# Object detection of yolov5 on Android

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### Object detection of yolov5 on Android

## Hardware and software environment

- yolov5
- ncnn
- android studio 4.1.2
- oneplus 8
- pytorch 1.6
- onnx
- netron

## **Preface**

The previous articles, We've talked about it in detail yolov5 Detection of Training Visualization, etc, This article continues to yolov5 The topic of, Let's take a look at, How to be in android To use yolov5 For target detection?



## What is? ncnn

The following paragraph is the official definition

network forward computing framework specially optimized for mobile terminals .ncnn From the beginning of design , We should deeply consider the deployment and use of mobile terminals , There is no need for a third party to rely on , Cross platform , Mobile terminal cpu Faster than all known open source frameworks . be based on ncnn, Developers can easily transplant deep learning algorithms to mobile phones for efficient execution , Develop artificial intelligence APP, take AI Bring it to your fingertips .

at present ncnn Has supported most of cnn The Internet , Including the yolov5

- Classical CNN: VGG AlexNet GoogleNet Inception ...
- Practical CNN: ResNet DenseNet SENet FPN ...
- Light-weight CNN: SqueezeNet MobileNetV1/V2/V3 ShuffleNetV1/V2 MNasNet ...
- Face Detection: MTCNN RetinaFace ...

- Detection: VGG-SSD MobileNet-SSD SqueezeNet-SSD MobileNetV2-SSDLite MobileNetV3-SSDLite ...
- Detection: Faster–RCNN R–FCN ...
- Detection: YOLOV2 YOLOV3 MobileNet-YOLOV3 YOLOV4 YOLOV5 ...
- Segmentation: FCN PSPNet UNet YOLACT ...
- Pose Estimation: SimplePose ...

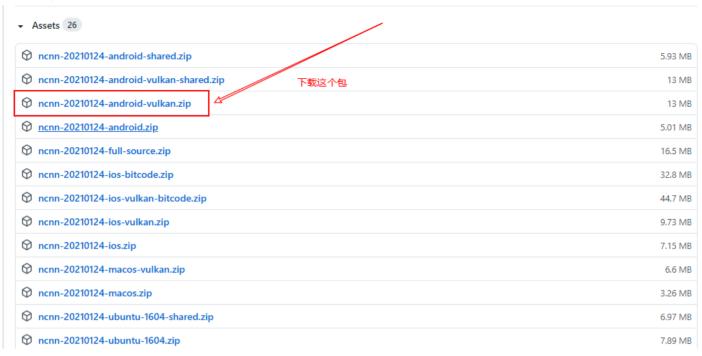
## **Project operation**

About the basic environment, I need to use android Development environment of, image android studio, sdk, ndk wait, This article does not introduce, If there's a problem, You can leave a message in the message area.

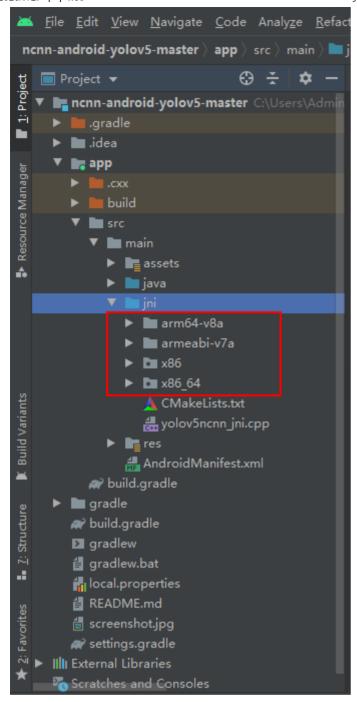
Let's just pull yolov5 for android Source code

```
git clone https://github.com/nihui/ncnn-android-yolov5
Copy code
```

Then come to nonn Version release page for , Download the compiled package github.com/Tencent/ncn..., If you're interested , It can also be done through ndk Compile by yourself



Download, unzip and copy to ncnn-android-yolov5 Project app/src/main/jni Under the table of contents, The directory structure is like this



And then modify the CMakeLists.txt, Will be one of the ncnn\_DIR Change the value of the variable to

