



Google Developer Student Clubs  
Hanyang University

# ML/DL 스터디 발표

2024/04/01

GDSC Server / General 이정재

# YOLO?

## Object Detection

이미지 내에 존재하는 물체를 찾고, 구분하는 기술

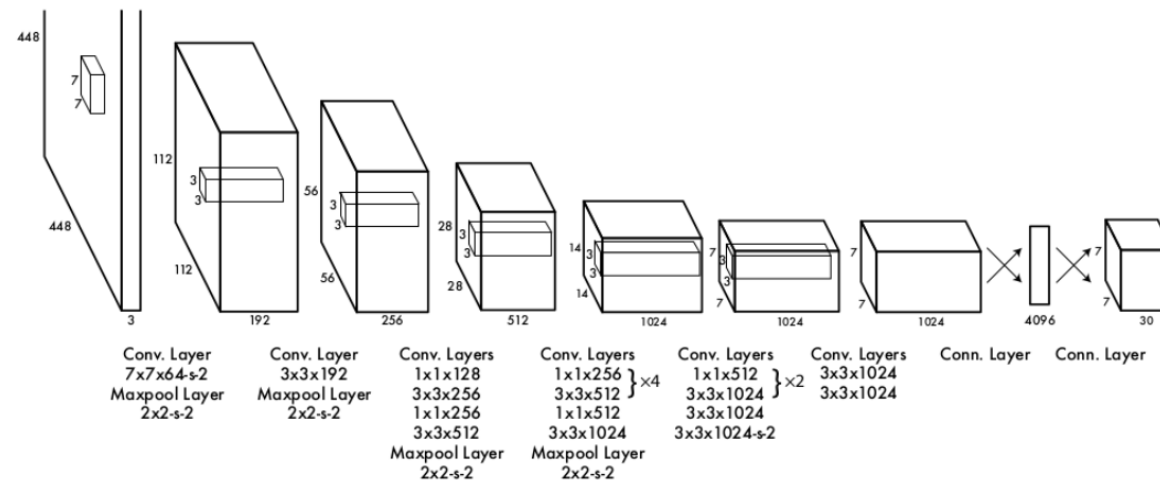
물체 영역의 위치를 Bounding Box로 표시

Box 내 존재하는 물체 : Label로 분류

# YOLO : You Only Look Once

이미지를 한번만 보고 바로 물체를 검출하는 기술

빠른 속도로 Object Detection 수행



**Figure 3: The Architecture.** Our detection network has 24 convolutional layers followed by 2 fully connected layers. Alternating  $1 \times 1$  convolutional layers reduce the feature space from preceding layers. We pretrain the convolutional layers on the ImageNet classification task at half the resolution ( $224 \times 224$  input image) and then double the resolution for detection.

