

YOLOv5

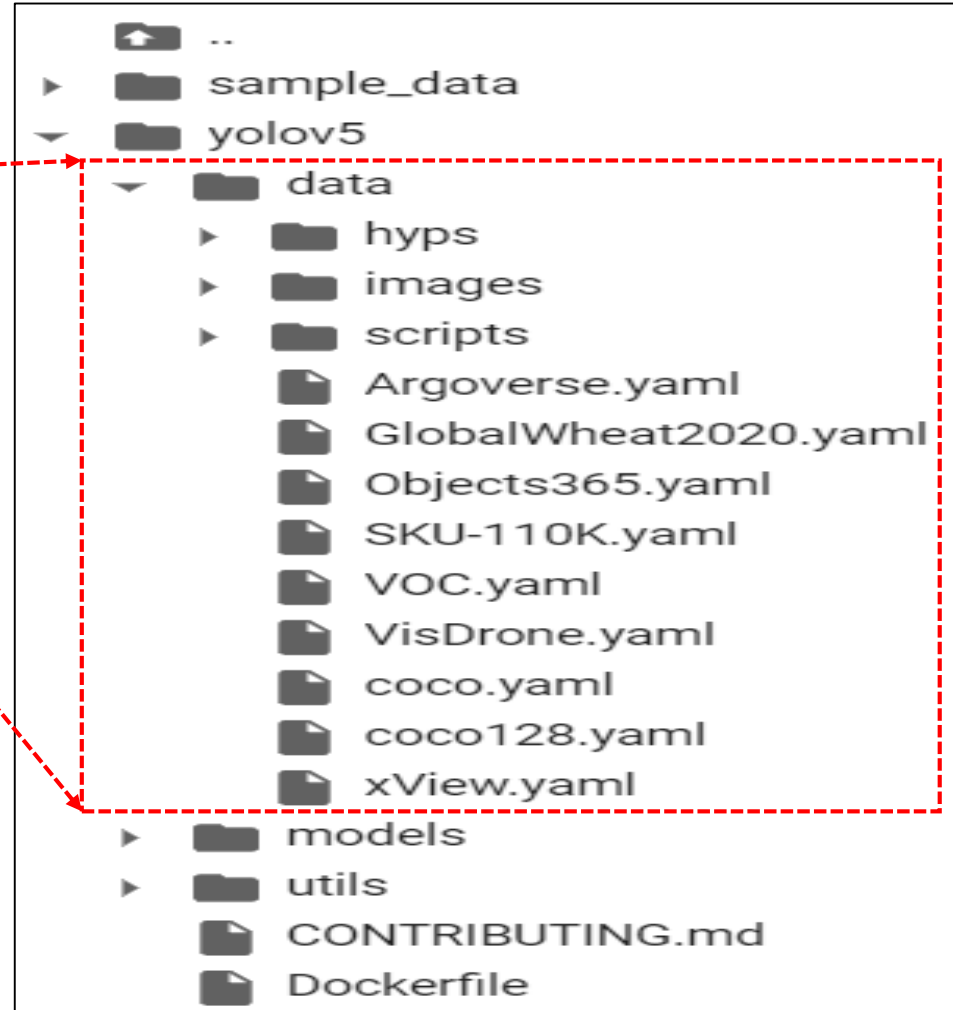
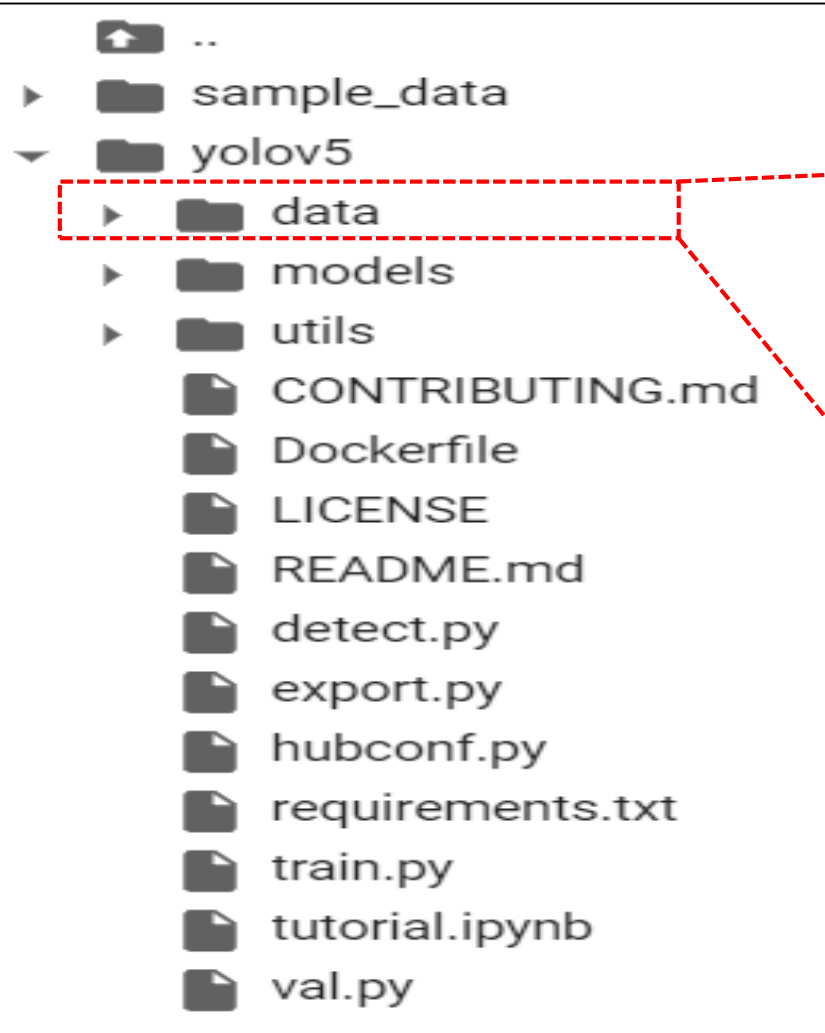
Basic Detection Process (using roboflow)