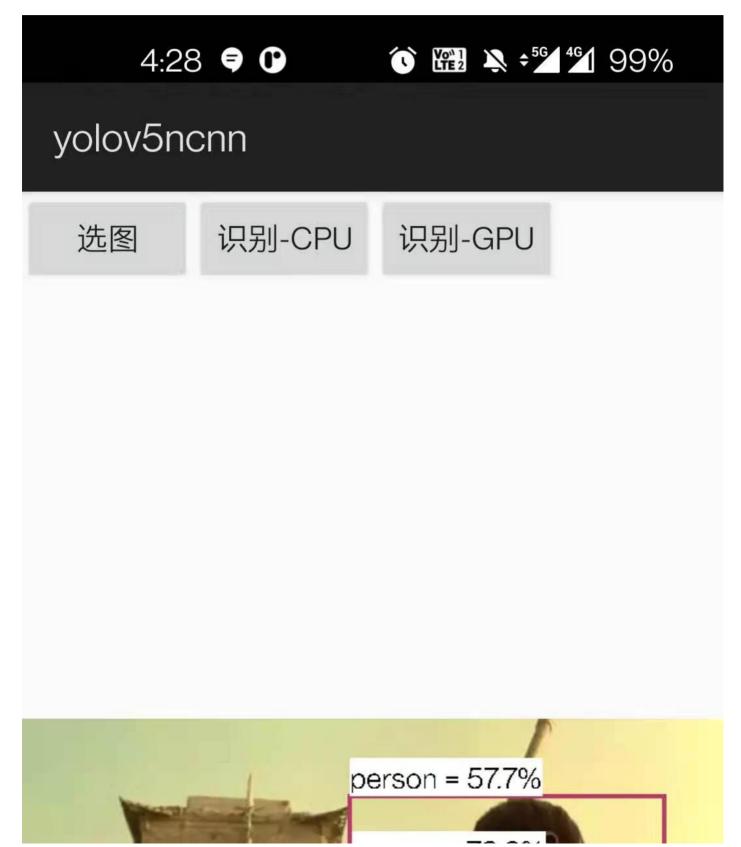
set(ncnn\_DIR \${CMAKE\_SOURCE\_DIR}/\${ANDROID\_ABI}/lib/cmake/ncnn)
Copy code

After saving, you can compile the project.

Here we use real machines to test , You need to turn on the developer mode of mobile phones by yourself , allow usb debugging , APP Open after installation , The front page is like this

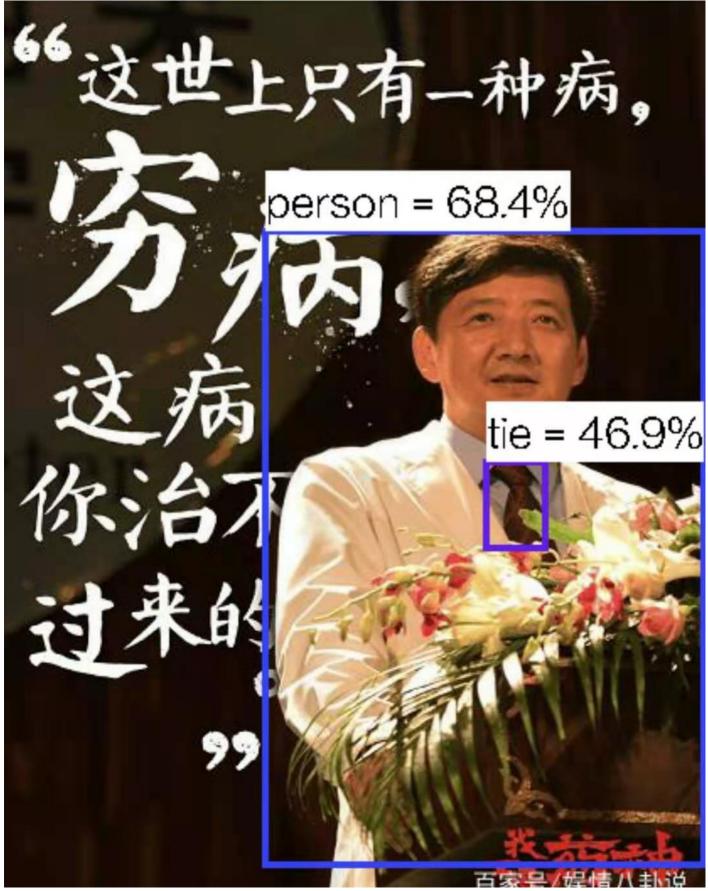


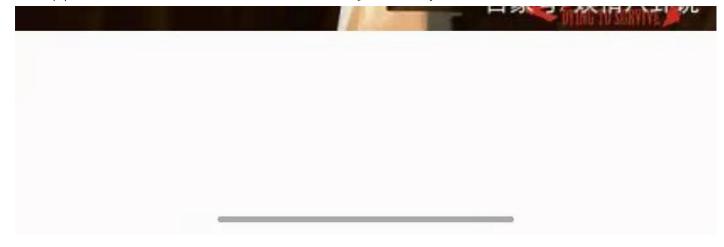
The interface layout is very simple , There are only three buttons in all , A map selection , A use  $_{\tt CPU}$  testing , A use  $_{\tt GPU}$  testing . Found by testing  $_{\tt CPU}$  It's faster than  $_{\tt GPU}$  Twice as slow , my  $_{\tt OnePlus}$  8 Of  $_{\tt GPU}$  The speed is only  $_{\tt Sfps}$ .











