

ShakeDrop Regularization

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Contributions

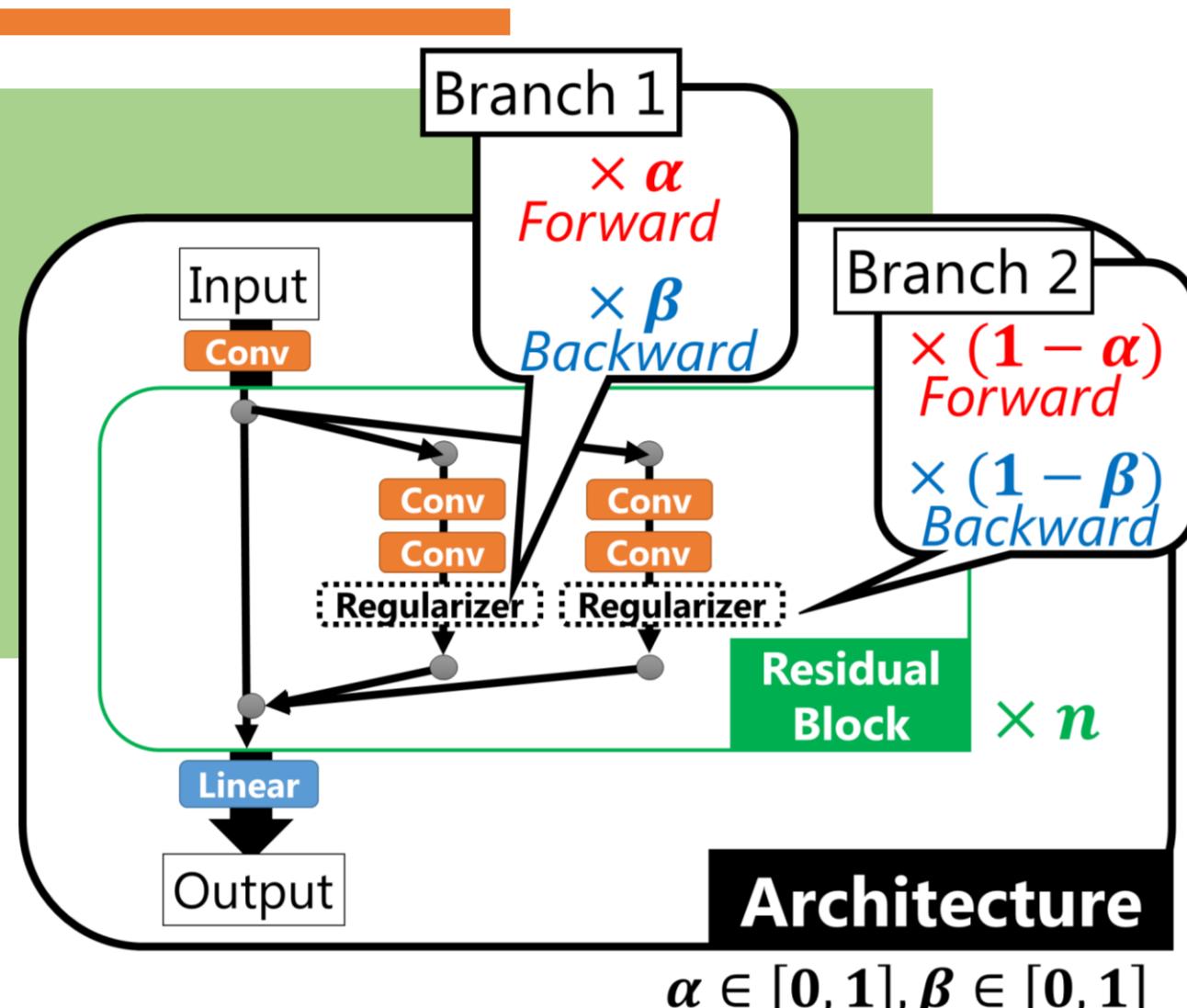
- We propose a new powerful regularization method, **ShakeDrop**, for improvements of ResNets architectures and achieved **state-of-the-art results** on image classification datasets, CIFAR-10/100 (as of Oct. 2017)
- We confirmed **ShakeDrop** stabilizes learning strongly disturbed by **multiplying even a negative factor** by regarding **StochasticDepth [1]** mechanism as a **probabilistic switch of two network architectures**