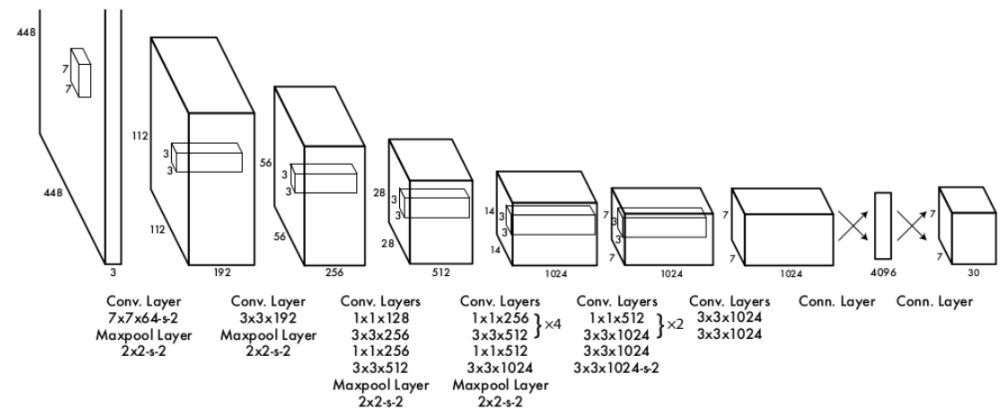
# YOLO : You Only Look Once

# 이미지를 7x7 그리드로 나눠서 분석

## 각 그리드 셀 별로 2개의 Bounding Box 예측

→ 한 장 당 98개의 Bounding Box 예측

→ NMS(Non-Maximum Suppression) 통해 확률값이 높은 예측결과 도출



**Figure 3: The Architecture.** Our detection network has 24 convolutional layers followed by 2 fully connected layers. Alternating  $1 \times 1$  convolutional layers reduce the features space from preceding layers. We pretrain the convolutional layers on the ImageNet classification task at half the resolution ( $224 \times 224$  input image) and then double the resolution for detection.

# GPU 설정

런타임 유형 변경

런타임 유형

Python 3

하드웨어 가속기 ?

☐ CPU

☒ T4 GPU

☐ A100 GPU

☐ V100 GPU

☐ TPU

프리미엄 GPU를 이용하시겠어요? [추가 컴퓨팅 단위 구매](#)

취소

저장

• New [Ka](#)

data.yaml X

```
1 names:
2 - car
3 - free
4 nc: 2
5 roboflow:
6   license: MIT
7   project: real-time-parking-lot-vehicle-detection
8   url: https://universe.roboflow.com/swastik-abhijit-patra-zlamm
9   version: 1
10  workspace: swastik-abhijit-patra-zlamm
11 test: ../test/images
12 train: ../train/images
13 val: ../valid/images
14
```

```
[11] !yolo task=detect mode=train model=/content/yolov8m.pt data={dataset.location}/data.yaml epochs=20 imgsz=640 plots=True
```

Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
1/20	8.28G	1.919	1.649	1.834	55	640: 100% 102/102 [01:06<00:00, 1.53it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:05<00:00, 1.25it/s]
	all	215	6275	0.493	0.407	0.368 0.158
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
2/20	8.19G	1.813	1.364	1.762	171	640: 100% 102/102 [00:56<00:00, 1.80it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.59it/s]
	all	215	6275	0.613	0.553	0.539 0.243
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
3/20	8.5G	1.795	1.376	1.747	74	640: 100% 102/102 [00:56<00:00, 1.80it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.51it/s]
	all	215	6275	0.676	0.661	0.682 0.316
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
4/20	9.33G	1.761	1.314	1.734	25	640: 100% 102/102 [00:56<00:00, 1.80it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.51it/s]
	all	215	6275	0.694	0.695	0.678 0.316
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
5/20	9.87G	1.707	1.262	1.688	83	640: 100% 102/102 [00:55<00:00, 1.83it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.50it/s]
	all	215	6275	0.743	0.712	0.737 0.364
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
6/20	9.48G	1.671	1.217	1.646	122	640: 100% 102/102 [00:56<00:00, 1.81it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.56it/s]
	all	215	6275	0.751	0.784	0.76 0.37
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
7/20	9.77G	1.636	1.177	1.615	160	640: 100% 102/102 [00:55<00:00, 1.84it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.56it/s]
	all	215	6275	0.765	0.768	0.763 0.374

Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
8/20	9.01G	1.596	1.109	1.59	54	640: 100% 102/102 [00:56<00:00, 1.81it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.60it/s]
	all	215	6275	0.765	0.77	0.784 0.392

Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
9/20	9.06G	1.567	1.048	1.571	130	640: 100% 102/102 [00:55<00:00, 1.82it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.56it/s]
	all	215	6275	0.779	0.797	0.803 0.405

Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
10/20	8.33G	1.532	1.02	1.549	47	640: 100% 102/102 [00:55<00:00, 1.83it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.61it/s]
	all	215	6275	0.802	0.806	0.823 0.451

Closing dataloader mosaic

**augmentations:** Blur(p=0.01, blur\_limit=(3, 7)), MedianBlur(p=0.01, blur\_limit=(3, 7)), ToGray(p=0.01), CLAHE(p=0.01, clip\_li

Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
11/20	7.72G	1.524	0.9791	1.595	18	640: 100% 102/102 [01:01<00:00, 1.67it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:03<00:00, 1.78it/s]
	all	215	6275	0.801	0.824	0.839 0.451

Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
12/20	8.33G	1.493	0.9478	1.588	56	640: 100% 102/102 [00:54<00:00, 1.88it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.64it/s]
	all	215	6275	0.814	0.822	0.857 0.461

Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size
13/20	8.82G	1.458	0.8749	1.55	33	640: 100% 102/102 [00:53<00:00, 1.89it/s]
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.64it/s]
	all	215	6275	0.819	0.84	0.864 0.466



Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size	↑	↓	↺	☰	⚙	📄	🗑
14/20	9.04G	1.458	0.8482	1.548	41	640: 100% 102/102 [00:53<00:00, 1.69it/s]							
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.73it/s]							
	all	215	6275	0.837	0.847	0.877 0.482							
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size							
15/20	8.32G	1.394	0.8104	1.503	23	640: 100% 102/102 [00:53<00:00, 1.89it/s]							
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:03<00:00, 1.82it/s]							
	all	215	6275	0.842	0.859	0.894 0.52							
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size							
16/20	8.31G	1.358	0.7596	1.471	66	640: 100% 102/102 [00:54<00:00, 1.88it/s]							
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:03<00:00, 1.81it/s]							
	all	215	6275	0.85	0.871	0.904 0.526							
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size							
17/20	9.01G	1.312	0.7293	1.451	60	640: 100% 102/102 [00:54<00:00, 1.88it/s]							
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:03<00:00, 1.84it/s]							
	all	215	6275	0.855	0.872	0.898 0.537							
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size							
18/20	9G	1.279	0.6949	1.422	47	640: 100% 102/102 [00:54<00:00, 1.89it/s]							
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:04<00:00, 1.56it/s]							
	all	215	6275	0.864	0.876	0.895 0.529							
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size							
19/20	8.77G	1.23	0.6562	1.39	45	640: 100% 102/102 [00:54<00:00, 1.89it/s]							
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:03<00:00, 1.76it/s]							
	all	215	6275	0.877	0.882	0.928 0.579							
Epoch	GPU_mem	box_loss	cls_loss	dfl_loss	Instances	Size							
20/20	8.1G	1.188	0.6348	1.362	18	640: 100% 102/102 [00:54<00:00, 1.89it/s]							
	Class	Images	Instances	Box(P	R	mAP50 mAP50-95): 100% 7/7 [00:03<00:00, 1.83it/s]							
	all	215	6275	0.873	0.894	0.926 0.58							

