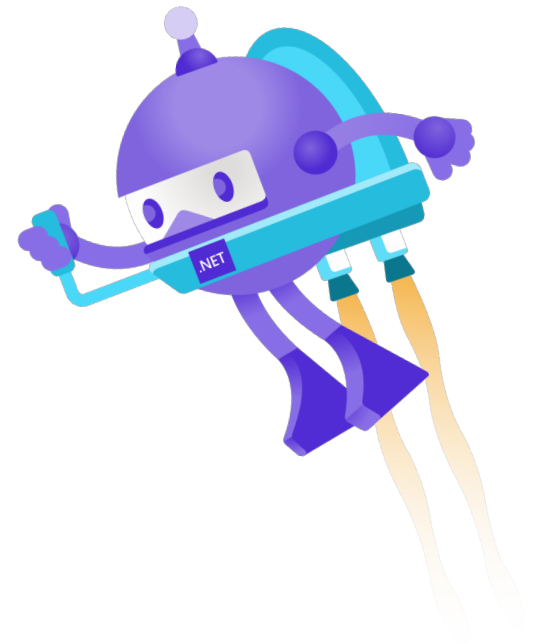


# Deep Learning with ML.NET

Clemente Giorio  
Gianni Rosa Gallina

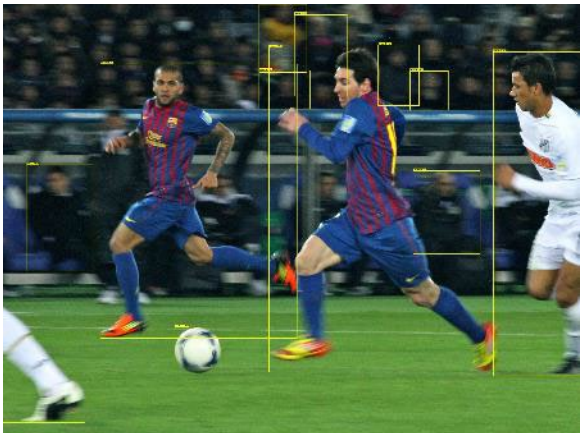
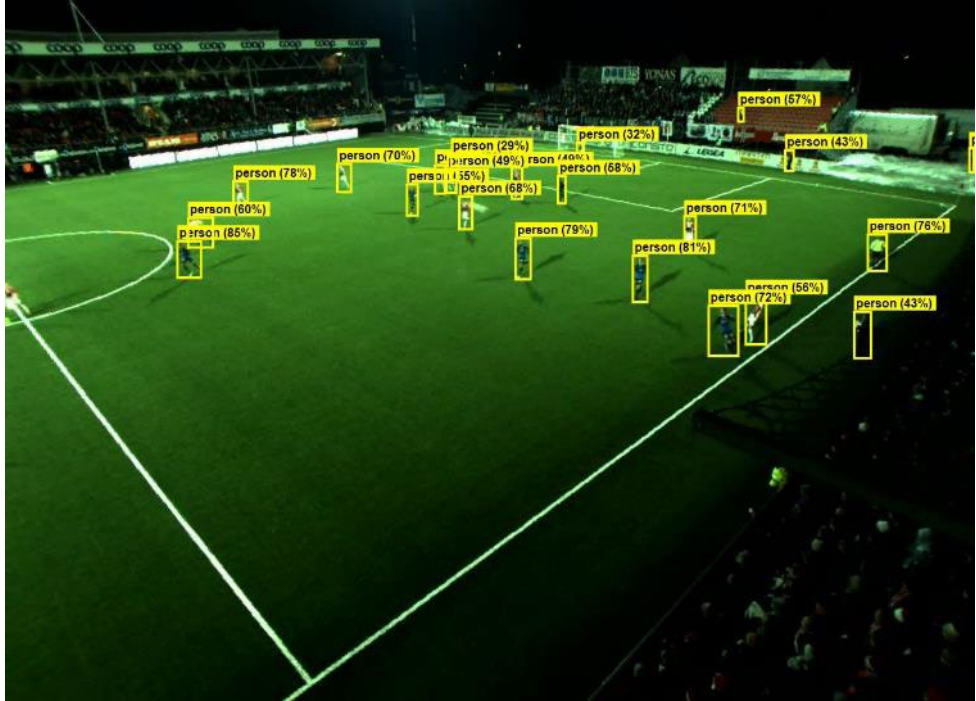
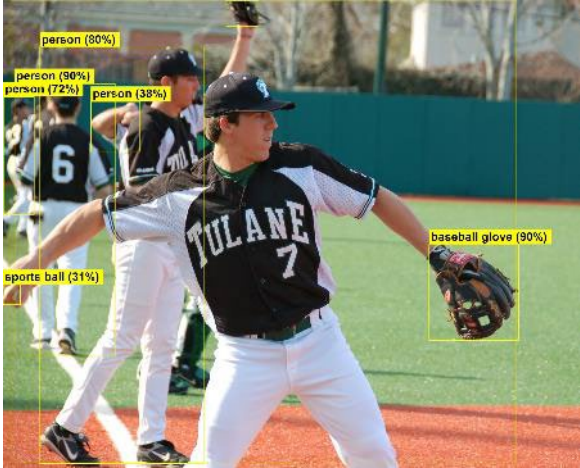
**deltatre**



