



Enhanced Bot Game Using Object Detection

Present by

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Because...

Some players **don't have much time** to play games



Some players decide to **spend the money** to hire other players to play



Some players feel **bored** and stop playing the game



some players **use macro programs** to control and facilitate the game but it is not so good bot



Detected as a bot by a game system and banned



Cheated



The number of players has decreased



Revenue has decreased



Game closed down

To **attract** new players, **retain** existing players, and **make better experiences**

an **enhanced bot game** will help them customize their playing styles

Scope of Work

- Enhanced a bot using object detection instead of a macro program
- Detecting only objects that players can interact with
- Classifying objects to predict an action

Limitations

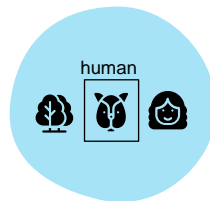
- Focusing on objects in one area only
- It's just a model that will help develop bots to work better

Work Process



Data Preparation

- Screen Captur
- Annotation
- Augmentation



Object Detection

- Match Template
- HSV Thresholding
- Canny Edge
- Cascade Classifier
- YOLOv5



Model Evaluation

- Performance
- mAP
- Precision
- Recall

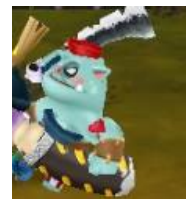
Finding the training images and preprocessing the data

| | Input data | Image Annotation and Augmentation | Final Input Data |
|--|------------|-----------------------------------|------------------|
|--|------------|-----------------------------------|------------------|

Match Template

Template +
Detected
Object

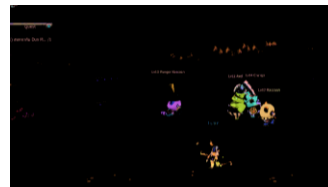
-



HSV
Thresholding,
Canny Edge

Detect by
creating
Tracker

-



Cascade
Classifier

Positive x 600 img
Negative x 400 img

1 class
OpenCV - Positive x 600 img
OpenCV - augmentation x 1,400 img



+ Text file
specifying no.
object and
location of
annotated object

YOLOv5

Training x 606 img

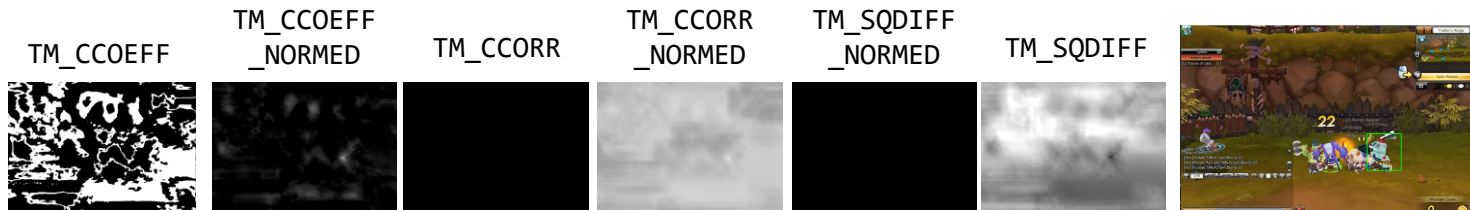
6 classes
Labellmg - annotation x 606 img
Roboflow - augmentation x 1,212 img



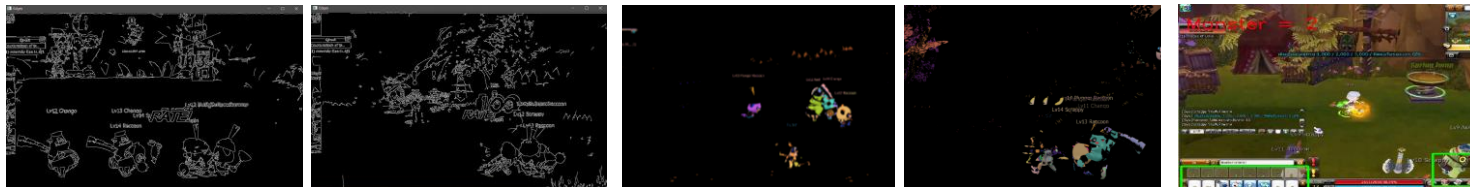
+ Text file specifying object
class and location of each
annotated object

Then perform **object detection**

Match
Template



HSV
Thresholding,
Canny Edge



20 stage; pos 2.6k img; neg 1.2k img; time 4hrs | 10 stage; pos 2.0k img; neg 2.0k img; time 4hrs 30mins