## How to use your own model

When we train our detection model, You need an intermediary, Through it, You can transform between different frameworks.open Neural Network Exchange abbreviation ONNX, It means open neural network exchange format, It's the intermediary we need.

yolov5 Please refer to this article <u>xugaoxiang.com/2020/07/02/...</u>, As a test, We also use the mask detection model trained above

Install dependency library

pip install onnx coremltools onnx-simplifier
Copy code

#### Carry out orders

python models/export.py --weights runs/exp2/weights/best.pt
Copy code

```
Removing op "345" (type: const)
Removing op "342" (type: const)
Removing op "342" (type: const)
Removing op "339" (type: const)
Removing op "339" (type: const)
Removing op "332" (type: const)
Removing op "320" (type: const)
Removing op "320" (type: const)
Removing op "319" (type: const)
Removing op "317" (type: const)
Removing op "311" (type: const)
Removing op "311" (type: const)
Removing op "311" (type: const)
Removing op "310" (type: const)
Removing op "310" (type: const)
Removing op "310" (type: const)
Removing op sases for nn_backend: "nn_backend::commingle_loop_vars"

Performing passes for nn_backend: "nn_backend::handle_return_inputs_as_outputs"

Performing passes for nn_backend: "common::const_elimination"

Performing passes for nn_backend: "common::dead_code_elimination"

Performing passes for nn_backend: "nn_backend::handle_unused_inputs"

Performing passes for nn_backend: "nn_backend: "nn_backend: "nn_backend: "nn_backend: "nn_backend: "nn_backend: "nn_backend: "nn_backe
```

At the same time best.pt The same level directory, Also generated best.onnx, best.mlmodel and best.torchscript.pt

```
(pytorch1.6) xugaoxiang@1070Ti:~/Works/github/yolov5_v3/yolov5-3.0$ ls runs/exp2/weights/
best.mlmodel best.onnx best.pt best.torchscript.pt last.pt
(pytorch1.6) xugaoxiang@1070Ti:~/Works/github/yolov5 v3/yolov5-3.0$
```

I need to remind you that , The above export operation is in pytorch1.7 and yolov5 v4.0 Errors will be reported on the version , My environment here is pytorch1.6, yolov5 3.0 edition . The error information is as follows

```
Converting op 143 : listconstruct

Adding op '143' of type const

Converting op 144 : listconstruct

Adding op '144' of type const

Converting op 145 : listconstruct

Adding op '145' of type const

Converting op x.2 : _convolution

Converting Frontend ==> MIL Ops: 3% | | | | | |
| 21/620 [00:00<00:00, 1350.49 ops/s]

CoreML export failure: unexpected number of inputs for node x.2

(_convolution): 13

Export complete (12.83s). Visualize with

https://github.com/lutzroeder/netron.

Copy code
```

This is a coremitools One of the bug. For links, please see github.com/ultralytics...

Next, use the tool onnx-simplifier To simplify the onnx, Carry out orders

```
python -m onnxsim runs/exp2/weights/best.onnx
runs/exp2/weights/best-sim.onnx
Copy code
```

```
(pytorch1.6) xugaoxiang@1070Ti:~/Works/github/yolov5_v3/yolov5-3.0$ python -m onnxsim runs/exp2/weights/best.onnx runs/exp2/weights/best.onnx
```

Let's start compiling ncnn, First, prepare the basic environment

```
sudo apt install build-essential libopency-dev cmake Copy code
```

Compilation and installation protobuf Dependency Library

```
git clone https://github.com/protocolbuffers/protobuf.git
cd protobuf
git submodule update --init --recursive
./autogen.sh
./configure
make
make install
sudo ldconfig
Copy code
```

After compiling and installing, You can check it out protobuf Version number of

```
xugaoxiang@ubuntu:~/Works/ncnn/build$ protoc --version
libprotoc 3.14.0
```

Next, Need to compile nonn, The goal is to generate onnx turn nonn Command line tools for

```
git clone https://github.com/Tencent/ncnn.git
cd ncnn
git submodule update --init
mkdir build
cd build
cd build
cmake ..
make -j8
make install
Copy code
```