박성호 (neowizard2018@gmail.com)

YOLOv5 git clone

```
%cd /content
```

```
!git clone https://github.com/ultralytics/yolov5.git
```



필수 라이브러리 설치

```
# 필수 라이브러리 설치
```

```
!pip install -r /content/yolov5/requirements.txt
```

```
Requirement already satisfied: matplotlib>=3.2.2 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: numpy>=1.18.5 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: opencv-python>=4.1.2 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: Pillow>=7.1.2 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Collecting PyYAML>=5.3.1
```

```
  Downloading PyYAML-6.0-cp37-cp37m-manylinux_2_5_x86_64.manylinux1_x86_64.manylinux_2_12_x86_64.manylinux2014_x86_64.whl (596 kB)
  |████████████████████████████████████████| 596 kB 13.3 MB/s
```

```
Requirement already satisfied: requests>=2.23.0 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: scipy>=1.4.1 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: torch>=1.7.0 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: torchvision>=0.8.1 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: tqdm>=4.41.0 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: tensorboard>=2.4.1 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: pandas>=1.1.4 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Requirement already satisfied: seaborn>=0.11.0 in /usr/local/lib/python3.7/dist-packages (from -r /content/yolov5/requirements.txt)
Collecting thop
```

```
  Downloading thop-0.0.31.post2005241907-py3-none-any.whl (8.7 kB)
```

```
Requirement already satisfied: kiwisolver>=1.0.1 in /usr/local/lib/python3.7/dist-packages (from matplotlib>=3.2.2)
```

pre-trained model 다운로드 (option)

