

# YOLO v5

## Object Detection

### Index

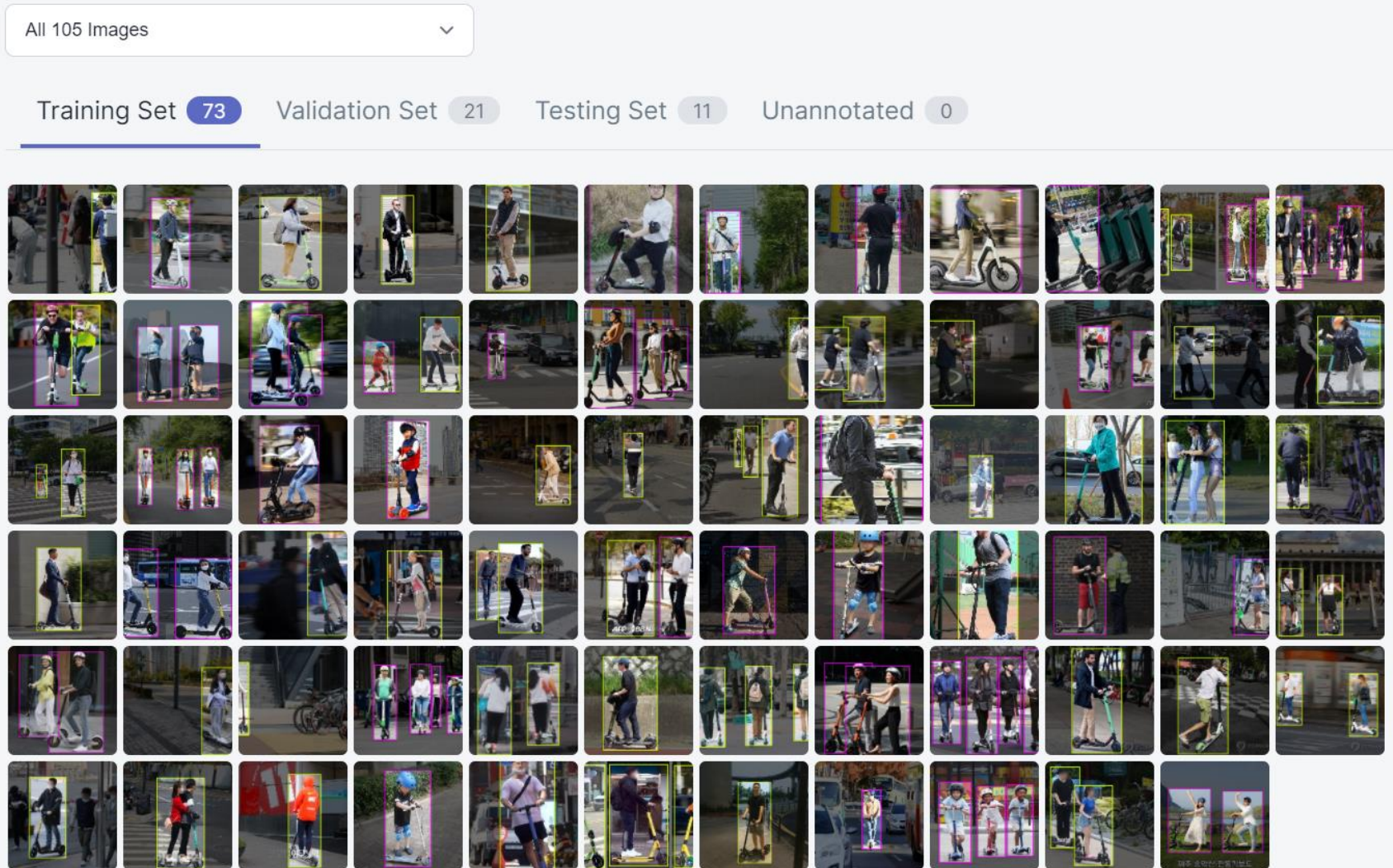
1. 데이터 수집
2. 데이터 어노테이션
3. 데이터 전처리
4. 모델링
5. 추론 / 테스트