After compiling and installing, You can use onnx2ncnn The tool has transformed

```
cd tools/onnx
./onnx2ncnn ~/Works/weights/best-sim.onnx
~/Works/weights/model.param ~/Works/weights/model.bin
Copy code
```

oh, no, Wrong report

```
xugaoxiang@ubuntu:~/Works/ncnn/build/tools/onnx$ ./onnx2ncnn ~/Works/weights/
best-sim.onnx ~/Works/weights/model.param ~/Works/weights/model.bin
Unsupported slice step !
xugaoxiang@ubuntu:~/Works/ncnn/build/tools/onnx$
```

This is because slice Not supported. To solve this problem, We need to edit the generated param file, Use the text tool to open it

```
7767517
201 228
Input
                  images
                                             0 1 images
                                             1 4 images images_splitncnn_0 images_splitncnn_1 images_splitncnn_2 images_splitncnn_3
1 1 images_splitncnn_3 171 -23309=1,0 -23310=1,2147483647 -23311=1,1
Split
                  splitnonn input0
                  Slice_4
Crop
                                             1 1 171 176 -23309=1,0 -23310=1,2147483647 -23311=1,2
                  Slice 9
                  Slice_14
                                             1 1 images_splitncnn_2 181 -23309=1,1 -23310=1,2147483647 -23311=1,1
Crop
Crop
                                             1 1 181 186 -23309=1,0 -23310=1,2147483647 -23311=1,2
                  Slice_19
                                             1 1 images_splitncnn_1 191 -23309=1,0 -23310=1,2147483647 -23311=1,1
                  Slice 24
Crop
                  Slice 29
                                             1 1 191 196 -23309=1,1 -23310=1,2147483647 -23311=1,2
Crop
                                             1 1 images splitncnn 0 201 -23309=1,1 -23310=1,2147483647 -23311=1,1
Crop
Crop
                  Slice 39
                                             1 1 201 206 -23309=1,1 -23310=1,2147483647 -23311=1,2
Concat
                  Concat_40
                                             4 1 176 186 196 206 207 0=0
Convolution
                  Conv 41
                                             1 1 207 208 0=32 1=3 11=3 2=1 12=1 3=1 13=1 4=1 14=1 15=1 16=1 5=1 6=3456
                  LeakyRelu 42
                                             1 1 208 209 0=1.000000e-01
ReLU
                                             1 1 209 210 0=64 1=3 11=3 2=1 12=1 3=2 13=2 4=1 14=1 15=1 16=1 5=1 6=18432
Convolution
                  Conv 43
ReLU
                  LeakyRelu_44
                                             1 1 210 211 0=1.000000e-01
```

#### The modified param That's true

```
7767517
192 228
                                           0 l images
 Input
                  images
YoloV5Focus
                                           1 1 images 207
                  focus
                  Conv_41
                                           1 1 207 208 0=32 1=3 11=3 2=1 12=1 3=1 13=1 4=1 14=1 15=1 16=1 5=1 6=3456
ReLU
                  LeakyRelu_42
                                           1 1 208 209 0=1.000000e-01
                                           1 1 209 210 0=64 1=3 11=3 2=1 12=1 3=2 13=2 4=1 14=1 15=1 16=1 5=1 6=18432
                  Conv_43
LeakyRelu_44
Convolution
                                           1 1 210 211 0=1.000000e-01
ReLU
Split
                  splitncnn_0
                                           1 2 211 211_splitncnn_0 211_splitncnn_1
Convolution
                  Conv_45
                                           1 1 211_splitnenn_1 212 0=32 1=1 11=1 2=1 12=1 3=1 13=1 4=0 14=0 15=0 16=0 5=1 6=2048
                  LeakyRelu 46
ReLU
                                           1 1 212 213 0=1.000000e-01
```

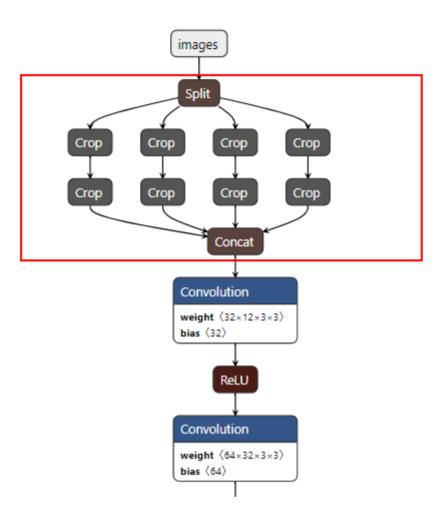
The first number in the second row is the number of layers, Because we deleted 8 individual crop and 1 individual concat, So its value is 201–9=192

in addition, What needs to be modified is Reshape Layer output grid, Change the corresponding values to -1, This is to solve the problem of multiple detection frames in practice