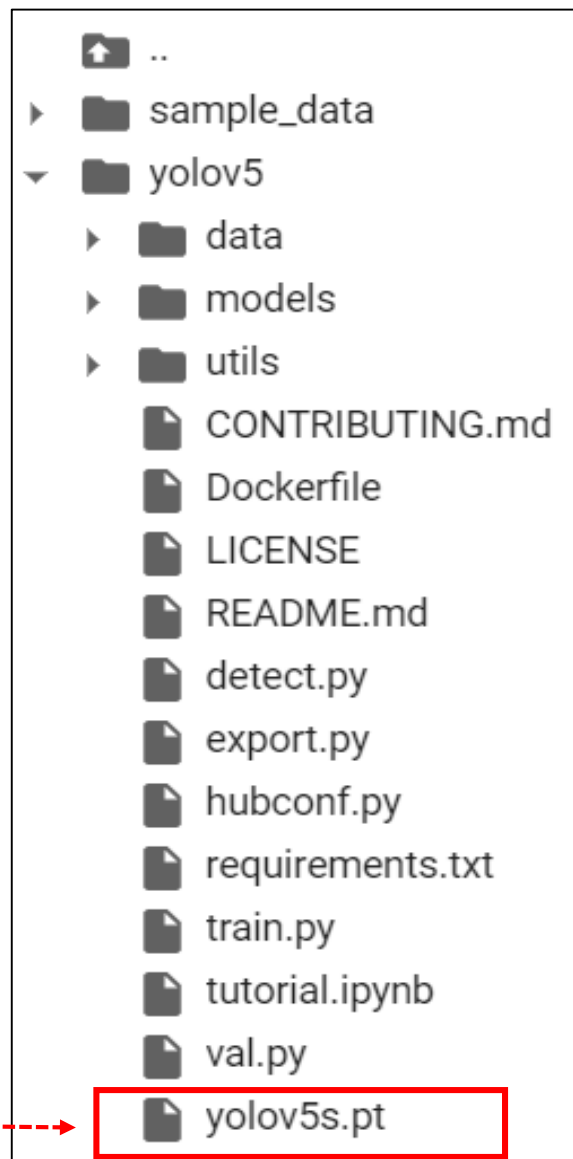
```
!wget -P /content/yolov5/ https://github.com/ultralytics/yolov5/releases/download/v6.0/yolov5s.pt

--2021-10-22 11:19:27-- https://github.com/ultralytics/yolov5/releases/download/v6.0/yolov5s.pt
Resolving github.com (github.com)... 140.82.113.4
Connecting to github.com (github.com)|140.82.113.4|:443... connected.
HTTP request sent, awaiting response... 302 Found
Location: https://github-releases.githubusercontent.com/264818686/eab38592-7168-4731-bdff-ad5ede200...
--2021-10-22 11:19:27-- https://github-releases.githubusercontent.com/264818686/eab38592-7168-4731-
Resolving github-releases.githubusercontent.com (github-releases.githubusercontent.com)... 185.199.
Connecting to github-releases.githubusercontent.com (github-releases.githubusercontent.com)|185.199
HTTP request sent, awaiting response... 200 OK
Length: 14698491 (14M) [application/octet-stream]
Saving to: '/content/yolov5/yolov5s.pt'

yolov5s.pt          100%[=====>] 14.02M  --.-KB/s    in 0.1s

2021-10-22 11:19:27 (101 MB/s) - '/content/yolov5/yolov5s.pt' saved [14698491/14698491]
```

detect 실행 시에, 자동으로 다운로드 된 pre-trained model
(default=yolo5s.pt). COCO Dataset으로 이미 학습되어 있음



roboflow – computer vision datasets (<https://public.roboflow.com/>)

roboflow

[Blog](#) [Public Datasets](#) [Model Zoo](#) [Docs](#)

DATASET TYPE

All Datasets 39

Object Detection 35

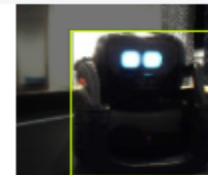
Classification 4

Computer Vision Datasets

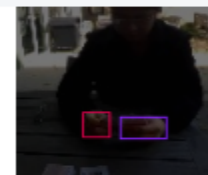
Roboflow hosts free public computer vision datasets in many popular formats (including CreateML JSON, COCO JSON, Pascal VOC XML, YOLO v3, and Tensorflow TFRecords). For your convenience, we also have downsized and augmented versions available.

If you'd like us to host your dataset, please [get in touch](#).

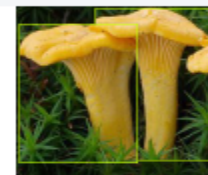
☐ Anki Vector Robot Dataset Dataset
Object Detection (Bounding Box)
417 images | 8 exports | Last updated a day ago



☐ EgoHands Dataset
Object Detection (Bounding Box)
4800 images | 5 exports | Last updated 5 days ago



☐ Microsoft COCO 2017 Dataset
Object Detection (Bounding Box)
121448 images | 9 exports | Last updated a month ago



☐ North American Mushrooms Dataset
Object Detection (Bounding Box)
51 images | 3 exports | Last updated 2 months ago



roboflow – computer vision datasets (<https://public.roboflow.com/>)

