


YOLO for impact detection in Ice Hockey.

Muhammad Sohaib Arif



Problem Description: Concussions in Ice Hockey

Ice Hockey is a very fast game.

Players might be moving at speeds above 30 kilometers per hour

Ice Hockey has the highest rate for concussions in any contact sport

Concussions have become a topic of considerable interest amongst the scientific community, media and general public due to the sensational mechanisms of injury and deleterious consequences they can impart.



Detecting Collisions

Currently, among other methods, collisions are detected using accelerometers and other sensors.

EMU Depart of Health Promotion and Human Performance does research in this topic using sensors.

Current research here involves corroborating impacts detected by sensors using video feeds manually.

This is highly time consuming. How can machine learning help?

Enter Object Detection



Image Processing Tasks:

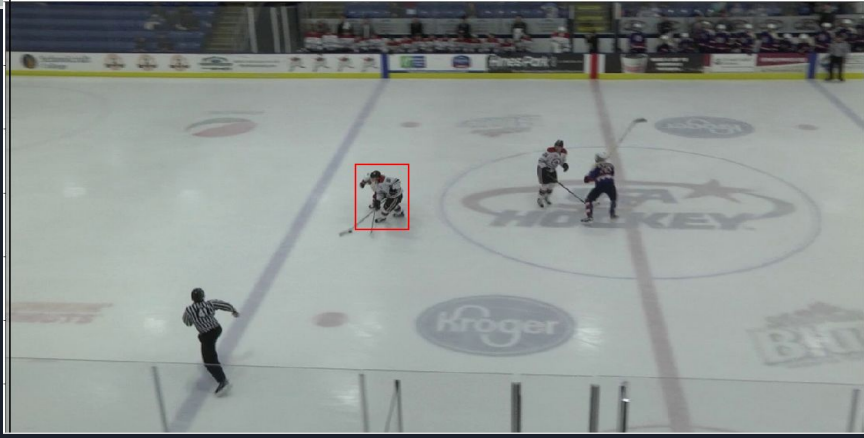
Image Classification: What is the most prominent object in the image?

Object Detection: What objects are present in the image and what is their general location?

Object Segmentation: What are the exact boundaries of those objects in the image?

Landmark Detection: Detecting coordinates of key points in an image








Why Object detection?

Classification doesn't give information, and is error prone in crowded images.

Classification is also more difficult to verify manually.

Segmentation and landmark detection is too expensive and time consuming to get labelled data.

Additionally, we don't need something so specific as segmentation or landmark detection for the task of checking collisions



Components of Object Detection: Sliding Window

Train an object classifier on cropped image as a filter

Run the classifier as sliding window over whole image

Change the size of the window and run it again

Repeat

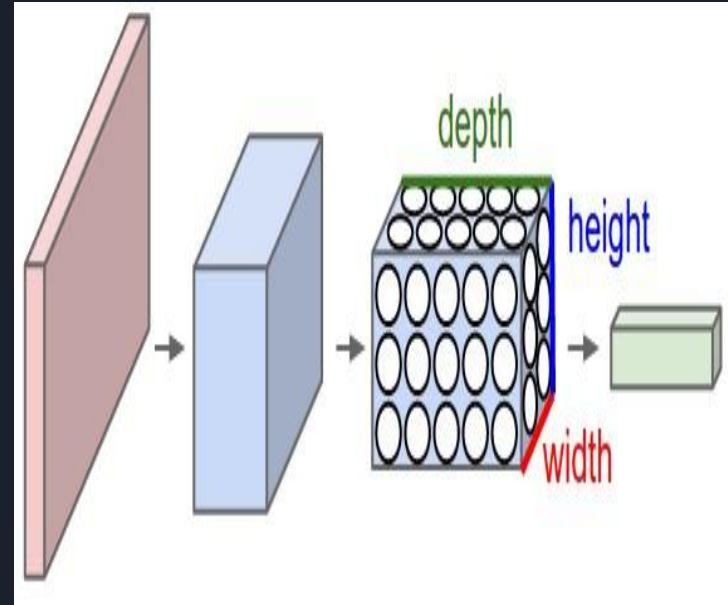
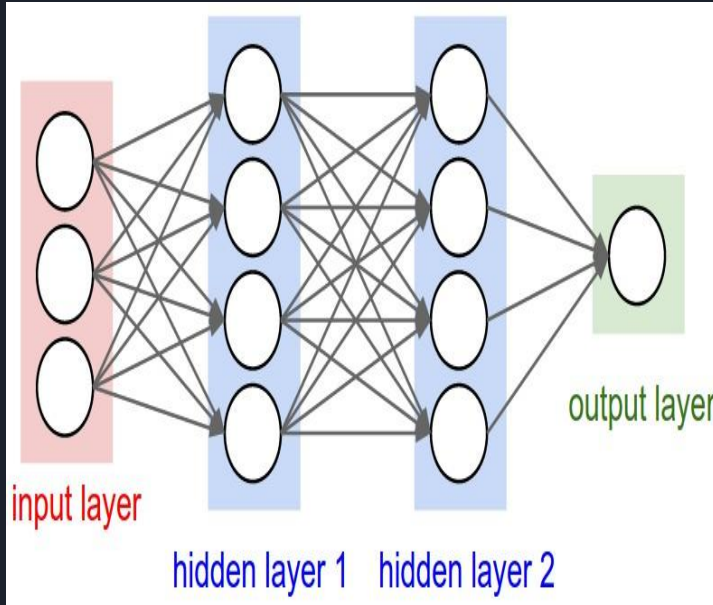
Output the window where the object was found