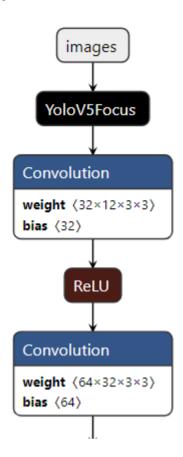
```
Reshape
                 Reshape 216
                                          1 1 385 403 0=6400 1=7 2=3
                 Transpose 217
                                          1 1 403 output 0=1
                                          1 1 368 splitncnn 0 405 0=21 1=1 11=1 2=1 12=1 3=1 13=1 4=0 14=0 15=0 16=0 5=1 6=5376
Convolution
                 Conv_218
Reshape
                 Reshape_232
                                          1 1 405 423 0=1600 1=7 2=3
                 Transpose_233
                                          1 1 423 424 9=1
Permute
Convolution
                 Conv_234
                                          1 1 384 425 0=21 1=1 11=1 2=1 12=1 3=1 13=1 4=0 14=0 15=0 16=0 5=1 6=10752
Reshape
                 Reshape_248
                                          1 1 425 443 0=400 1=7 2=3
Permute
                 Transpose 249
                                          1 1 443 444 0=1
```

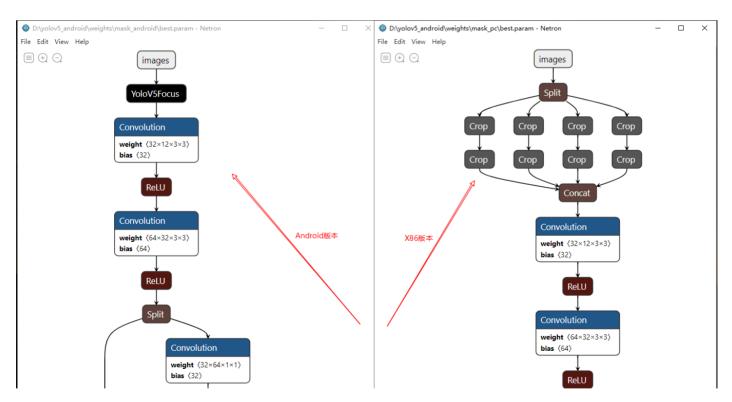
```
1 1 385 403 0=-1 1=7 2=3
                 Reshape_216
                                          1 1 403 output 0=1
Permute
                 Transpose 217
                                          1 1 368_splitncnn_0 405 0=21 1=1 11=1 2=1 12=1 3=1 13=1 4=0 14=0 15=0 16=0 5=1 6=5376
Convolution
                 Conv_218
                                          1 1 405 423 0=-1 1=7 2=3
Reshape
                 Reshape_232
Permute
                 Transpose_233
                                          1 1 423 424 0=1
Convolution
                 Conv_234
                                          1 1 384 425 0=21 1=1 11=1 2=1 12=1 3=1 13=1 4=0 14=0 15=0 16=0 5=1 6=10752
Reshape
                 Reshape 248
                                          1 1 425 443 0=-1 1=7 2=3
                 Transpose_249
                                          1 1 443 444 0=1
Permute
```

It can be used netron This tool opens to see the network structure ,windows, linux, macos both, Address github.com/lutzroeder/...

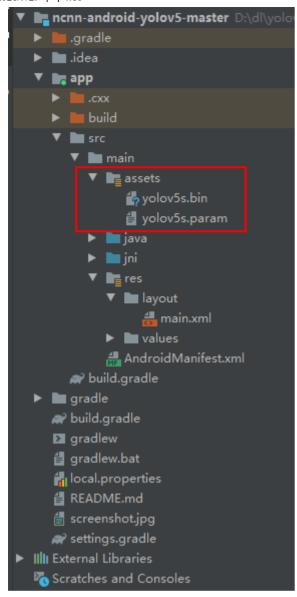


In the picture, We want to delete split, concat and 8 individual crop node, And add new nodes yolov5focus, The node name is and android In the  $source\ yolov5ncnn\_jni.cpp$  The class name in the . Here you can combine the text editor with netron To combine, Check immediately after modification .