The screenshot shows the Roboflow website interface. The top navigation bar includes the Roboflow logo and links for Blog, Public Datasets, Model Zoo, and Docs. The main header displays 'Mask Wearing Dataset >> 416x416-black-padding'. On the left sidebar, under 'DOWNLOADS', the '416x416-black-padding' dataset is selected, showing 149 items. The main content area shows 'Export Created a year ago May 11, 2020' and 'Export Size 149 images'. An 'Export' modal is open in the center, featuring a 'Format' dropdown menu with 'YOLO v5 PyTorch' selected. Below the dropdown, there is a description: 'TXT annotations and YAML config used with YOLOv5.' and two radio buttons: 'download zip to computer' and 'show download code' (which is selected). The modal has 'Cancel' and 'Continue' buttons at the bottom.

roboflow

Blog Public Datasets Model Zoo Docs

Mask Wearing Dataset >> 416x416-black-padding

Dataset Summary

Dataset Health Check

DOWNLOADS

raw 149

416x416-black-padding 149

Export Created a year ago May 11, 2020

Export Size 149 images

Annotations People

Available Download Formats

Format

YOLO v5 PyTorch

TXT annotations and YAML config used with YOLOv5.

☐ download zip to computer ☒ show download code

Cancel Continue

YOLO5 - Mask Wearing Dataset (custom data) 다운로드

Public Dataset : <https://public.roboflow.com/object-detection/mask-wearing>

```
[ ] # custom 데이터 디렉토리 생성
```

```
%mkdir /content/Mask_Data
```

```
%cd /content/Mask_Data/
```

```
/content/Mask_Data
```

```
[ ] # custom 데이터 다운로드 (Mask Wearing Dataset)
```

```
!curl -L "https://public.roboflow.com/ds/1YCmP9kWMM?key=dxrT2m6avr" > roboflow.zip; unzip roboflow.zip; rm roboflow.zip
```

% Total	% Received	% Xferd	Average Speed	Time	Time	Time	Current
			Dload Upload	Total	Spent	Left	Speed
100	896	100	896	0	0	1866	0
100	3791k	100	3791k	0	0	6276k	0

```
Archive: roboflow.zip
```

```
extracting: test/images/w1240-p16x9-0e48e0098f6e832f27d8b581b33bbc72b9967a63_jpg.rf.34ed1e8f70eebdabaf43ab9d40dc1c9b.jp
```

```
extracting: test/images/RTX7CCFN_jpg.rf.66ed5c5054f30d933d19ab3d56ace004.jpg
```

```
extracting: test/images/the-first-day-of-wuhan-s-closure-some-people-fled-some-panicked_jpg.rf.0302fefb0879eb37736a704c
```

```
extracting: test/images/1288126-10255706714jpg_jpg.rf.95f7324cbfd48e0386e0660b5e932223.jpg
```

```
extracting: test/images/126202-untitled-design-13_jpg.rf.56b50d413464989bb2232448a8fbb915.jpg
```

```
extracting: test/images/r1p00017o8171png407.png.rf.6fd25b7219a249e97f54fcabf2b52726.png
```


yaml 파일 설정 (데이터셋 위치 알려주는 config file)

```
%cat /content/Mask_Data/data.yaml
```

```
train: ../train/images
val: ../valid/images

nc: 2
names: ['mask', 'no-mask']
```

```
# yaml 파일을 학습이 가능하도록 경로 설정.
# cat 결과 내용을 data['train'], data['val'], data['nc'], data['names'] 에 넣어주는데,
# 가장 중요한 부분은 데이터 경로 설정임.
# 즉 train: ../train/images 에서 .. 부분은 절대경로인 /content/Mask_Data 바꾸어 주는것이 중요
# https://stackoverflow.com/questions/69564817/typeerror-load-missing-1-required-positional-argument-loader-in-google-col
# yaml.load() => yaml.safe_load()
```

```
import yaml

with open('/content/Mask_Data/data.yaml', 'r') as f:
    data = yaml.safe_load(f)

print(data)

data['train'] = '/content/Mask_Data/train/images/'
data['val'] = '/content/Mask_Data/valid/images/'

data['nc'] = 2
data['names'] = ['mask', 'no-mask']

with open('/content/Mask_Data/data.yaml', 'w') as f:
    yaml.dump(data, f)

print(data)
```