# 학습 모델 결과

```
20 epochs completed in 0.350 hours.
Optimizer stripped from runs/detect/train/weights/last.pt, 52.0MB
Optimizer stripped from runs/detect/train/weights/best.pt, 52.0MB

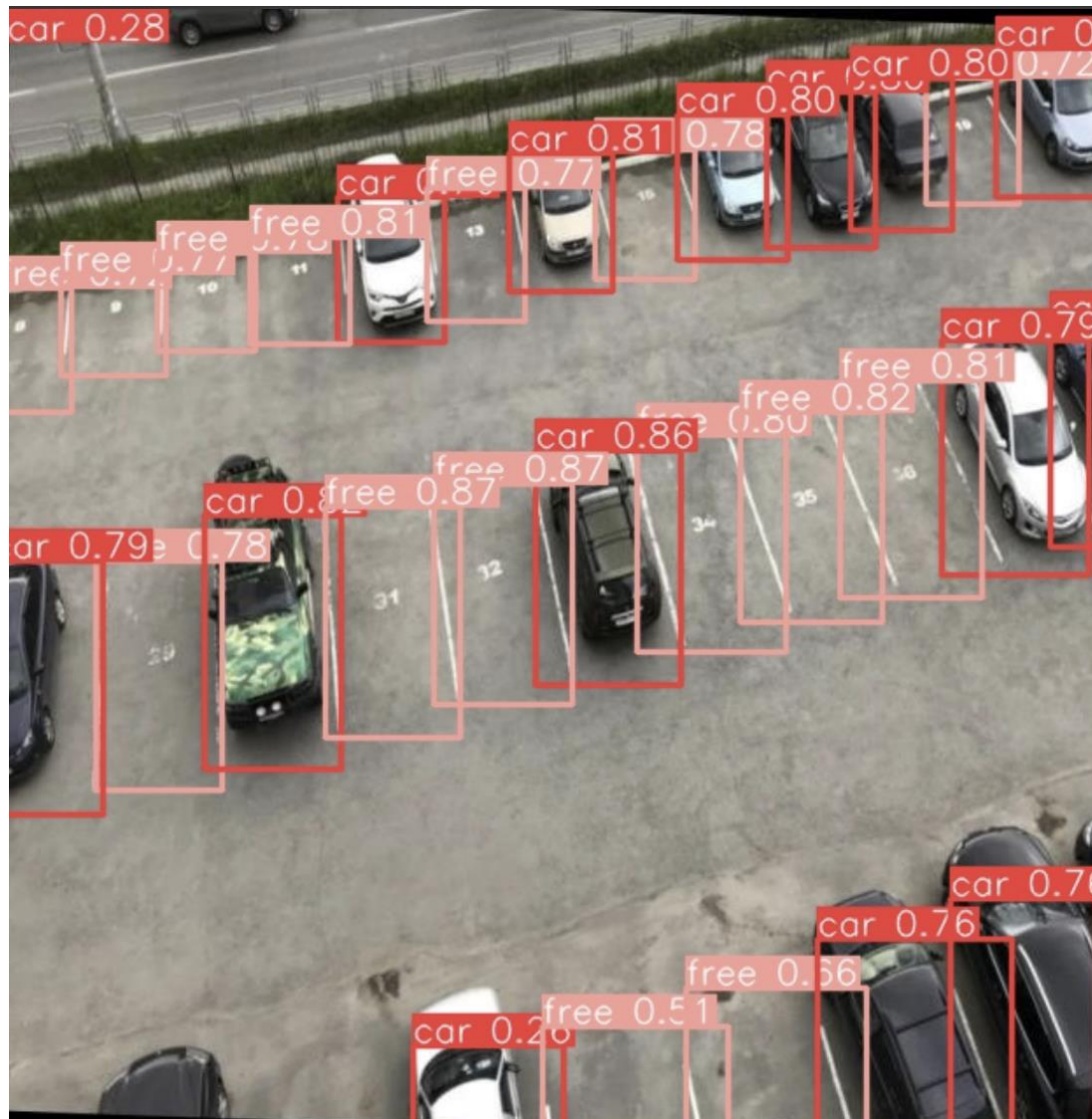
Validating runs/detect/train/weights/best.pt...
Ultralytics YOLOv8.0.196 🚀 Python-3.10.12 torch-2.2.1+cu121 CUDA:0 (Tesla T4, 15102MiB)
Model summary (fused): 218 layers, 25840918 parameters, 0 gradients, 78.7 GFLOPs
```

Class	Images	Instances	Box(P	R	mAP50	mAP50-95): 100% 7/7 [00:21<00:00, 3.14s/it]
all	215	6275	0.873	0.894	0.925	0.58
car	215	3680	0.934	0.919	0.965	0.613
free	215	2595	0.812	0.869	0.886	0.547

