

# NAS-EOD: an end-to-end Neural Architecture Search method for Efficient Object Detection

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# Introduction

# **Proposed method**

- Search space
- Search strategy

### **Experiment results**

# Introduction



### Detection framework



### Our main contributions:

- We propose an end-to-end NAS method for detection task. The backbone and neck can be updated at the same time, which ensures an overall good performance.
- The search strategy can handle multi-task problems, it can balance accuracy and latency in the process of finding a better model.
- The discovered architecture (NAS-EOD) can be deployed on edge devices, and outperform the state-of-the-art models on the benchmark dataset.

### Search space



Backbone:



Search options:

- The depth-wise convolution kernel size (K=3 or 5)
- Expansion ratio of the residual unit (1, 3, or 6)
- SE block\* exists or not in each layer



Concat

Next layer

Shortcut

🖵 GN +ReLU6

## Search strategy



RNN design



Multi-objective loss

$$Loss(m) = \lambda_c Loss_c(m) + \lambda_r Loss_r(m) + Lat(m)$$

# Experiment results



### Architecture search result



### Some findings:

- Large size kernels tend to be at later stages of the architecture.
- SE blocks are chosen at the last layers of each stage.

### **Experiment results**

- Comparison with State-of-the-arts
  - Comparisons to Training From-scratch Models

Model	Image size	# Params (M)	FLOPs (B)	mAP (%)
Tiny YOLOv2	$416 \times 416$	15.9	7.0	57.1
Tiny YOLOv3	$416 \times 416$	8.7	5.6	61.3
NAS-EOD @64	$320 \times 320$	6.0	1.2	65.4
NAS-EOD @128	$320 \times 320$	6.2	1.8	68.5

### Comparisons to ImageNet Pre-trained Model

Model	Image size	# Params (M)	FLOPs (B)	mAP (%)
MobileNetV2-SSDLite	$320 \times 320$	4.3	1.6	64.0
MobileNetV2-FPNLite @64	$320 \times 320$	2.0	1.5	66.4
MobileNetV2-FPNLite @128	$320 \times 320$	2.2	2.0	68.9
NAS-EOD @64	$320 \times 320$	6.0	1.2	68.5
NAS-EOD @128	$320 \times 320$	6.2	1.8	72.0

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