학습 데이터 디렉토리는
다음과 같이 구성되어야함

data/train/images
data/train/labels
data/valid/images
data/valid/labels

```
{'train': '../train/images', 'val': '../valid/images', 'nc': 2, 'names': ['mask', 'no-mask']}
{'train': '/content/Mask_Data/train/images/', 'val': '/content/Mask_Data/valid/images/', 'nc': 2, 'names': ['mask', 'no-mask']}
```

하이퍼 파라미터 설정 및 train



하이퍼 파라미터 설정

```
img_size = 416
batch_size = 32
epochs = 100
```

```
data_path = '/content/mask_data/data.yaml'
yalm_path = '/content/yolov5/models/yolov5s.yaml'
weights_path = '/content/yolov5/yolov5s.pt'
```

train

```
!python3 /content/yolov5/train.py --img {img_size} --batch {batch_size} --epochs {epochs} --data {data_path} \
--cfg {yalm_path} --weights {weights_path}
```



Downloading <https://ultralytics.com/assets/Arial.ttf> to /root/.config/Ultralytics/Arial.ttf...

train: weights=/content/yolov5/yolov5s.pt, cfg=/content/yolov5/models/yolov5s.yaml, data=/content/mask_data/data.yaml, hyp:

github: skipping check (not a git repository), for updates see <https://github.com/ultralytics/yolov5>

YOLOv5 🚀 v6.0-30-gfee83c1 torch 1.9.0+cu111 CUDA:0 (Tesla K80, 11441.1875MB)

hyperparameters: lr0=0.01, lrf=0.1, momentum=0.937, weight_decay=0.0005, warmup_epochs=3.0, warmup_momentum=0.8, warmup_b

Weights & Biases: run 'pip install wandb' to automatically track and visualize YOLOv5 🚀 runs (RECOMMENDED)

TensorBoard: Start with 'tensorboard --logdir yolov5/runs/train', view at <http://localhost:6006/>

Overriding model.yaml nc=80 with nc=2

	from	n	params	module	arguments
0	-1	1	3520	models.common.Conv	[3, 32, 6, 2, 2]

텐서보드를 이용한 학습과정 출력

train 명령어 실행할 경우, 학습과정 저장 디렉토리가 출력되므로 --logdir 다음에 해당 디렉토리를 적어주면 된다

```
%load_ext tensorboard
```

```
%tensorboard --logdir /content/yolov5/runs/train/exp/
```

TensorBoard

SCALARS

IMAGES

GRAPHS

TIME SERIES

INACTIVE



☐ Show data download links

☒ Ignore outliers in chart scaling

Tooltip sorting method: default

Smoothing

0.6

Horizontal Axis

STEP

RELATIVE

WALL

Runs

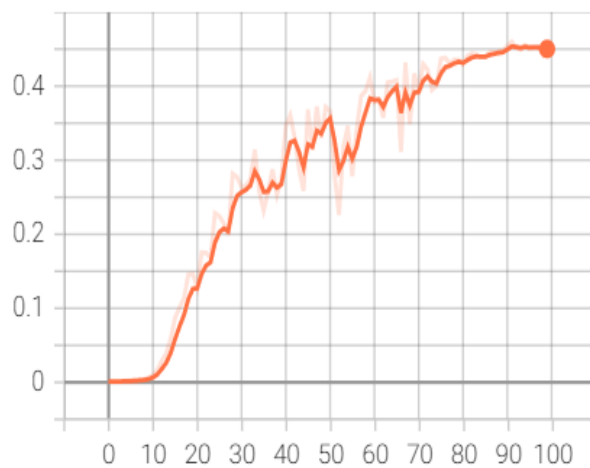
Write a regex to filter runs

Filter tags (regular expressions supported)