# 1. Data

데이터 수집

How? 구글링  
Amount? 105개  
Split? Train/Valid/Test



## 2. Annotation

데이터 어노테이션

Tool? Roboflow  
How? Bounding box  
& Labeling

- helmet
- no-helmet

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Raw Data

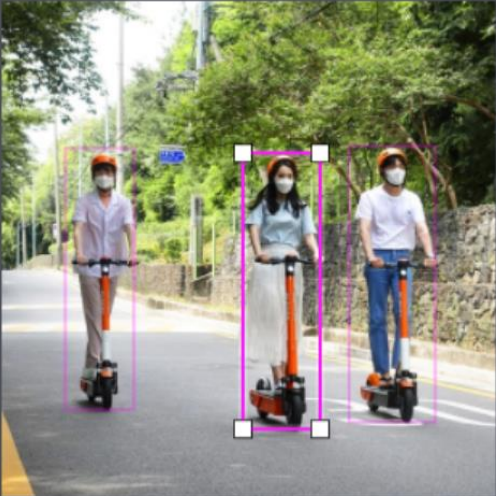
```
{
  "split.vMsIMfyKfagzeal7Q9yR": "train",
  "owner": "Mw25670zb4Zgptg2HpWqbD8Gmmr2",
  "uploader": "Mw25670zb4Zgptg2HpWqbD8Gmmr2",
  "annotations": {
    "Helmet": {
      "converted": "{\\"key\\":\\"0035.jpg\\"\\",
      "lastSet": "1638430705119"
    }
  },
  "accumulator": null,
  "r": 0.3238095238095238,
  "hashes": [
    "4fdabe6b5fc6ec2fe0d22d4ba5d7aa94"
  ],
  "metadata": {
    "no": "metadata"
  },
  "updated": {
    "_seconds": 1637895222,
    "_nanoseconds": 810000000
  },
  "width": 512,
  "extension": "jpg",
  "name": "0035.jpg",
  "height": 512,
  "batches": [
    "vMsIMfyKfagzeal7Q9yR/i10hQN5UR17zY2d9p"
  ]
}
```

helmet

cancel (esc) save (enter)

1 helmet ●

2 no-helmet ●



60%



## 2. Annotation

데이터 어노테이션

헬멧 미착용 객체 예시

● no-helmet



바운딩 박스가 하나인 경우



바운딩 박스가 여러 개인 경우

## 2. Annotation

데이터 어노테이션

헬멧 착용 객체 예시

● helmet



바운딩 박스가 하나인 경우



바운딩 박스가 여러 개인 경우

### 3. Pre- Processing

#### 데이터 전처리

Resize? 416 × 416  
Rotation?  $\pm 30^\circ$   
Shear?  $\pm 15^\circ$  H,V

#### TRAIN / TEST SPLIT

Training Set 87%

**219** images

Validation Set 8%

**21** images

Testing Set 4%

**11** images

Raw image = 73  
3장씩 증폭하여 219개

#### PREPROCESSING

**Auto-Orient:** Applied

**Resize:** Stretch to 416×416

#### AUGMENTATIONS

**Outputs per training example:** 3

**Rotation:** Between  $-30^\circ$  and  $+30^\circ$

**Bounding Box: Shear:**  $\pm 15^\circ$  Horizontal,  $\pm 15^\circ$  Vertical

전처리의 일종, 데이터  
에 인위적인 변화를 줌

## 4. Modeling

### 모델링

Version? YOLO v5  
Release? 20.06.09  
Epoch? 300  
Weight? YOLOv5s

```
1 !python train.py --img 416 --batch 16 --epochs 300 --data /content/datasets/Helmet-detection-3/data.yaml --weights yolov5s.pt --cache
```

Epoch	gpu_mem	box	obj	cls	labels	img_size
299/299	1.55G	0.01578	0.011	0.001689	50	416: 100% 14/14 [00:07<00:00, 1.87it/s]
	Class	Images	Labels	P	R	mAP@.5 mAP@.5:.95: 100% 1/1 [00:00<00:00, 3.84it/s]
	all	21	31	0.664	0.721	0.715 0.457

300 epochs completed in 0.689 hours.