PROBLEMS:

Very computationally intensive

Wasted Computation

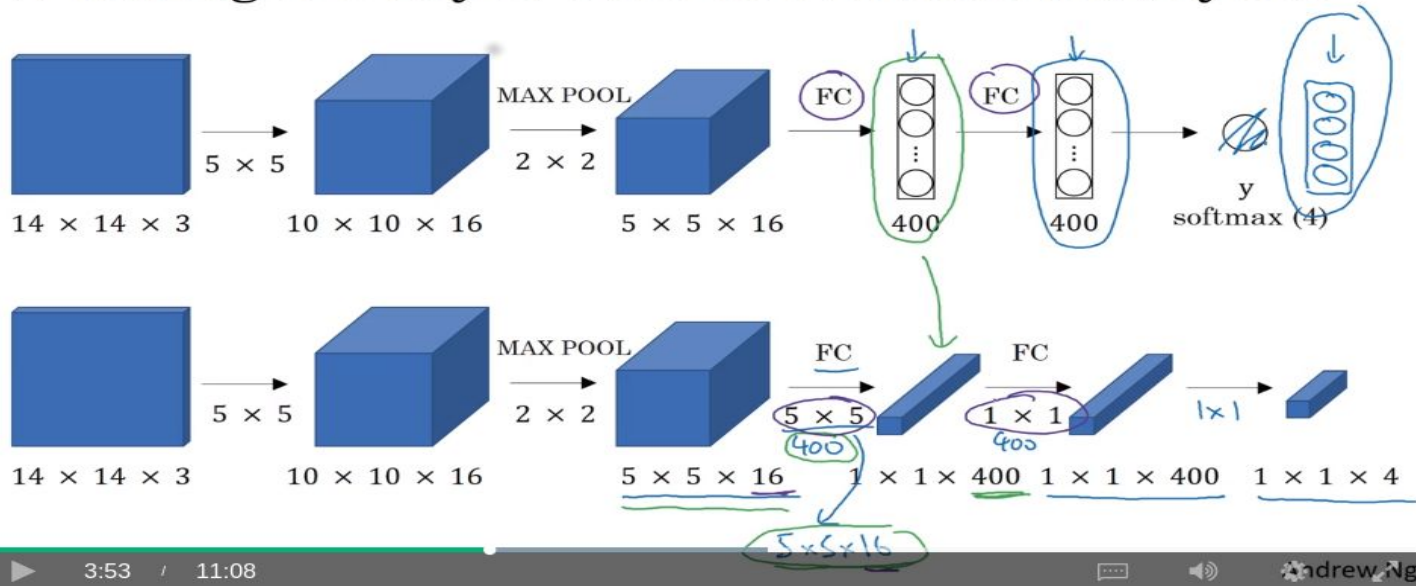
Convolutional Neural Network



Making Sliding Window Faster

Is there a way to reuse components? (Conv output size = $(W - F + 2P) / S + 1$)