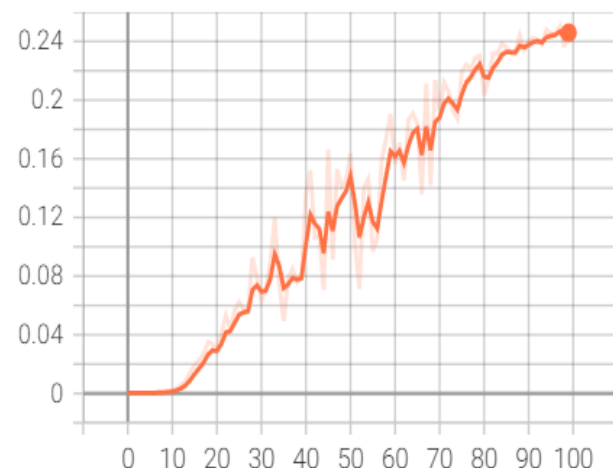
metrics

4 ^

metrics/mAP_0.5
tag: metrics/mAP_0.5



metrics/mAP_0.5:0.95
tag: metrics/mAP_0.5:0.95



테스트 이미지 데이터 생성 및 확인



테스트 이미지

```
from glob import glob

test_image_list = glob('/content/mask_data/test/images/*.jpg')

print(len(test_image_list))

test_image_list.sort()

for i in range(len(test_image_list)):

    print('i = ', i, test_image_list[i])
```



```
15
i = 0 /content/mask_data/test/images/0_Concern-In-China-As-Mystery-Virus-Spreads_jpg.rf.3135dfc5feab288d76a4ccfd22dfc5bf.jpg
i = 1 /content/mask_data/test/images/1224331650_g_400-w_g_jpg.rf.b816f49e2d84044fc997a8cbd55c347d.jpg
i = 2 /content/mask_data/test/images/126202-untitled-design-13_jpg.rf.56b50d413464989bb2232448a8fbb915.jpg
i = 3 /content/mask_data/test/images/1288126-10255706714jpg_jpg.rf.95f7324cbfd48e0386e0660b5e932223.jpg
i = 4 /content/mask_data/test/images/15391513324714o1n0r10n6_jpg.rf.a91fbc7be8a94ed3c48d2e4b35bd53bb.jpg
i = 5 /content/mask_data/test/images/15391513329330sooq10859_jpg.rf.89c8524c2096175fa2c728e5d73f1c28.jpg
i = 6 /content/mask_data/test/images/1579924271_jpg.rf.be5b27c2b2801bccc191e6dbd9bfccca.jpg
i = 7 /content/mask_data/test/images/RTX7CCFN_jpg.rf.66ed5c5054f30d933d19ab3d56ace004.jpg
i = 8 /content/mask_data/test/images/php1pE73q_jpg.rf.bd81cab9f8ff2674ce2e58278f7d37fa.jpg
i = 9 /content/mask_data/test/images/r1p00017o8171pnq407_jpg.rf.6fd25b7219a249e97f54fcabf2b52726.jpg
i = 10 /content/mask_data/test/images/shutterstock_1627199179_jpg.rf.8432d033a37b3d142ec4ffccede508c7d.jpg
i = 11 /content/mask_data/test/images/the-first-day-of-wuhan-s-closure-some-people-fled-some-panicked_jpg.rf.0302fefb0879eb37736a704ca5
i = 12 /content/mask_data/test/images/w1240-p16x9-0e48e0098f6e832f27d8b581b33bbc72b9967a63_jpg.rf.34ed1e8f70eebdabaf43ab9d40dc1c9b.jpg
i = 13 /content/mask_data/test/images/w1240-p16x9-2019-10-04t075956z_1862636027_rc15d4d49d00_rtrmadp_3_hongkong-protests_jpg.rf.061f2c7
i = 14 /content/mask_data/test/images/w1240-p16x9-fa978043def f83fed485af12d16e39c61398fc30_jpg.rf.185d01b7e55e049c6661b8ecd49679fc.jpg
```

YOLOv5 이용한 이미지내의 객체 검출 (Inference)

```
[ ] # inference
```

```
!python3 /content/yolov5/detect.py --weights /content/yolov5/runs/train/exp/weights/best.pt --img 416 --conf 0.5 --source /content/mask_data/test/images/
```

```
detect: weights=['/content/yolov5/runs/train/exp/weights/best.pt'], source=/content/mask_data/test/images/, imgsz=[416, 416], conf_thres=0.5, iou_thres=0.45  
YOLOv5 🚀 v6.0-30-gfee83c1 torch 1.9.0+cu111 CUDA:0 (Tesla K80, 11441.1875MB)
```

Fusing layers...