Optimizer stripped from runs/train/exp/weights/last.pt, 14.3MB

Optimizer stripped from runs/train/exp/weights/best.pt, 14.3MB

Validating runs/train/exp/weights/best.pt...

Fusing layers...

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

Class	Images	Labels	P	R	mAP@.5	mAP@.5:.95: 100% 1/1 [00:00<00:00, 3.07it/s]
all	21	31	0.609	0.789	0.746	0.464
helmet	21	12	0.639	1	0.912	0.584
no-helmet	21	19	0.578	0.579	0.579	0.344

Results saved to runs/train/exp

P = precision = 참이라고 예측했을 때, 실제로 참

R = recall = 실제로 참인 것을, 참이라고 예측



Validation data 기준 mAP\* 75% (목표치)

특히, helmet에 대해 Recall 1, mAP 91%

\* 클래스 1개당 AP (Average Precision)을 구하고 클래스의 mean 값을 구한 것

# 4. Modeling

## 모델링

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Epoch? 300  
Weight? Yolov5s

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Validating runs/train/exp/weights/best.pt...

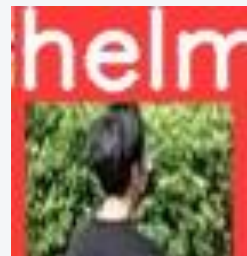
Fusing layers...

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

Class	Images	Labels	P	R	mAP@.5	mAP@.5:.95: 100% 1/1 [00:00<00:00, 3.07it/s]
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helmet	21	12	0.639	1	0.912	0.584
no-helmet	21	19	0.578	0.579	0.579	0.344