# SPONSOR

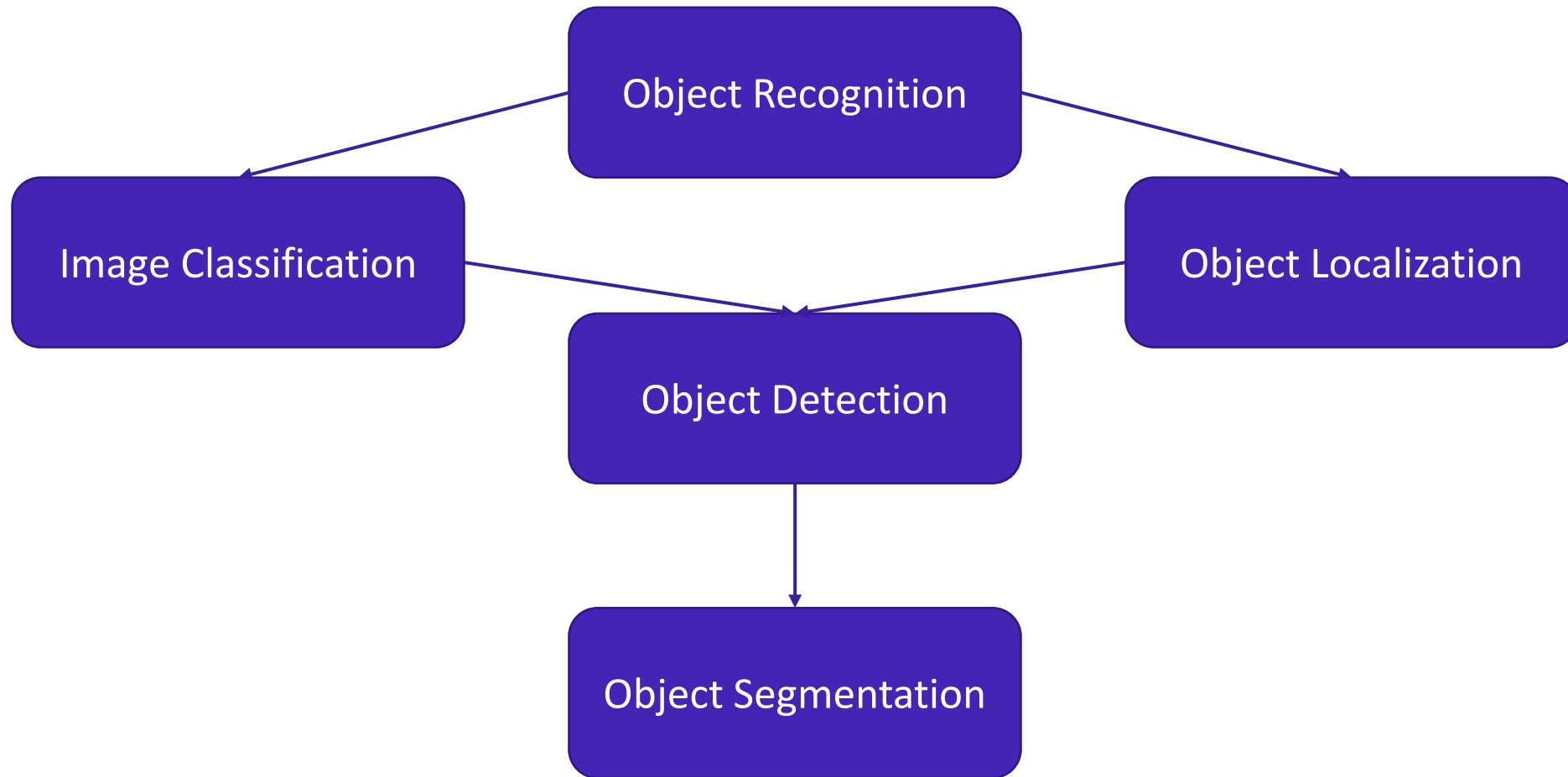


# Object Detection



Source: Images from wikimedia

# Overview of Object Detection Vision Task





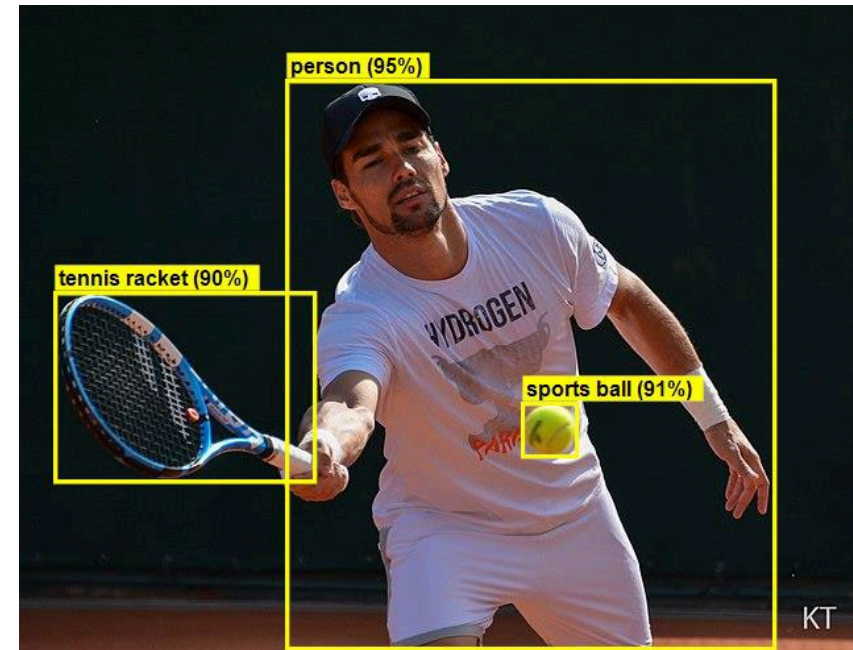
# Overview of Object Detection Vision Task

## Image Classification



Output:  
Class – Person

## Object Detection



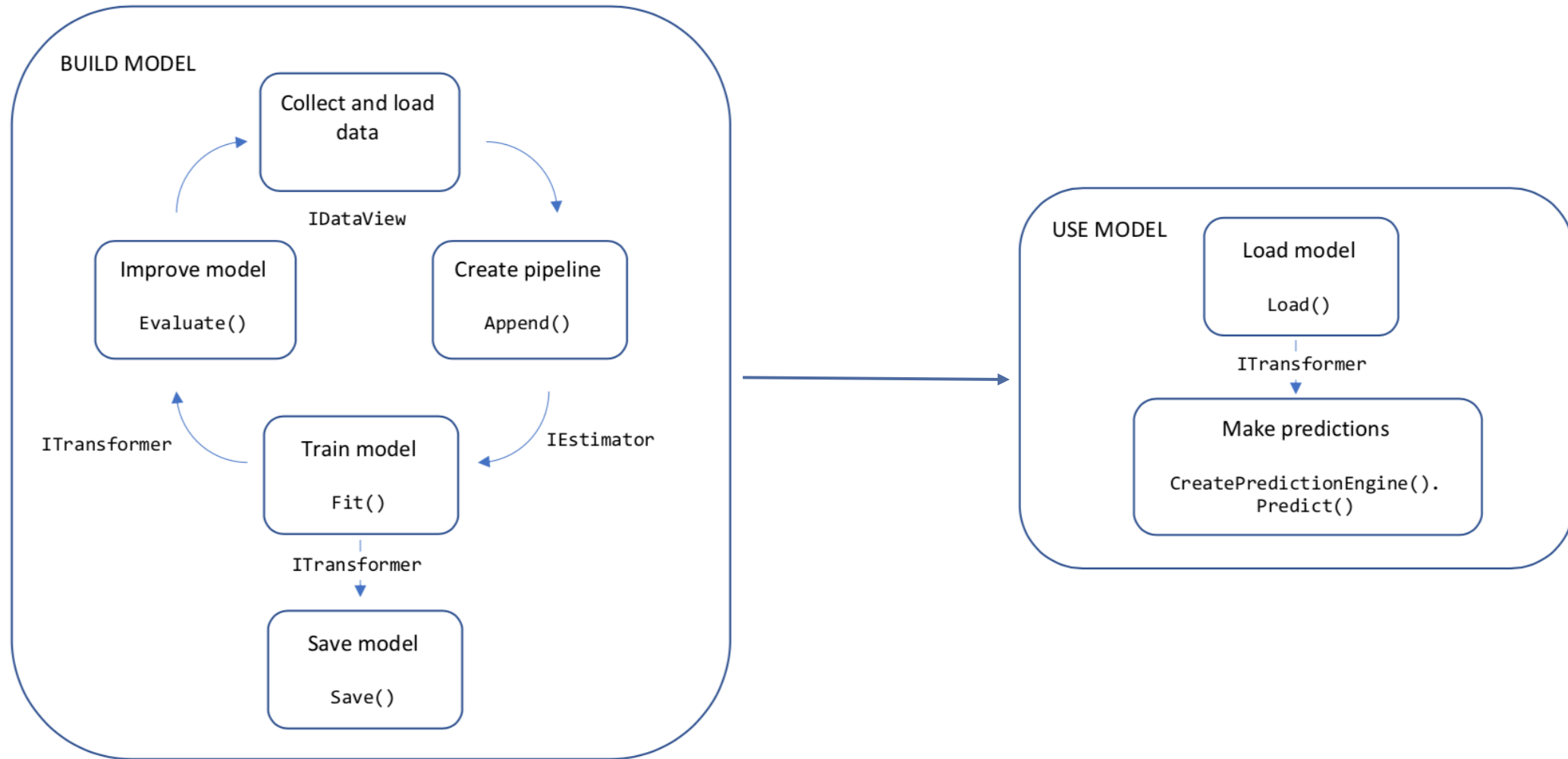
Output:  
Bounding box – pc,x,y,w,h  
Class – Person, Sports Ball, Tennis Racket  
Confidence – 0.95, 0.91, 0.90

Source: Images from wikimedia

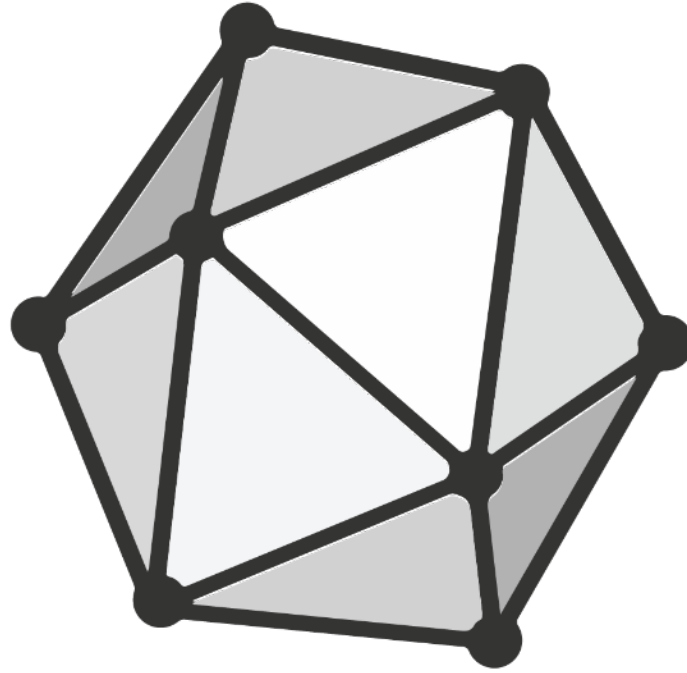
# What is ML.NET and how does it work?