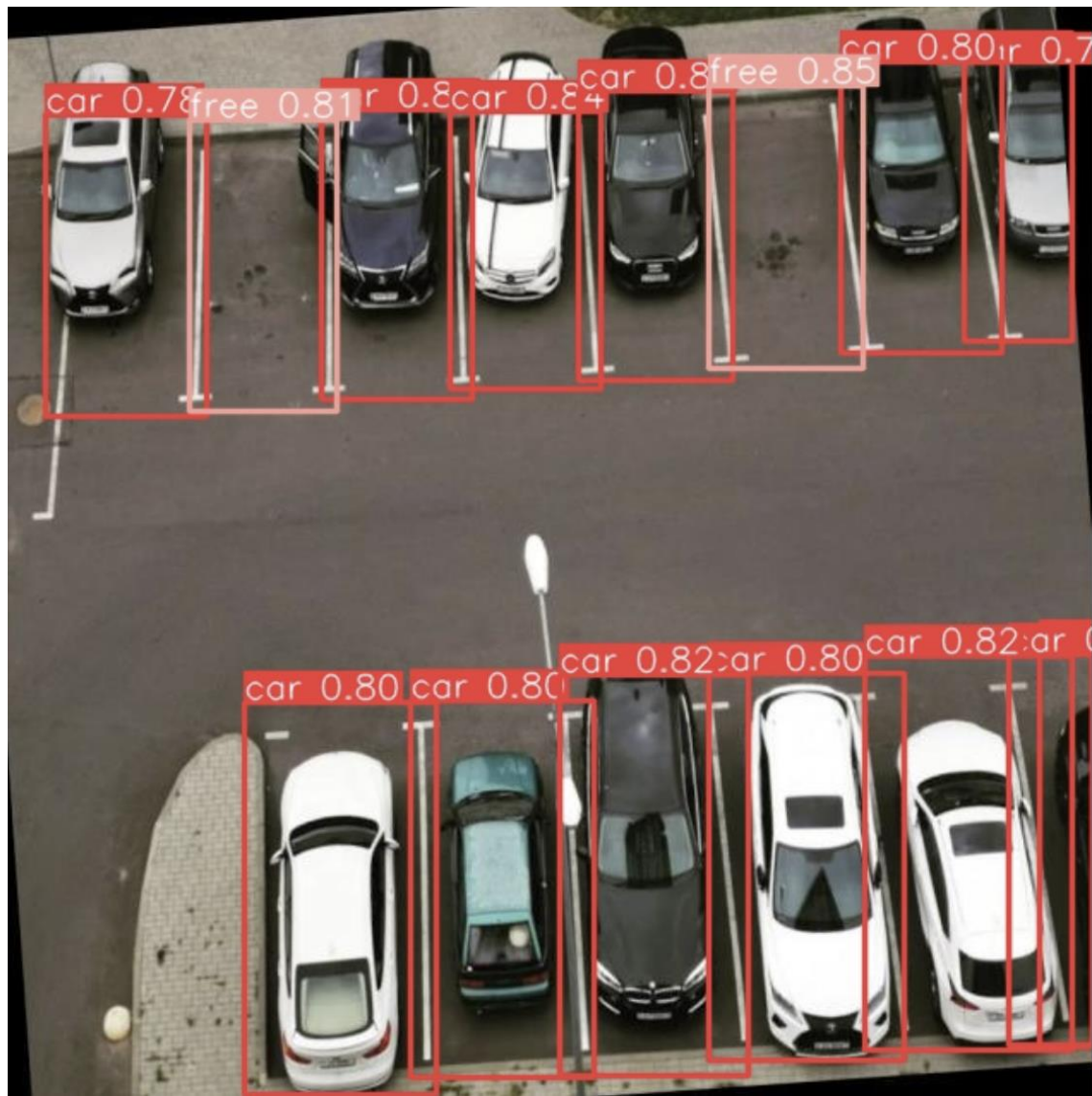
```
Speed: 1.0ms preprocess, 11.2ms inference, 0.1ms loss, 4.2ms postprocess per image
Results saved to runs/detect/train
💡 Learn more at https://docs.ultralytics.com/modes/train
```

60.0  
mAP  
이상

# 학습 모델 추론



# 학습 모델 추론





# 학습 모델 추론



**감사합니다!**