Results saved to runs/train/exp

no-helmet 상대적 낮은 이유



음영



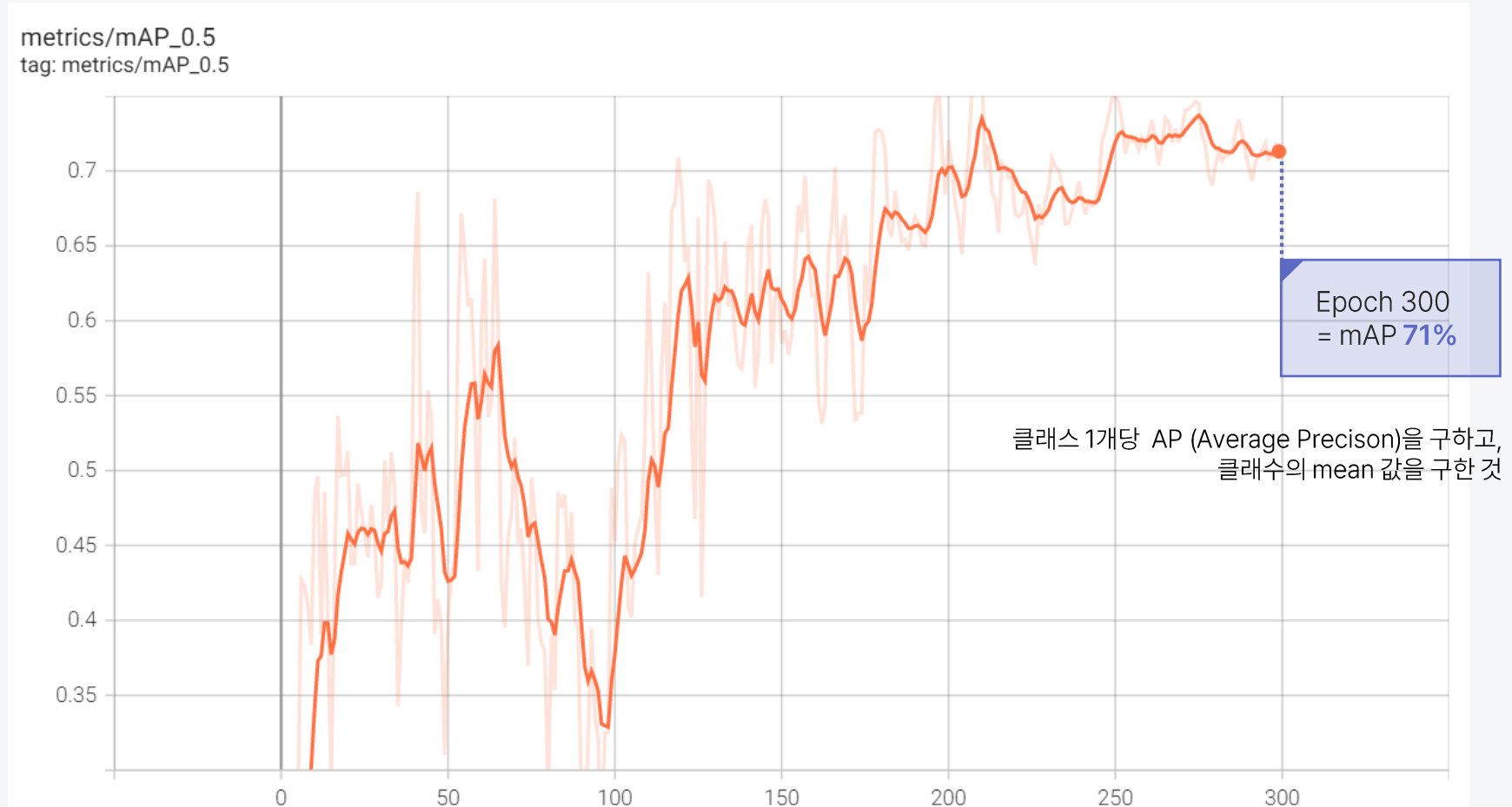
모자



## 4. Modeling

모델링

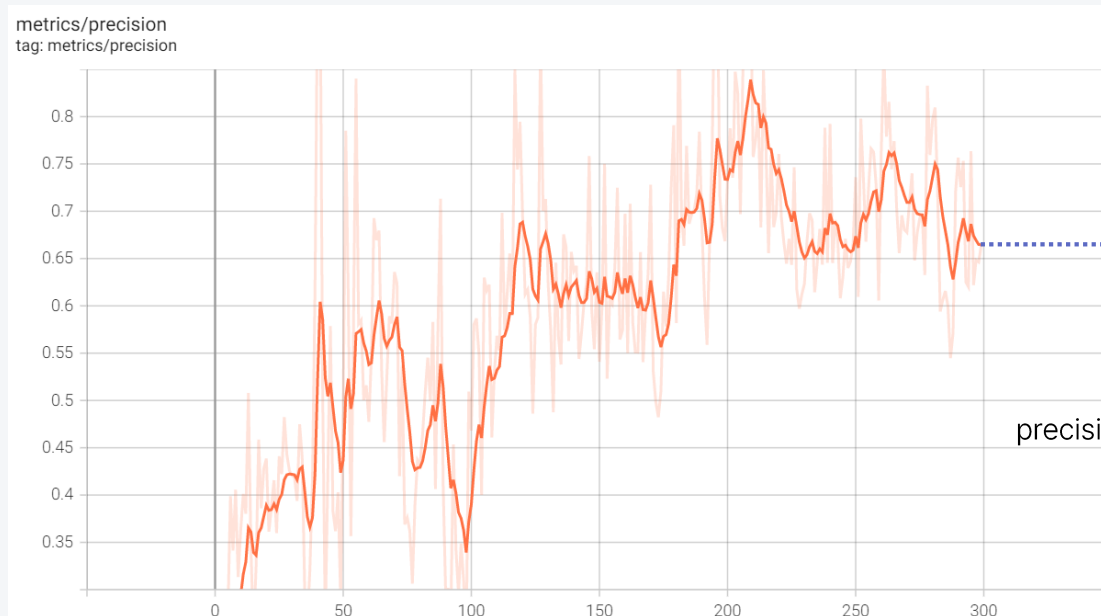
모델 학습 결과  
mAP 71%



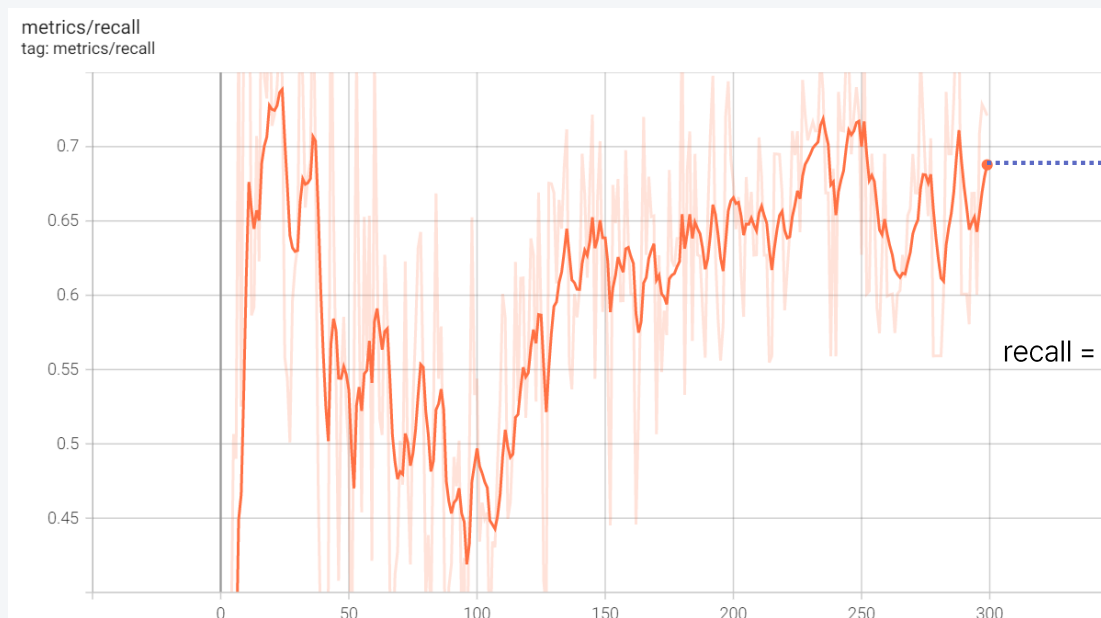
## 4. Modeling

### 모델링

모델 학습 결과  
Precision 66%  
Recall 72%