# Code workflow



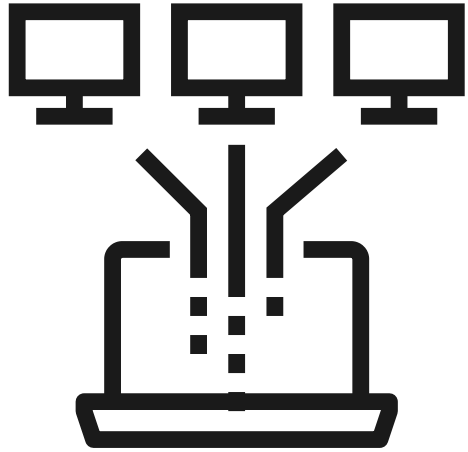
ONNX



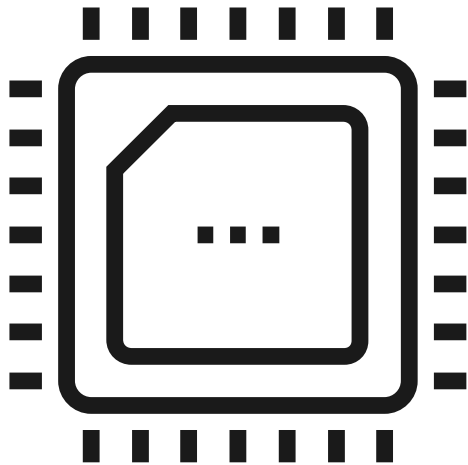
ONNX



# ONNX – Key Benefits

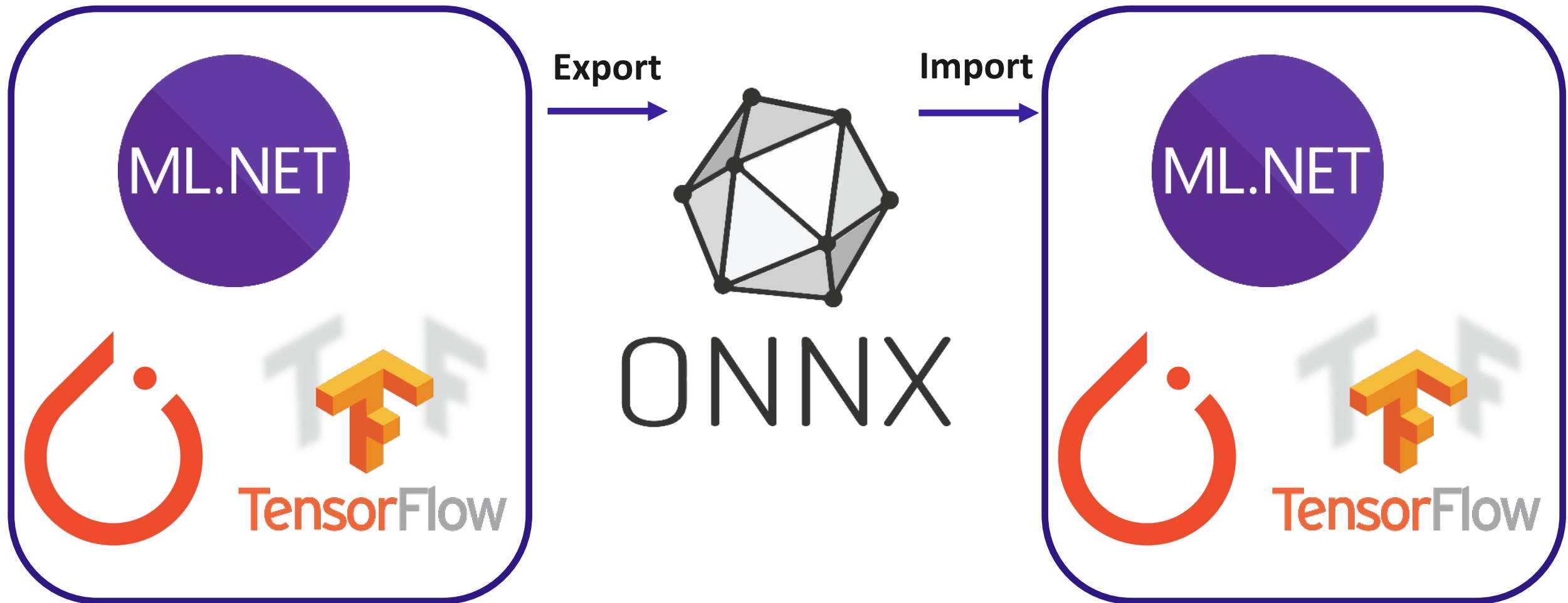


Interoperability

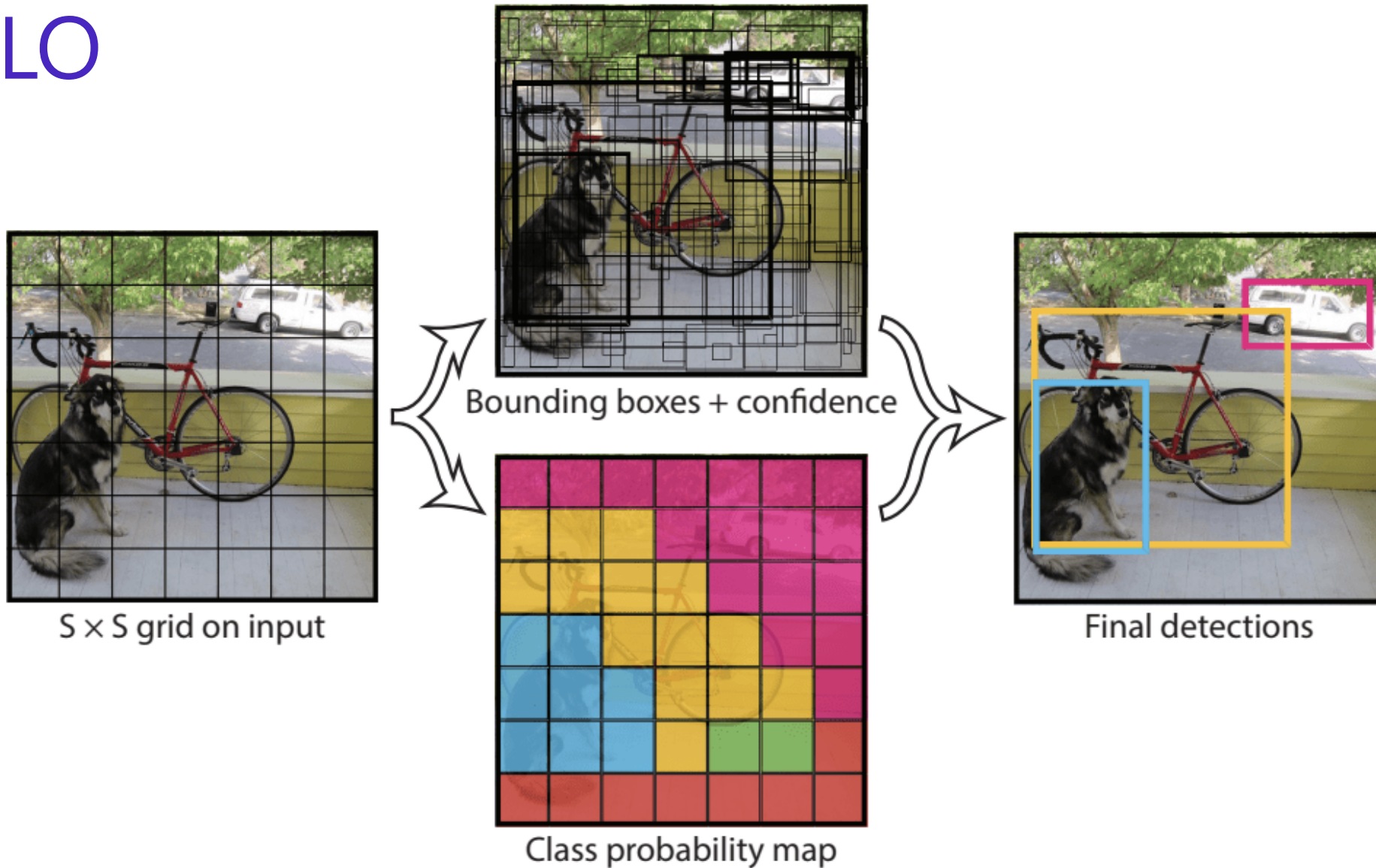


Hardware Access