Cascade
Classifier



6 classes, 1.8k img, 100 epoch, batch size 16, time 23 mins

YOLOv5



In parallel, we train the **YOLOv5 model** to **classify objects** based on players' action

We train 6 classes based on players' action



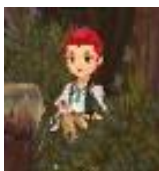
Character
No action



Stair
Jump
[C] + [Up Arrow]



Monster
Kill
[Z]
or set skill button



NPC
Get quest
[Space Bar]



Spring
Jump
[C]



Box
Jump
[C]

Custom Training





- Create labels

```
0 0.569102 0.802152 0.123396 0.336093
1 0.637710 0.758278 0.057256 0.175497
0 0.793189 0.776490 0.127345 0.301325
```

```
monster
character
npc
box
```

- Model Selection > **YOLOv5s**

we chose the smallest, fastest base model of YOLOv5

| | | | |
|---|---|---|---|
|  |  |  |  |
| Small YOLOv5s | Medium YOLOv5m | Large YOLOv5l | XLarge YOLOv5x |
| 14 MB _{FP16} 2.0 ms _{V100} 37.2 mAP _{COCO} | 41 MB _{FP16} 2.7 ms _{V100} 44.5 mAP _{COCO} | 90 MB _{FP16} 3.8 ms _{V100} 48.2 mAP _{COCO} | 168 MB _{FP16} 6.1 ms _{V100} 50.4 mAP _{COCO} |

- Model Training > **batch = 16; epochs = 100**

Here are our results, the **best technique** is **YOLOv5**

Match
Template



Accurate but not dynamic

Cascade
Classifier



Poor Detection, Worst Performance

VDO Link: <https://mega.nz/file/2hdWWRRZ#grHh7P9044QrjzmFlnTdpiKa8me55AYoxBmh5c8ie4>

HSV
Thresholding,
Canny Edge



Poor Detection, Poor Performance

VDO Link: <https://mega.nz/file/3w1VSS6R#51oKMwR7KHF3svCUDbn0ag3F9QUQ3tLg2lmiMQU1yII>

YOLOv5

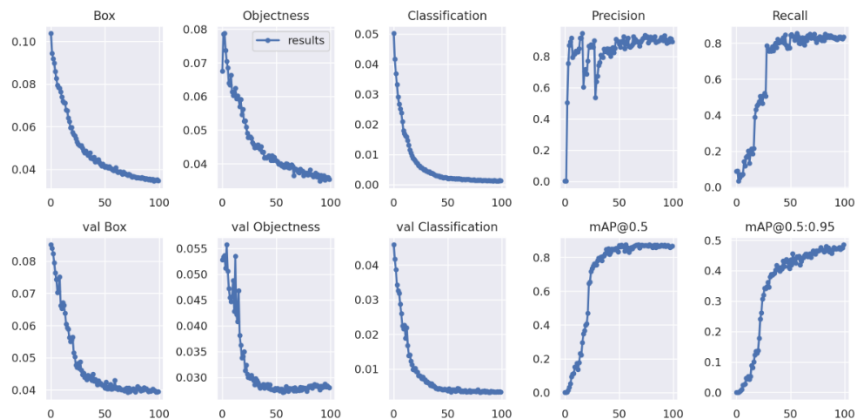


Best Detection, Good Performance

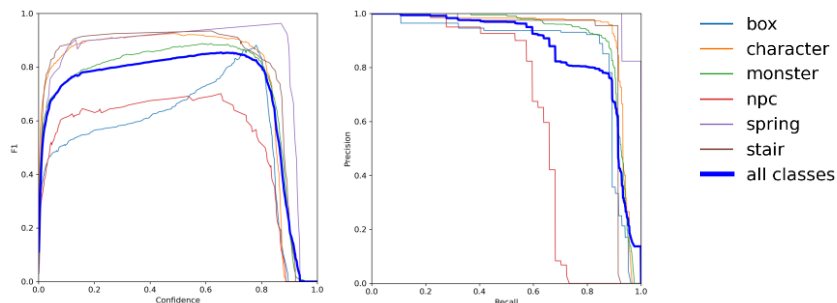
VDO Link: https://mega.nz/file/24NgiaZL#3M9_B7XN5TjpUe9_peDzL2Bo37Y-sPfeZ-Pj7ha2Sk