Epoch 300  
= precision **66%**



Epoch 300  
= recall **72%**

## 5. Inference



추론 / 테스트

Good Case



## 5. Inference

추론 / 테스트

Bad Case





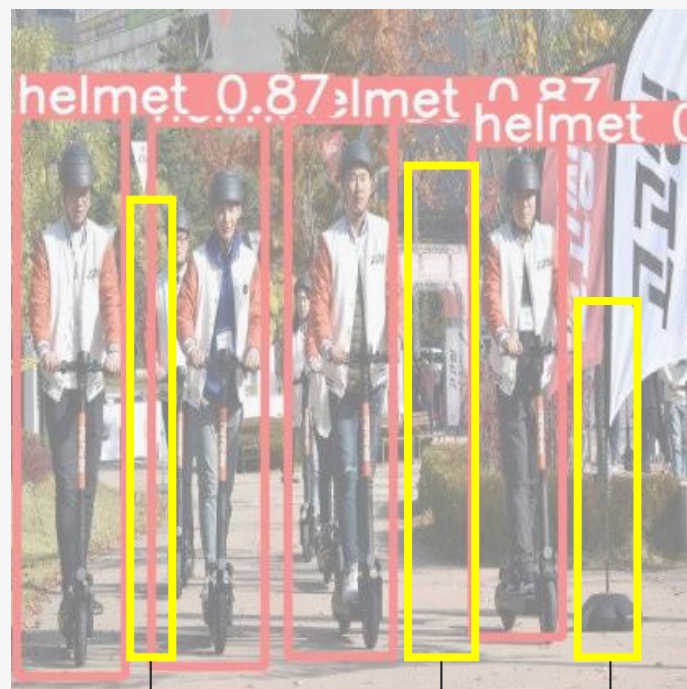
## 5. Inference

추론 / 테스트

개선된 부분

Before

After (현재 최선)



(1) 객체 사이 공백 인식

(2) 비인물 인식 (e.g., 깃대, 나무)