Model Summary: 213 layers, 7015519 parameters, 0 gradients, 15.8 GFLOPs

image 1/15 /content/mask_data/test/images/0_Concern-In-China-As-Mystery-Virus-Spreads_jpg.rf.3135dfc5feab288d76a4ccfd22dfc5bf.jpg: 416x416 2 masks, Done.

image 2/15 /content/mask_data/test/images/1224331650_g_400-w_g_jpg.rf.b816f49e2d84044fc997a8cbd55c347d.jpg: 416x416 4 masks, Done. (0.027s)

image 3/15 /content/mask_data/test/images/126202-untitled-design-13_jpg.rf.56b50d413464989bb2232448a8fbb915.jpg: 416x416 5 masks, Done. (0.028s)

image 4/15 /content/mask_data/test/images/1288126-10255706714jpg.jpg.rf.95f7324cbfd48e0386e0660b5e932223.jpg: 416x416 2 masks, Done. (0.028s)

image 5/15 /content/mask_data/test/images/15391513324714o1n0r10n6_jpg.rf.a91fbc7be8a94ed3c48d2e4b35bd53bb.jpg: 416x416 1 mask, Done. (0.028s)

image 6/15 /content/mask_data/test/images/15391513329330sooq10859_jpg.rf.89c8524c2096175fa2c728e5d73f1c28.jpg: 416x416 1 mask, Done. (0.028s)

image 7/15 /content/mask_data/test/images/1579924271_jpg.rf.be5b27c2b2801bccc191e6dbd9bfccca.jpg: 416x416 7 masks, Done. (0.028s)

image 8/15 /content/mask_data/test/images/RTX7CCFN_jpg.rf.66ed5c5054f30d933d19ab3d56ace004.jpg: 416x416 2 masks, Done. (0.028s)

image 9/15 /content/mask_data/test/images/phplpE73q_jpg.rf.bd81cab9f8ff2674ce2e58278f7d37fa.jpg: 416x416 29 masks, Done. (0.028s)

image 10/15 /content/mask_data/test/images/r1p00017o8171pnq407_jpg.rf.6fd25b7219a249e97f54fcabf2b52726.jpg: 416x416 1 mask, Done. (0.028s)

image 11/15 /content/mask_data/test/images/shutterstock_1627199179_jpg.rf.8432d033a37b3d142ec4ffced508c7d.jpg: 416x416 5 masks, Done. (0.028s)

image 12/15 /content/mask_data/test/images/the-first-day-of-wuhan-s-closure-some-people-fled-some-panicked_jpg.rf.0302fefb0879eb37736a704ca5d070ff.jpg: 416x416 1 mask, Done. (0.028s)

image 13/15 /content/mask_data/test/images/w1240-p16x9-0e48e0098f6e832f27d8b581b33bbc72b9967a63_jpg.rf.34ed1e8f70eebdabaf43ab9d40dc1c9b.jpg: 416x416 2 masks, Done. (0.028s)

image 14/15 /content/mask_data/test/images/w1240-p16x9-2019-10-04t075956z_1862636027_rc15d4d49d00_rtrmadp_3_hongkong-protests_jpg.rf.061f2c7f7d17a0b472510.jpg: 416x416 1 mask, Done. (0.028s)

image 15/15 /content/mask_data/test/images/w1240-p16x9-fa978043deff83fed485af12d16e39c61398fc30_jpg.rf.185d01b7e55e049c6661b8ecd49679fc.jpg: 416x416 1 mask, Done. (0.028s)

Speed: 0.4ms pre-process, 28.0ms inference, 1.5ms NMS per image at shape (1, 3, 416, 416)

Results saved to **yolov5/runs/detect/exp**

결과 확인 및 다운로드

```
[ ] import glob

detected_image_list = glob.glob('/content/yolov5/runs/detect/exp/*.jpg')

detected_image_nums = len(detected_image_list)

print(detected_image_nums)

print(detected_image_list)
```

```
15
['/content/yolov5/runs/detect/exp/phplpE73q.jpg.rf.bd81cab9f8ff2674ce2e58278f7d37fa.jpg', '/content/yolov5/runs/
```

```
import zipfile
import os

if not os.path.exists('/content/detected_result/'):
    os.mkdir('/content/detected_result/')
    print('detected_result dir is created !!!')

with zipfile.ZipFile('/content/detected_result/Mask_detected_images.zip', 'w') as detected_images:

    for idx in range(detected_image_nums):
        detected_images.write(detected_image_list[idx])
```

파일 다운로드

```
import shutil
from google.colab import files

shutil.copy('/content/yolov5/runs/train/exp/weights/best.pt', '/content/yolov5/Mask_best.pt')

files.download('/content/detected_result/Mask_detected_images.zip')

files.download('/content/yolov5/Mask_best.pt')
```