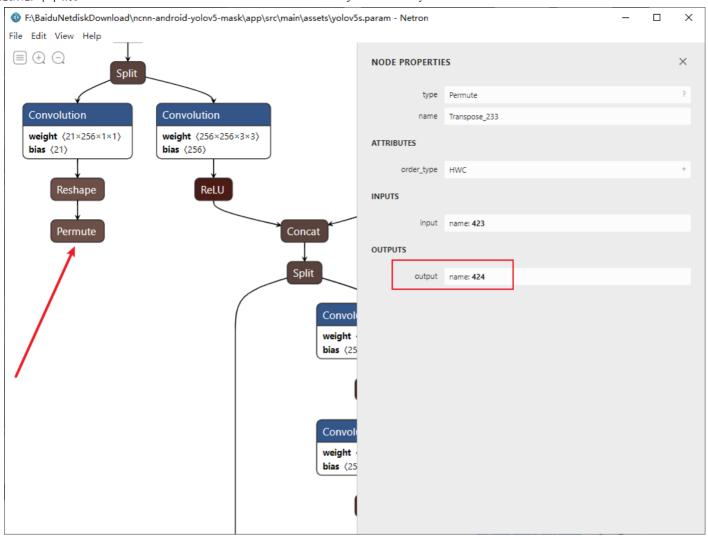


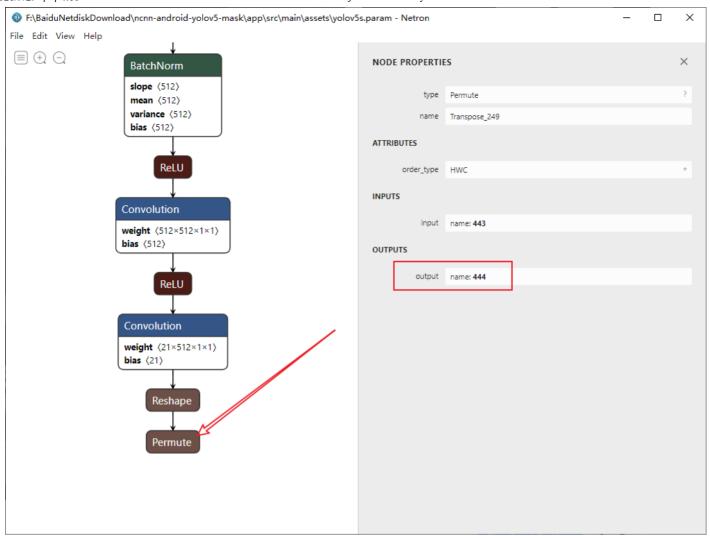


Then you can replace the original android In Engineering assets Under folder yolov5s.param and yolov5s.bin



And then modify the source file yolov5ncnn\_jni.cpp, modify 2 individual Permute Node output





```
ncnn::Mat out:
ex.extract( blob_name: "424", &: out);
ncnn::Mat anchors( _w: 6);
anchors[1] = 61.f;
anchors[4] = 59.f;
std::vector<Object> objects16;
generate_proposals(anchors, stride: 16, in_pad, out, prob_threshold, &: objects16);
proposals.insert( position: proposals.end(), objects16.begin(), objects16.end());
ncnn::Mat out;
ex.extract( blob_name: "444", &: out);
ncnn::Mat anchors( _W: 6);
anchors[0] = 116.f;
anchors[1] = 90.f;
anchors[2] = 156.f;
anchors[3] = 198.f;
```