# ONNX

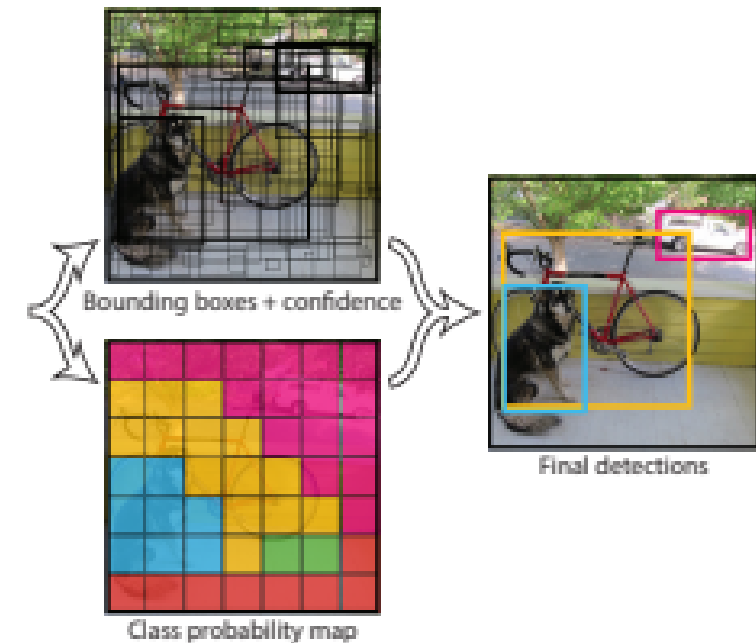
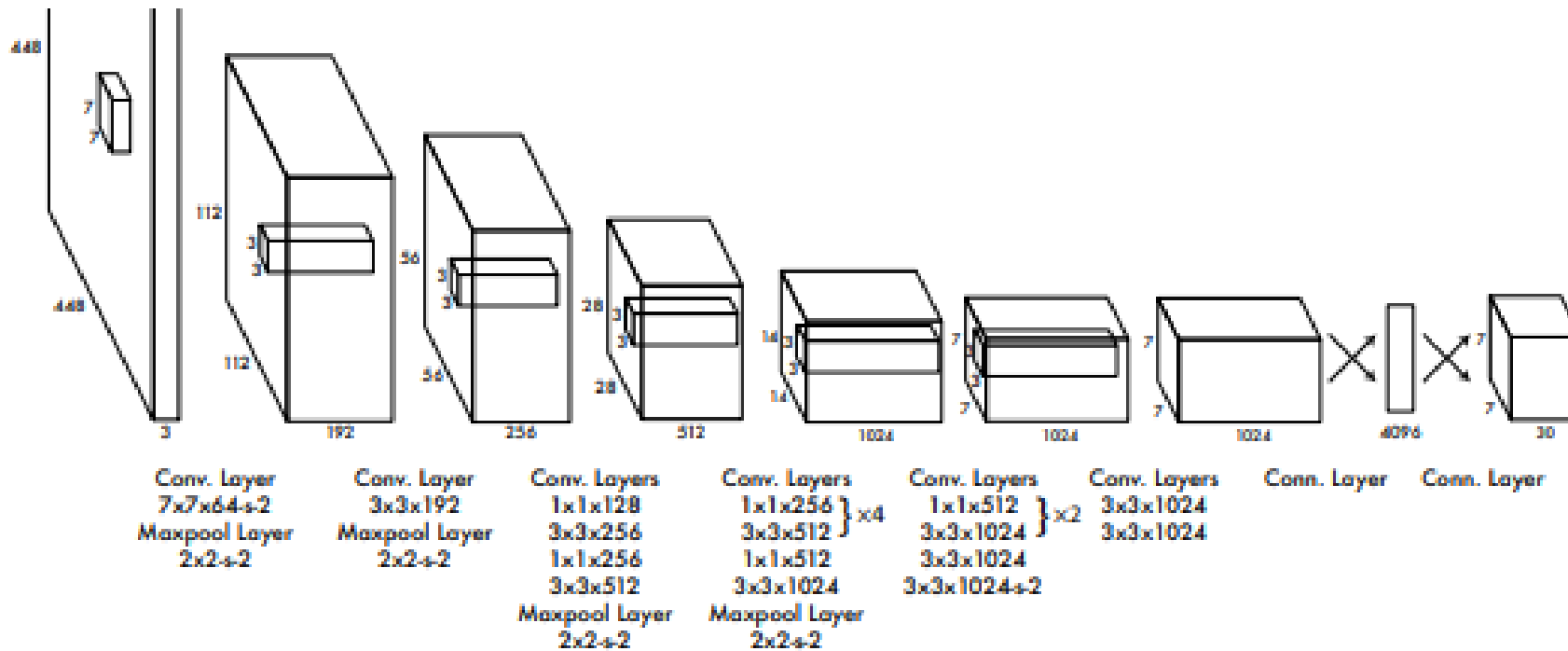


# YOLO



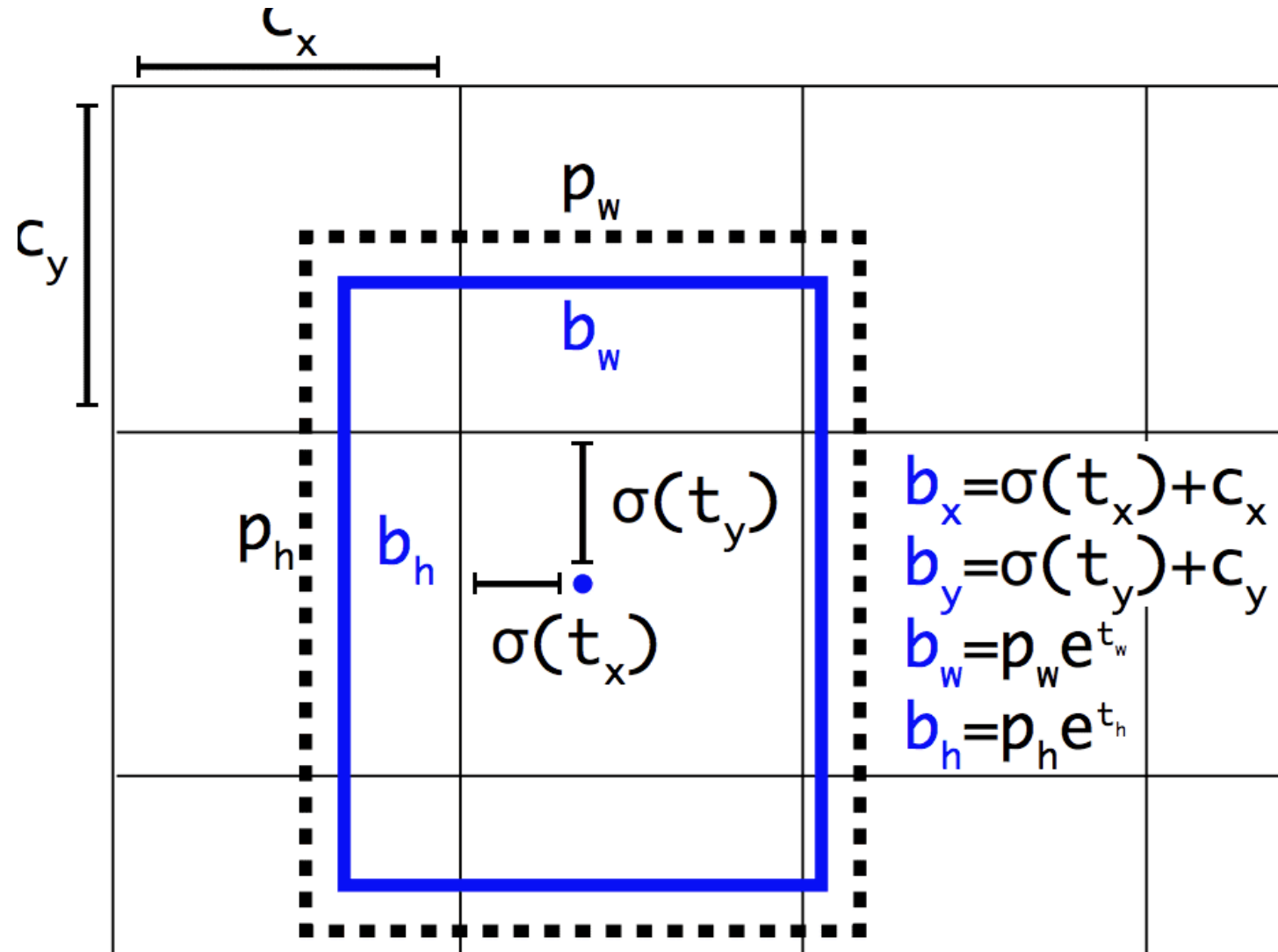
Summary of Predictions made by YOLO Model. Taken from: You Only Look Once: Unified, Real-Time Object Detection