YOLOv5 Model Evaluation

Training result



Training result each class



Result from last weight on Training Set

| Class | Images | Targets | P | R | mAP@.5 | mAP@.5:.95: |
|-----------|----------|----------|-------|-------|--------|-------------|
| all | 1.04e+03 | 7.13e+03 | 0.969 | 0.962 | 0.981 | 0.663 |
| box | 1.04e+03 | 810 | 0.931 | 0.899 | 0.961 | 0.558 |
| character | 1.04e+03 | 1.07e+03 | 1 | 0.999 | 0.996 | 0.69 |
| monster | 1.04e+03 | 4.64e+03 | 0.979 | 0.963 | 0.99 | 0.696 |
| npc | 1.04e+03 | 150 | 0.934 | 0.947 | 0.963 | 0.572 |
| spring | 1.04e+03 | 93 | 0.991 | 0.968 | 0.98 | 0.722 |
| stair | 1.04e+03 | 366 | 0.978 | 0.994 | 0.994 | 0.741 |

Result from best weight on Training Set

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|-----------|----------|----------|-------|-------|--------|-------------|
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| box | 1.04e+03 | 810 | 0.931 | 0.899 | 0.961 | 0.558 |
| character | 1.04e+03 | 1.07e+03 | 1 | 0.999 | 0.996 | 0.69 |
| monster | 1.04e+03 | 4.64e+03 | 0.979 | 0.963 | 0.99 | 0.696 |
| npc | 1.04e+03 | 150 | 0.934 | 0.947 | 0.963 | 0.572 |
| spring | 1.04e+03 | 93 | 0.991 | 0.968 | 0.98 | 0.722 |
| stair | 1.04e+03 | 366 | 0.978 | 0.994 | 0.994 | 0.741 |

Evaluate on Validation Set using the best weight

| Class | Images | Targets | P | R | mAP@.5 | mAP@.5:.95: |
|-----------|--------|---------|-------|-------|--------|-------------|
| all | 130 | 801 | 0.894 | 0.834 | 0.866 | 0.487 |
| box | 130 | 84 | 0.672 | 0.893 | 0.861 | 0.38 |
| character | 130 | 207 | 0.967 | 0.86 | 0.922 | 0.508 |
| monster | 130 | 402 | 0.911 | 0.856 | 0.907 | 0.493 |
| npc | 130 | 47 | 0.9 | 0.574 | 0.626 | 0.253 |
| spring | 130 | 14 | 0.96 | 0.929 | 0.983 | 0.626 |
| stair | 130 | 47 | 0.954 | 0.891 | 0.898 | 0.662 |

Evaluate on Test Set using the best weight

| Class | Images | Targets | P | R | mAP@.5 | mAP@.5:.95: |
|-----------|--------|---------|-------|-------|--------|-------------|
| all | 130 | 749 | 0.895 | 0.842 | 0.893 | 0.458 |
| box | 130 | 39 | 0.762 | 0.819 | 0.853 | 0.355 |
| character | 130 | 189 | 0.9 | 0.856 | 0.908 | 0.478 |
| monster | 130 | 413 | 0.916 | 0.862 | 0.922 | 0.526 |
| npc | 130 | 60 | 0.842 | 0.633 | 0.731 | 0.343 |
| spring | 130 | 26 | 0.996 | 0.885 | 0.989 | 0.504 |
| stair | 130 | 22 | 0.955 | 1 | 0.958 | 0.54 |

Try with **Blind Dataset**



VDO Link: https://mega.nz/file/7pcAQ74b#49mWnFL1Ch1ww04NgxfkWDskjUHP_oumuPb6PeQ2VeQ

Evaluate on Blind Dataset

| Class | Images | Targets |
|-----------|--------|---------|
| all | 100 | 273 |
| box | 100 | 98 |
| character | 100 | 112 |
| monster | 100 | 63 |

| Class | P | R |
|-----------|---------|--------|
| all | 0.0246 | 0.148 |
| box | 0.047 | 0.296 |
| character | 0.0219 | 0.0536 |
| monster | 0.00487 | 0.0952 |

| Class | mAP@.5 | mAP@.5:.95: |
|-----------|---------|-------------|
| all | 0.00909 | 0.00337 |
| box | 0.0205 | 0.00816 |
| character | 0.00472 | 0.00129 |
| monster | 0.00207 | 0.000666 |

Cannot perform object detection as well on blind dataset

A bot game using object detection is the first step to **make better experiences** for players



Help players find an object that they want to interact with



With accurate detection to perform best action



Get what they want without wasting time



The next step is...

Train more objects in different areas and use instance object detection to improve occlusion detection



Develop more feature
e.g. total item gain,
blood gauge, etc.



Implement model and build a bot