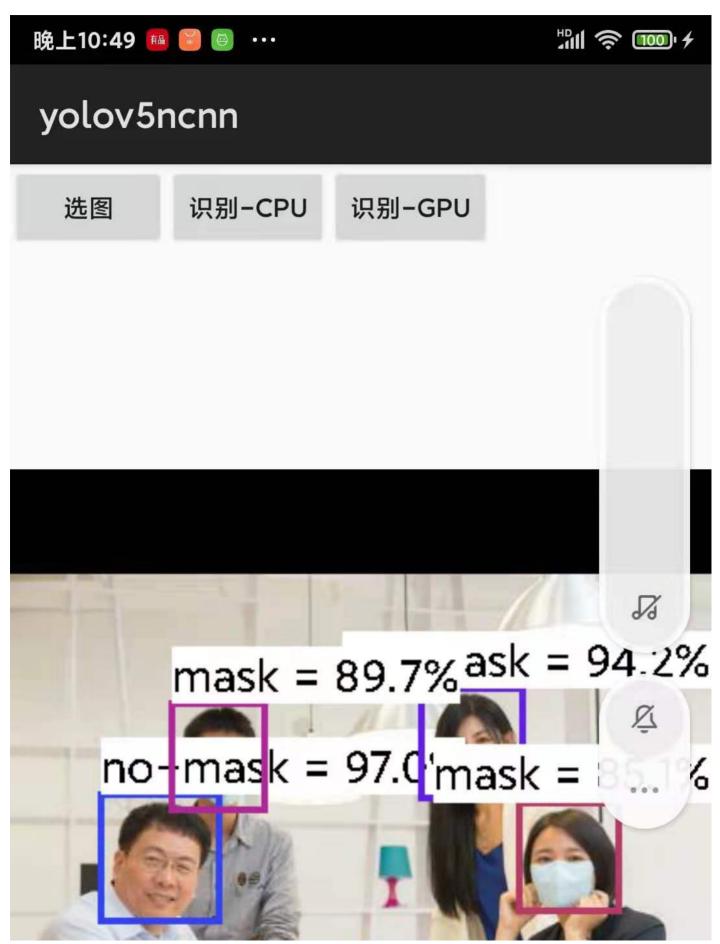
#### Last, modify class names

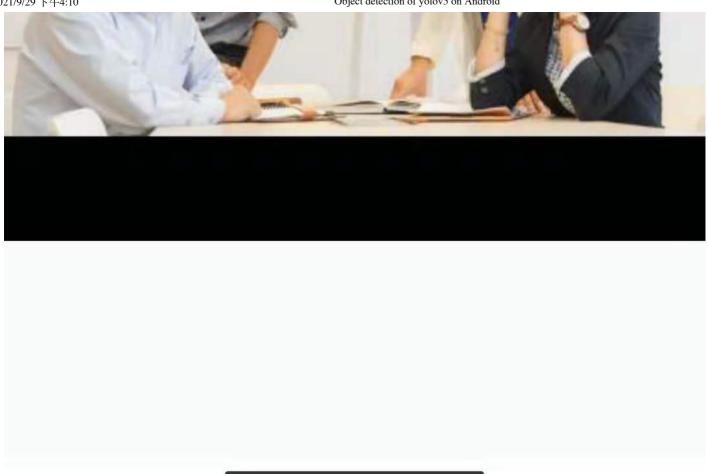
```
// objects to Obj[]
// static const char* class_names[] = {
// "person", "bicycle", "car", "motorcycle", "airplane", "bus", "train", "truck", "boat", "traffic light",
// "fire hydrant", "stop sign", "parking meter", "bench", "bird", "cat", "dog", "horse", "sheep", "cow",
// "elephant", "bear", "zebra", "giraffe", "backpack", "umbrella", "handbag", "tie", "suitcase", "frisbee",
// "skis", "snowboard", "sports ball", "kite", "baseball bat", "baseball glove", "skateboard", "surfboard",
// "tennis racket", "bottle", "wine glass", "cup", "fork", "knife", "spoon", "bowl", "banana", "apple",
// "sandwich", "orange", "broccoli", "carrot", "hot dog", "pizza", "donut", "cake", "chair", "couch",
// "potted plant", "bed", "dining table", "toilet", "tv", "laptop", "mouse", "remote", "keyboard", "cell phone",
// "microwave", "oven", "toaster", "sink", "refrigerator", "book", "clock", "vase", "scissors", "teddy bear",
// "hair drier", "toothbrush"
// };

static const char* class_names[] = {
    "mask", "no-mask"
};
```

Recompile project, Connect your cell phone, install apk And run

The final results are as follows



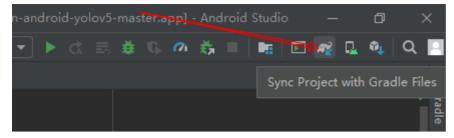


## **FAQ**

Here are a few common questions, For your reference.

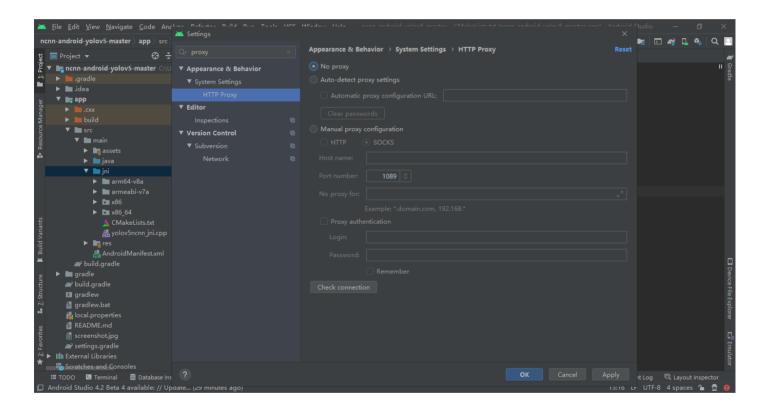
```
Could not install Gradle distribution from 'https://services.gradle.org/distributions/gradle-5.4.1-all.zip'. Copy code
```

close android studio, Manually from the site <a href="mailto:services.gradle.org/distributio...">services.gradle.org/distributio...</a> Download zip, Then go to the folder <a href="mailto:C:\Users\Administrator.gradle\wrapper\dists\gradle-5.4.1-all\3221gyojl5jsh0helicew7rwx">services.gradle\wrapper\dists\gradle-5.4.1-all\3221gyojl5jsh0helicew7rwx</a>, Delete all the original contents, Copy in the downloaded package, Open again android studio, Click on the synce Project with Gradle Files