# YOLO

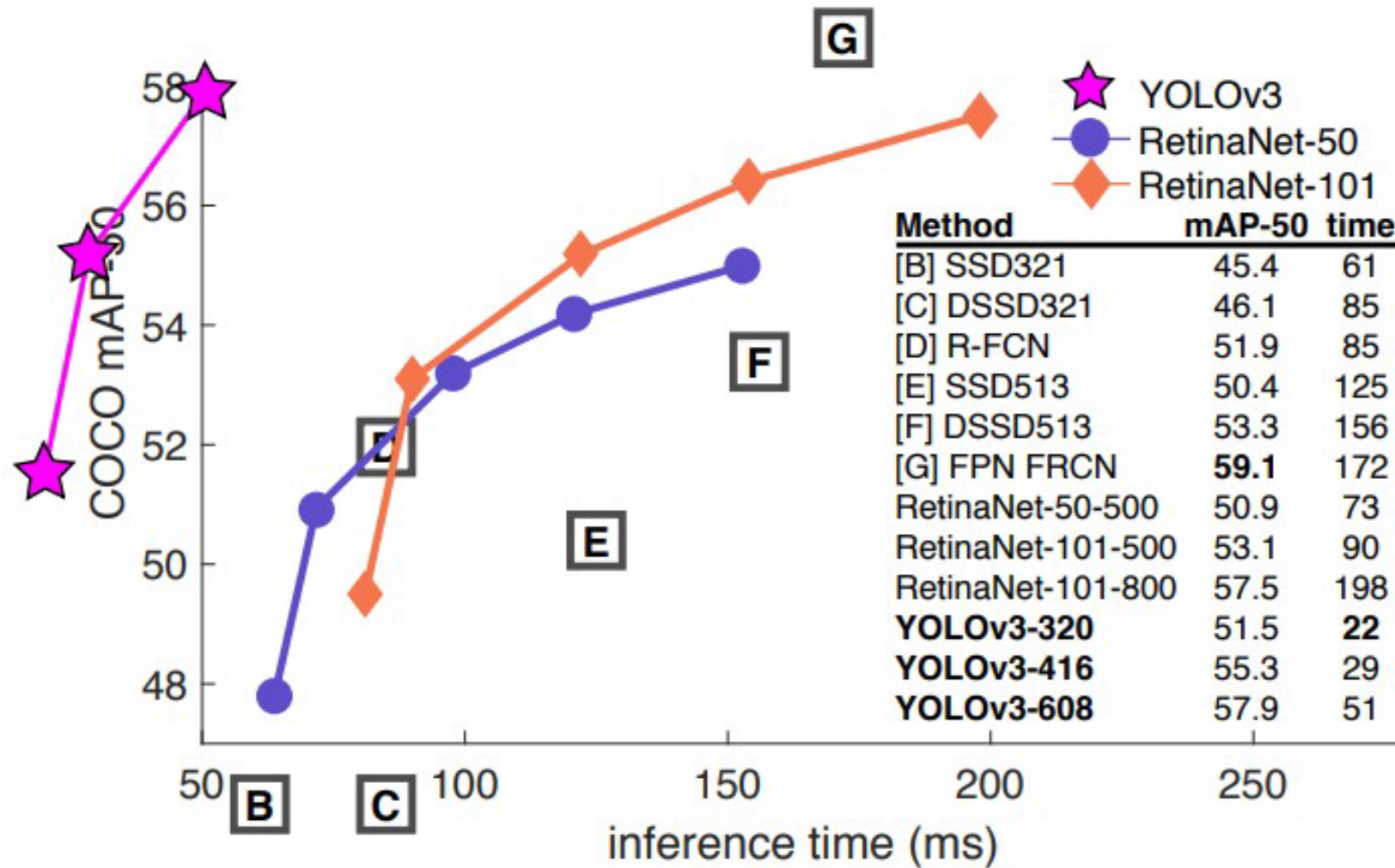


Summary of Predictions made by YOLO Model.Taken from: You Only Look Once: Unified, Real-Time Object Detection

# YOLO

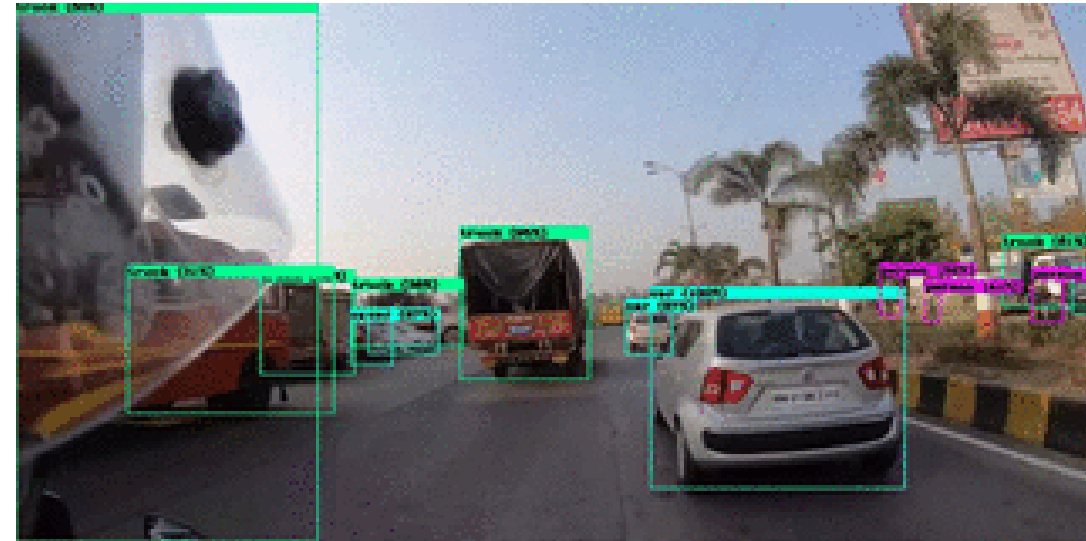
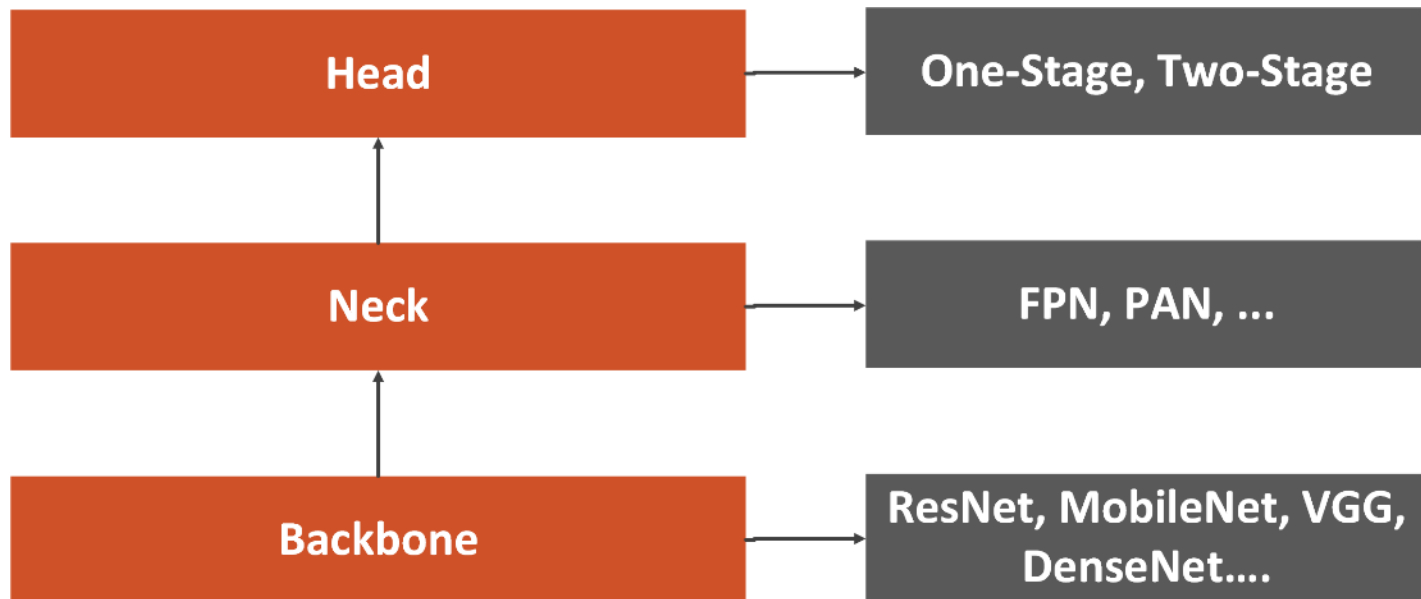