Turning FC layer into convolutional layers



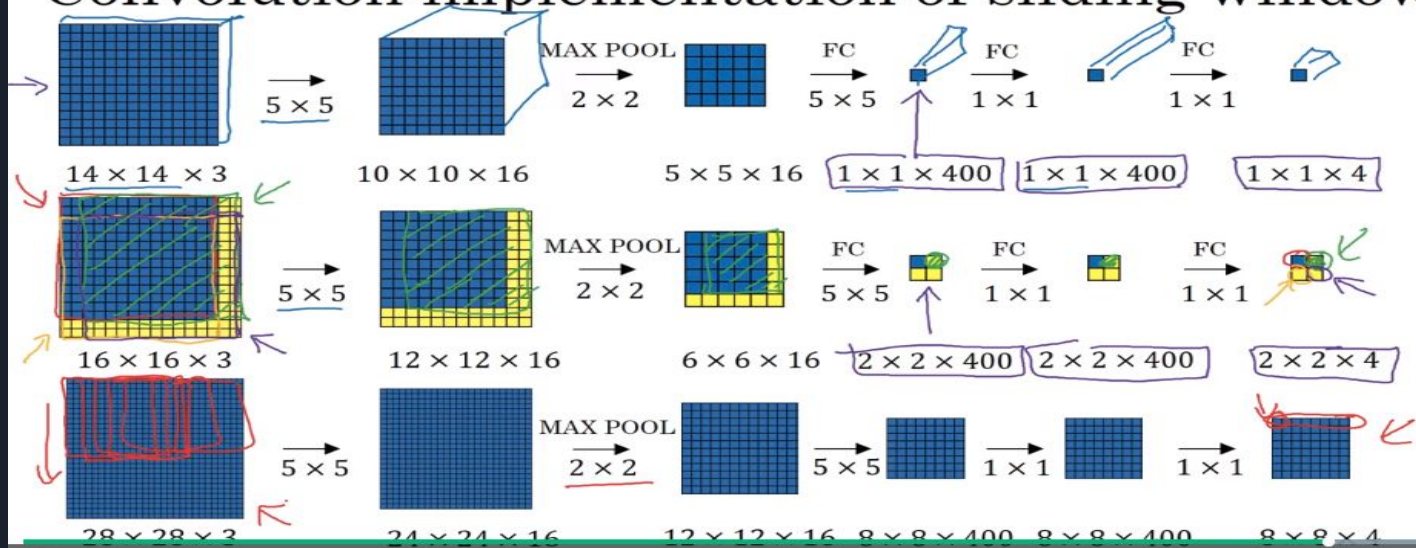
3:53 / 11:08



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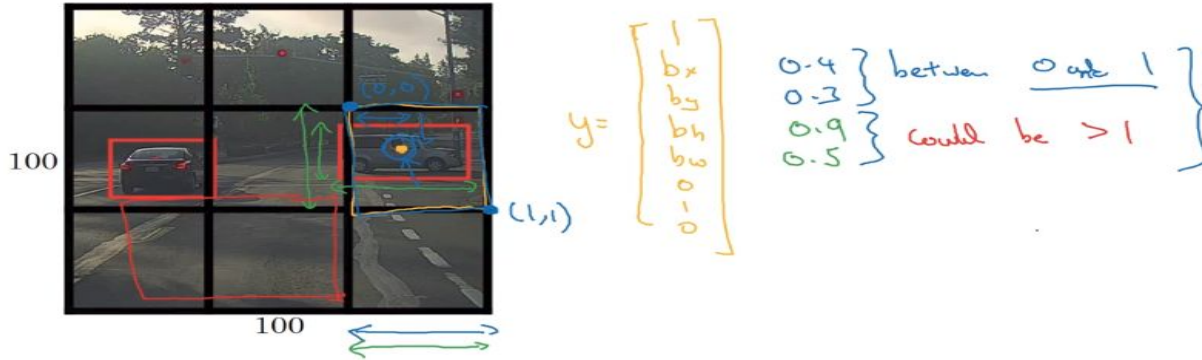
Using the convolution to speed up computation

Convolution implementation of sliding windows



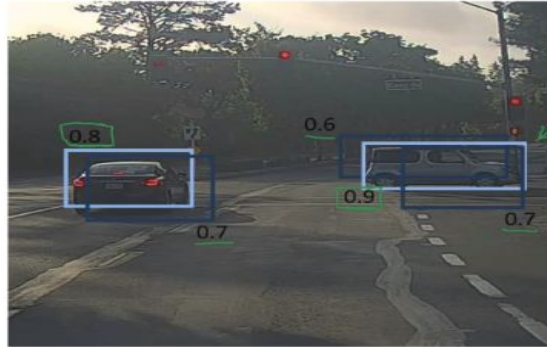
Components of Object Detection: How to specify the object location

Specify the bounding boxes



Components of Object Detection: Non-Max Suppression

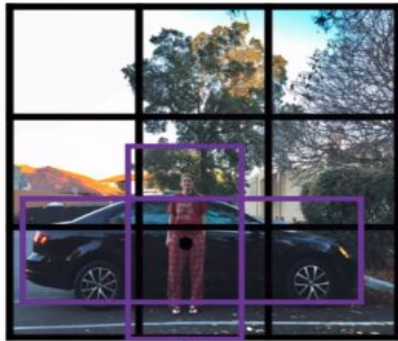
Non-max suppression example



P_c

Final Component: Anchor Box

Anchor box example



Anchor box 1: Anchor box 2:



$y =$

$\begin{bmatrix} p_c \\ b_x \\ b_y \\ b_h \\ b_w \\ c_1 \\ c_2 \\ c_3 \\ p_c \\ b_x \\ b_y \\ b_h \\ b_w \\ c_1 \\ c_2 \\ c_3 \end{bmatrix}$

$\begin{bmatrix} 1 \\ b_x \\ b_y \\ b_h \\ b_w \\ 1 \\ 0 \\ 0 \\ 0 \\ 1 \\ b_x \\ b_y \\ b_h \\ b_w \\ 1 \\ 0 \\ 0 \end{bmatrix}$



Getting data and labels for YOLO

Video processing code demo.

Labelling demo.



Training Procedure

Training demo



Verification

Frame number to timestamp conversion

“blink” and approximate matching

Next step



Conclusion

State of project

Other use cases

Possible Improvements



References

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