Cause: jcenter.bintray.com:443 failed to respond Copy code

This problem may be related to agency , stay File --> Settings --> HTTP Proxy, Close the agent



Or edit the file ~.gradle\gradle.properties, take proxy Comment out the related statements

```
1 ## For more details on how to configure your build environment visit
    # http://www.gradle.org/docs/current/userquide/build_environment.html
    \sharp Specifies the JVM arguments used for the daemon process.
   # The setting is particularly useful for tweaking memory settings.
   # Default value: -Xmx1024m -XX:MaxPermSize=256m
   # org.gradle.jvmargs=-Xmx2048m -XX:MaxPermSize=512m -XX:+HeapDumpOnOutOfMemoryError -Dfile.encoding=UTF-8
   # When configured, Gradle will run in incubating parallel mode.
10
   # This option should only be used with decoupled projects. More details, visit
   # http://www.gradle.org/docs/current/userguide/multi project builds.html#sec:decoupled projects
   # org.gradle.parallel=true
   #Thu Jan 28 14:32:44 CST 2021
    #systemProp.http.proxyHost=127.0.0.1
    #systemProp.http.proxyPort=1089
   #systemProp.https.proxyHost=127.0.0.1
    #systemProp.https.proxyPort=1089
```

Another mistake , Is compiled ncnn When , appear tiff Related error messages

```
//usr/llb/libgdal.so.20: undefined reference to 'TIFFErrorExt@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFGetFieldDefaulted@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFSWAbArrayOfLong@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFNubberOfDtrectories@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFFISTESIZE64@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFFISTESIZE64@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFSTSTESIZE64@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFSTSTSTZ64@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFSTSTZ64@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFSTSTZ64@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFSTSTZ64@LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFSTSTZ64_LIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFUNINDIPTCCTOTYQLIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFOSTEDECCONFIGUREDIBTIFF_4.0'
//usr/llb/libgdal.so.20: undefined reference to 'TIFFOSTEDECCONFIGUREDIBTIFF_
```

This is mainly anaconda Our environment leads to, My approach is to withdraw completely anaconda Environmental Science

```
conda deactivate
unset LD_LIBRARY_PATH
```

#### Last question, A common mistake in model transformation

```
I/AdrenoGLES-0: PFP: 0x016dd091, ME: 0x00000000
        D/cent.yolov5ncn: Successfully load libgui-plugin.so, this=0x796447e298
        D/DecorView: onWindowFocusChangedFromViewRoot hasFocus: true, DecorView@7ea70c2[MainActivity]
  D/ViewRootImpl[MainActivity]: windowFocusChanged hasFocus=true inTouchMode=true

➡ D/ViewRootImpl[MainActivity]: windowFocusChanged hasFocus=false inTouchMode=true

    D/DecorView: onWindowFocusChangedFromViewRoot hasFocus: true, DecorView@7ea70c2[MainActivity]
       D/ViewRootImpl[MainActivity]: windowFocusChanged hasFocus=true inTouchMode=true
       W/ncnn: find_blob_index_by_name 781 failed
            find_blob_index_by_name 801 failed
        D/YoloV5Ncnn: 0 objects detected
            652.07ms detect
        I/Choreographer: Skipped 58 frames! The application may be doing too much work on its main thread.
        I/110: OptJank - total:499 frameGap:499 delta#644#12#10#0#1#1
        W/ncnn: find_blob_index_by_name 781 failed
          find_blob_index_by_name 801 failed
        D/YoloV5Ncnn: 0 objects detected
≡ TODO 🗷 Terminal 🛢 Database Inspector 🕨 4: Run 🙃 Profiler ≡ 6: Logcat 🔨 Build
Success: Operation succeeded (2 minutes ago)
```

The mistake is yolov5ncnn\_jni.cpp Medium output Not matching the actual model

## Source download

Baidu network disk link: pan.baidu.com/s/1U4XfNSeM... Extraction

code: x80i

## Reference material

- official github
- 4.0 What's new ?
- How to train models
- ncnn
- Model training Visualization
- Android studio gradle Solutions to build failures
- github.com/daquexian/o...

- github.com/protocolbuf...
- github.com/Tencent/ncn...

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