# YOLO

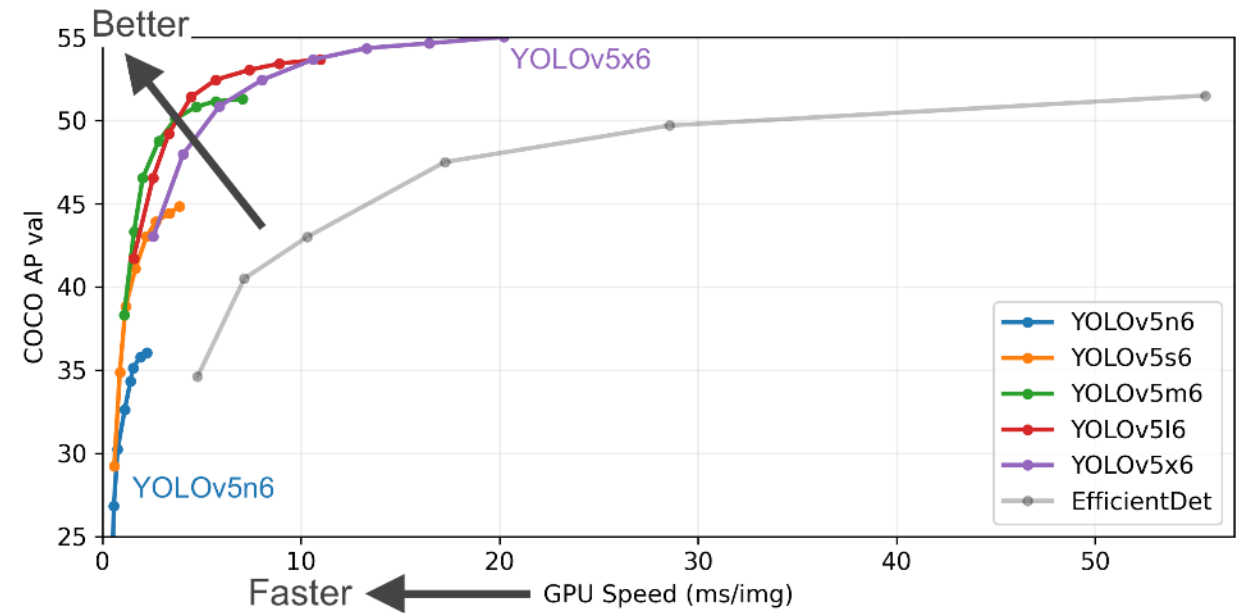
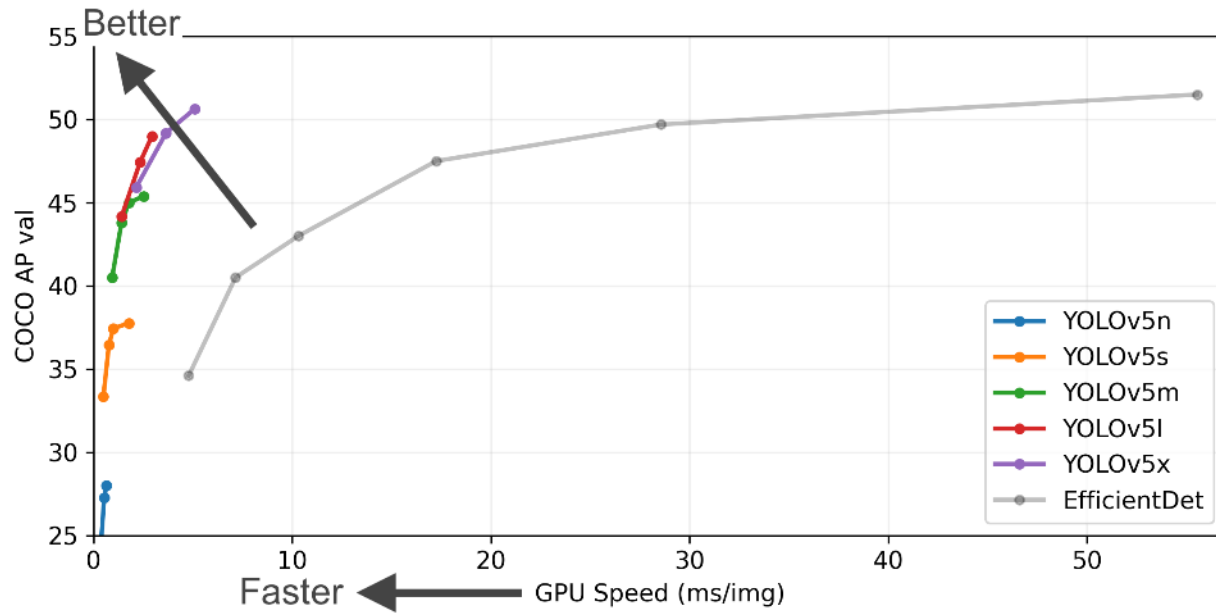




