/models/densenet201-c1103571.pth" to C:\Users\user\.cache\torch\hub\checkpoints\densenet201-c1103571.pth
100%|██████████████████████████████████████████████████████████████████████████████████████████████████████████████████████████████████| 77.4M/77.4M [00:13<00:00, 5.82MB/s]
C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\functional.py:718: UserWarning: Named tensors and all their associated APIs are an experimental feature and subject to change. Please do not use them
for anything important until they are released as stable. (Triggered internally at ..\c10\core\TensorImpl.h:1156.)
    return torch.max_pool2d(input, kernel_size, stride, padding, dilation, ceil_mode)
Train ep1:   0%|                                                    | 0/20 [00:01<?, ?it/s]
Epoch:      0%|                                                    | 0/300 [00:01<?, ?ep/s]
Traceback (most recent call last):
  File "train.py", line 190, in <module>
    losses = feed_forward(net, x, y_bon, y_cor)
  File "train.py", line 26, in feed_forward
    y_bon_, y_cor_ = net(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet\model.py", line 241, in forward
    conv_list = self.feature_extractor(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\HorizonNet\model.py", line 94, in forward
    x = m(x)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torchvision\models\densenet.py", line 127, in forward
    new_features = layer(features)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torchvision\models\densenet.py", line 94, in forward
    new_features = self.conv2(self.relu2(self.norm2(bottleneck_output)))
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\module.py", line 1051, in _call_impl
    return forward_call(*input, **kwargs)
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\modules\batchnorm.py", line 167, in forward
    return F.batch_norm(
  File "C:\Users\user\PycharmProjects\HorizonNet-densenet169\venv\lib\site-packages\torch\nn\functional.py", line 2281, in batch_norm
    return torch.batch_norm(
RuntimeError: CUDA out of memory. Tried to allocate 2.00 MiB (GPU 0; 12.00 GiB total capacity; 2.53 GiB already allocated; 1.94 MiB free; 2.54 GiB reserved in total by PyTorch)
```



5 결과 분석

- 결과 분석
- 결과 비교

● ResNet

- ResNet101이 대체적으로 성능이 떨어져 보임.
- ResNet50과 ResNet34는 눈으로 성능을 비교하기 어려움.
- ResNet 종류마다 사진의 가로 세로 비율이 다름.

● ResNext

- ResNet101이 대체적으로 성능이 떨어져 보임.
- ResNet50과 ResNet34는 눈으로 성능을 비교하기 어려움.
- ResNet 종류마다 사진의 가로 세로 비율이 다름.

● DenseNet



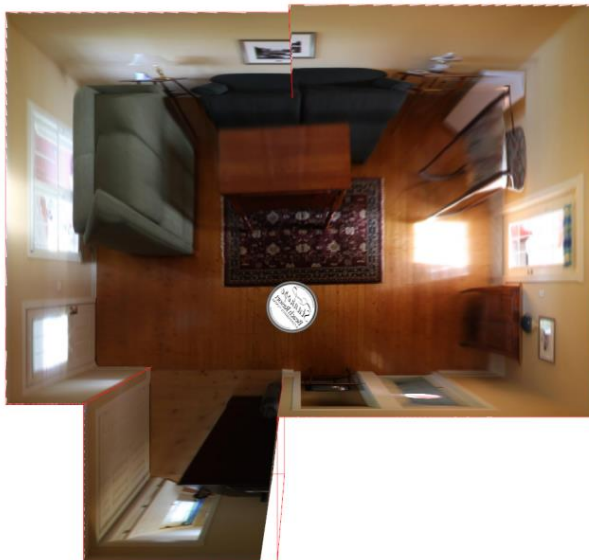



- ResNet101이 대체적으로 성능이 떨어져 보임.
- ResNet50과 ResNet34는 눈으로 성능을 비교하기 어려움.
- ResNet 종류마다 사진의 가로 세로 비율이 다름.



5 결과 분석

- 결과 분석
- **결과 비교**

5 결과 분석 - 결과 비교

Img_name	resnet50	resnet101	resnet34
Pano_01			
Pano_07			

5 결과 분석 - 결과 비교

Img_name	resnet18	ResNext50_32x4d	DenseNet 121
Pano_01			
Pano_07			

5 결과 분석 - 결과 비교

Img_name	resnet50	resnet101	resnet34
Pano_13			
Pano_15			

5 결과 분석 - 결과 비교

Img_name	Resnet18	ResNext50_32x4d	DenseNet 121
Pano_13			
Pano_15			

5 결과 분석 - 결과 비교

Img_name	resnet50	resnet101	resnet34
Pano_18			
Pano_20			

5 결과 분석 - 결과 비교

Img_name	Resnet18	ResNext50_32x4d	DenseNet 121
Pano_18			
Pano_20			



THANK YOU

The End