# YOLO



# YOLOv5

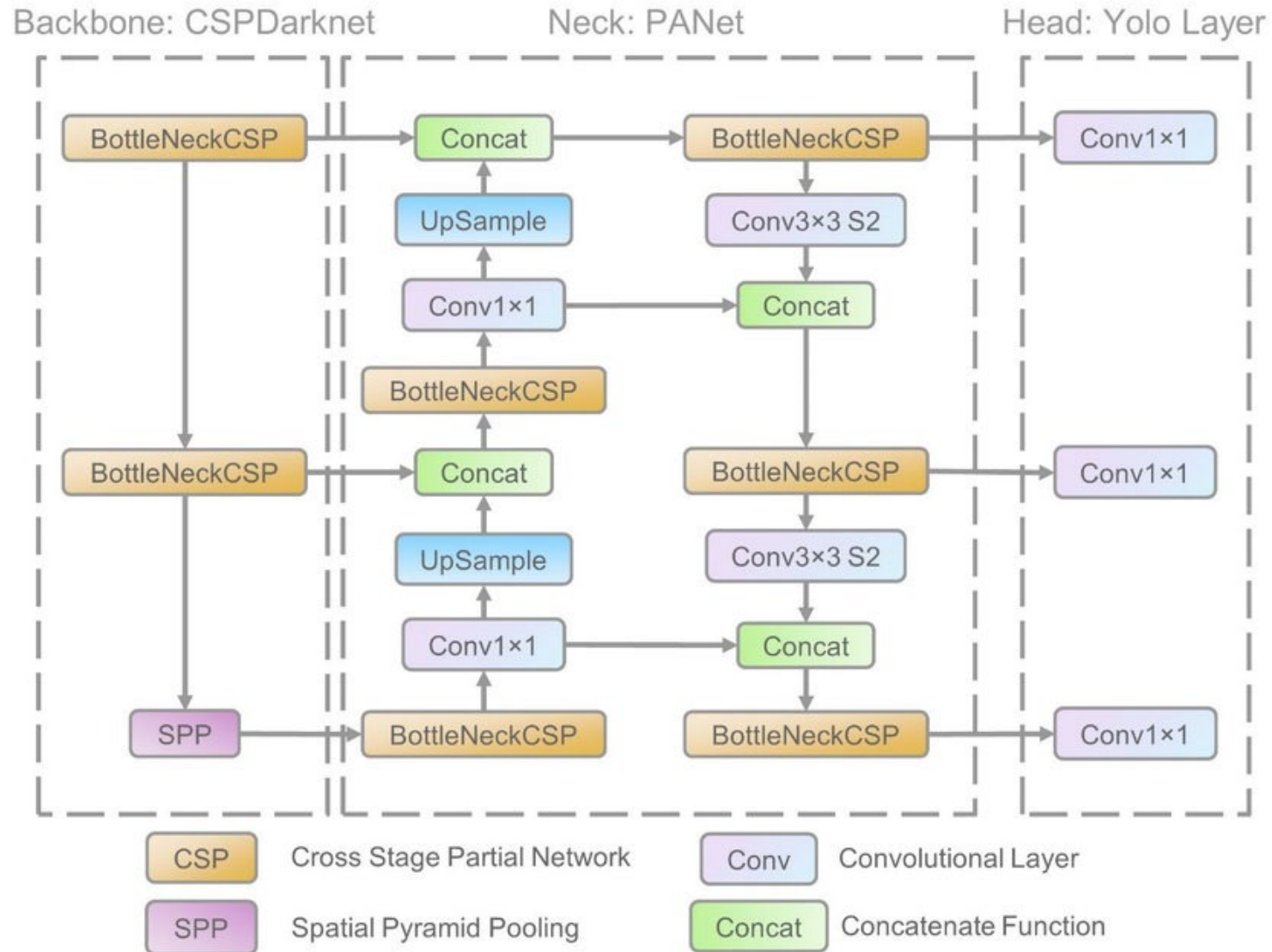


# YOLOv5 – Pretrained Checkpoints

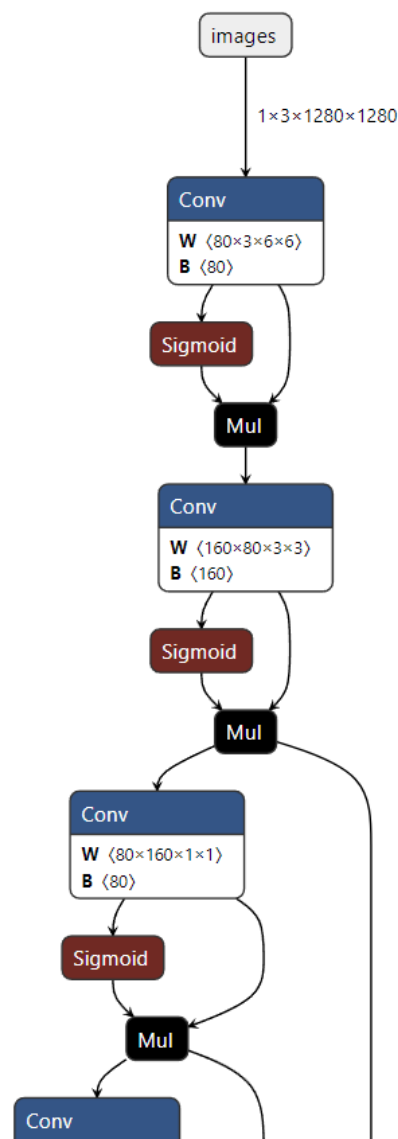
Model	size (pixels)	mAP <sup>val</sup> 0.5:0.95	mAP <sup>val</sup> 0.5	Speed CPU b1 (ms)	Speed V100 b1 (ms)	Speed V100 b32 (ms)	params (M)	FLOPs @640 (B)
YOLOv5n	640	28.0	45.7	45	6.3	0.6	1.9	4.5
YOLOv5s	640	37.4	56.8	98	6.4	0.9	7.2	16.5
YOLOv5m	640	45.4	64.1	224	8.2	1.7	21.2	49.0
YOLOv5l	640	49.0	67.3	430	10.1	2.7	46.5	109.1
YOLOv5x	640	50.7	68.9	766	12.1	4.8	86.7	205.7
YOLOv5n6	1280	36.0	54.4	153	8.1	2.1	3.2	4.6
YOLOv5s6	1280	44.8	63.7	385	8.2	3.6	12.6	16.8
YOLOv5m6	1280	51.3	69.3	887	11.1	6.8	35.7	50.0
YOLOv5l6	1280	53.7	71.3	1784	15.8	10.5	76.8	111.4
YOLOv5x6	1280	55.0	72.7	3136	26.2	19.4	140.7	209.8
+ TTA	1536	55.8	72.7	-	-	-	-	-

<https://github.com/ultralytics/yolov5>

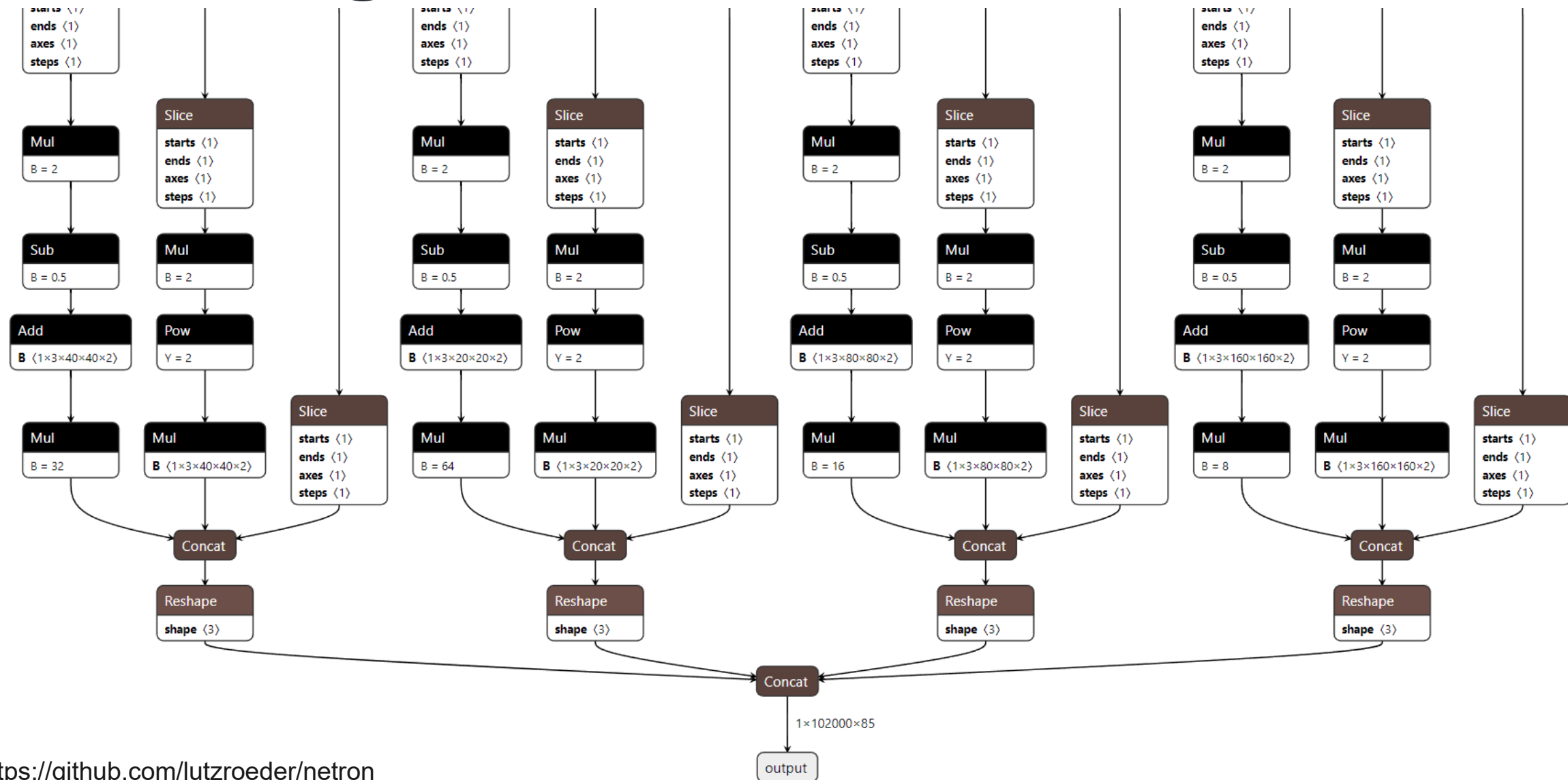
# YOLOv5x6



# NETRON



# NETRON





# Demo

**.NET 6.0**

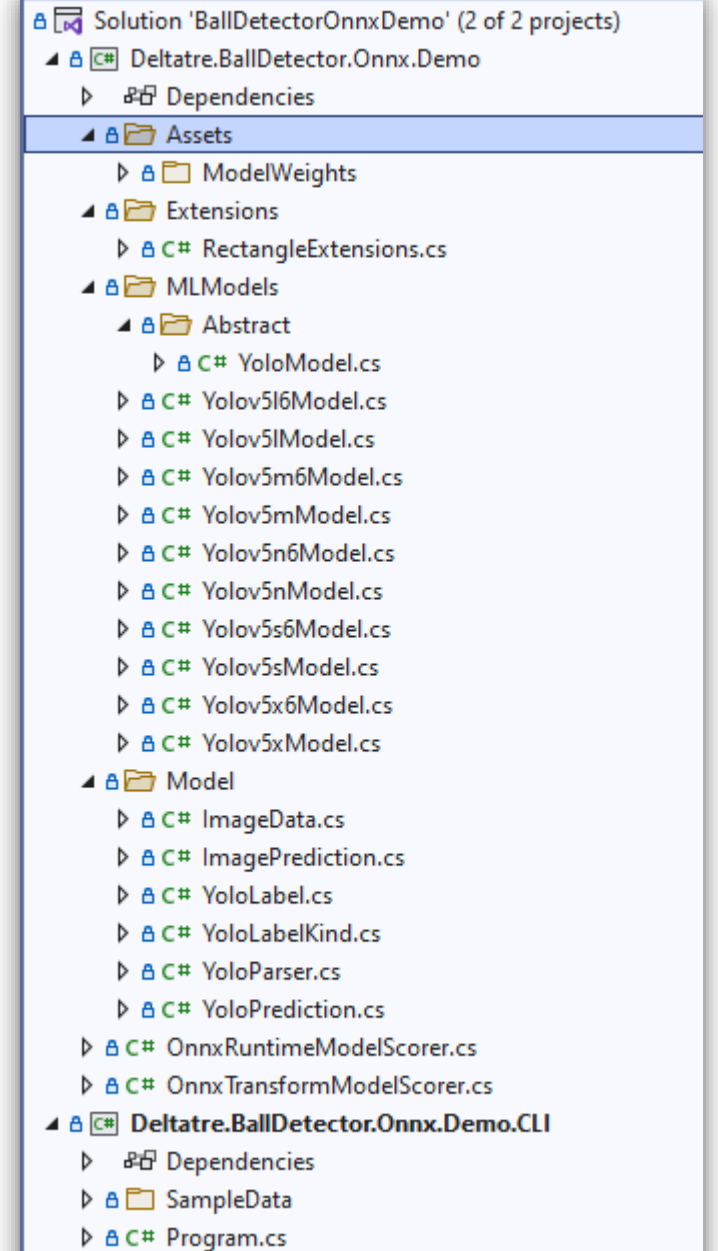
**ML.NET**

**IMAGE  
ANALYTICS**

**ONNX  
TRANSFORMER**



**ONNX MODEL**



# Other Frameworks



TorchSharp: <https://github.com/dotnet/TorchSharp>

TensorFlow.NET: <https://github.com/SciSharp/TensorFlow.NET>

# Training-Fine Tuning



# Demo - Training

**.NET 6.0**

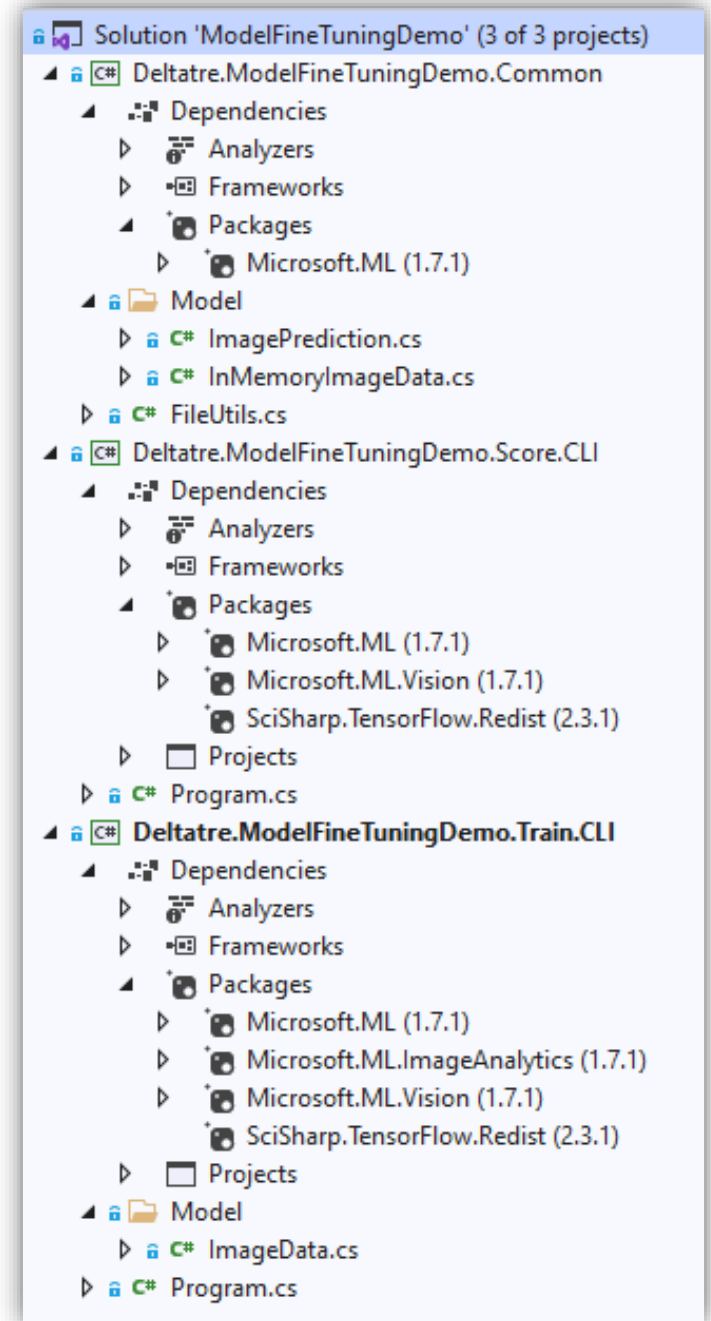


**IMAGE  
ANALYTICS**

**CLASSIFICATION  
TRAINER/SCORER**



**MODEL**



# Thank You!

ευχαριστώ    Salamat Po    متشكراً    شكراً    Grazie

благодаря    ありがとうございます    Kiitos    Teşekkürler    谢谢

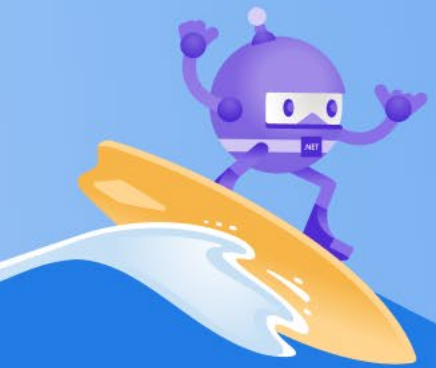
ໂອນຄຸນຄຳ    Obrigado    شكریه    Terima Kasih    Dziękuję

Hvala    Köszönöm    Tak    Dank u wel    ДЯКУЮ    Tack

Mulțumesc    спасибо    Danke    Cám ơn    Gracias

多謝晒    Ďakujem    תודה    நன்றி    Děkuji    감사합니다

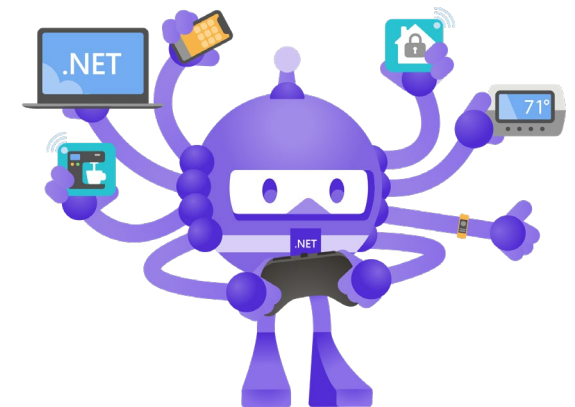
# Questions?





# Useful links

- <https://github.com/deltatrelabs/deltatre-net-conf-2022-mlnet>
- <https://github.com/ultralytics/yolov5/releases>
- <https://github.com/lutzroeder/netron>
- <https://github.com/daquexian/onnx-simplifier>
- <https://docs.microsoft.com/en-us/dotnet/machine-learning/tutorials/image-classification>
- <https://docs.microsoft.com/en-us/dotnet/machine-learning/tutorials/object-detection-onnx>
- <https://pytorch.org/>
- <https://www.tensorflow.org/>
- <https://github.com/dotnet/TorchSharp>
- <https://github.com/SciSharp/TensorFlow.NET>
- <https://docs.microsoft.com/en-us/dotnet/machine-learning/>



# About us



**Clemente Giorio**

R&D Senior Software Engineer @ **deltatre**



- Augmented/Mixed/Virtual Reality
- Artificial Intelligence, Machine Learning, Deep Learning
- Internet of Things
- Hybrid Clusters
- Multimodal Tracking



# About us



Ing. Gianni ROSA GALLINA  
R&D Technical Lead @ **deltatre**



- AI, Machine Learning, Deep Learning on multimedia content
- Virtual/Augmented/Mixed Reality
- Immersive video streaming & 3D graphics for sport events
- Cloud solutions, web backends, serverless, video workflows
- Mobile apps dev (Windows / Android / Xamarin)
- End-to-end solutions with Microsoft Azure

**Microsoft**  
Specialist

Programming in C#  
Programming in HTML5  
with JavaScript & CSS3

**Microsoft**  
**CERTIFIED**

Solutions Developer  
Windows Store Apps Using C#  
Web Applications



PLURALSIGHT

Author



<https://gianni.rosagallina.com/en/>



# SPONSOR