Regularization methods	1-branch networks				2-branch networks	
	ResNet	WideResnet	PyramidNet	ResNeXt		
StochasticDepth [1]	:(:(:(:(
Shake-Shake [2]	-	-	-	-		:(
ShakeDrop (ours)	:(:(:(:(

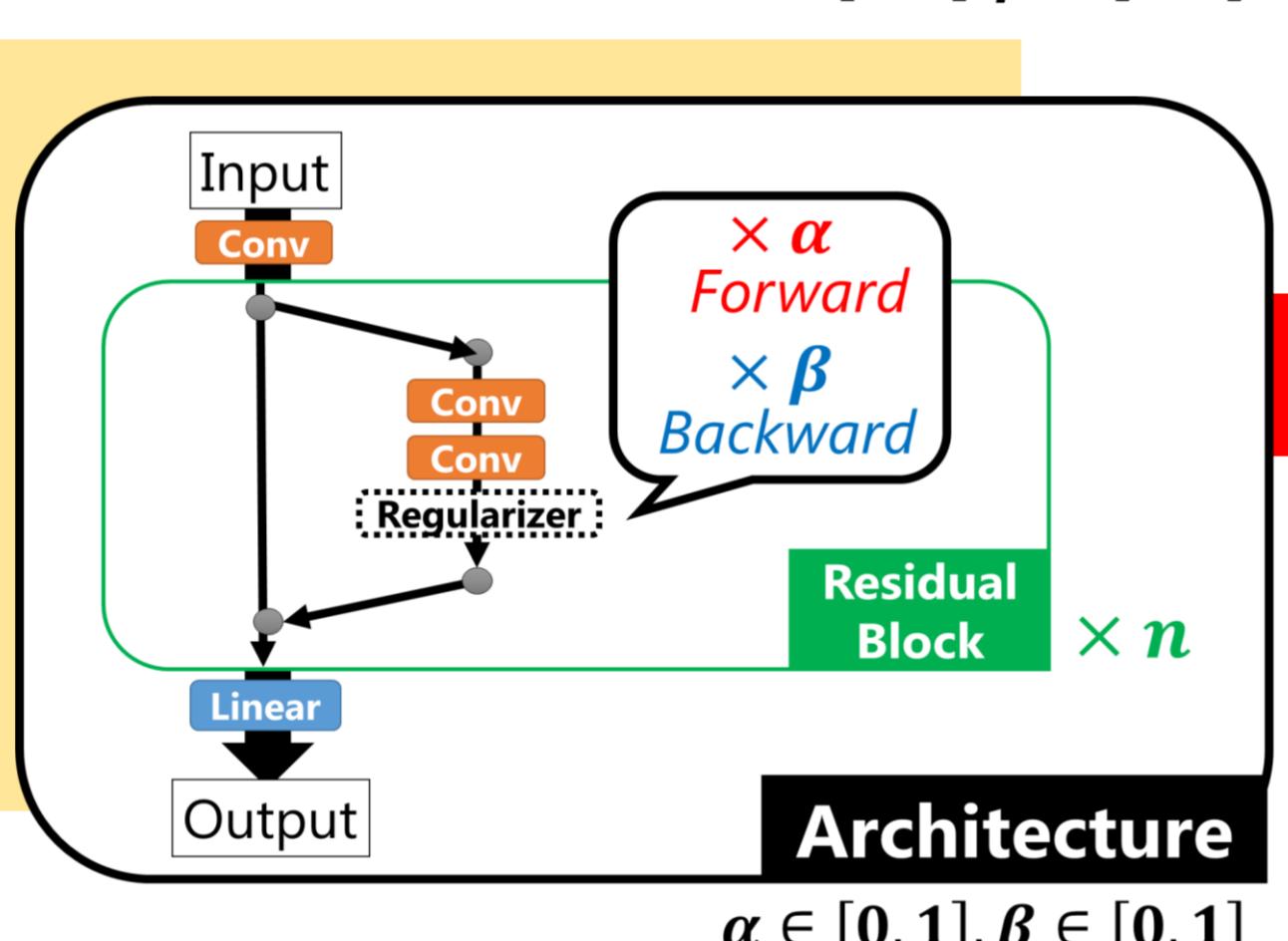


Architectures

- Shake-Shake [2]**
- For 2-branch networks
- High accuracy



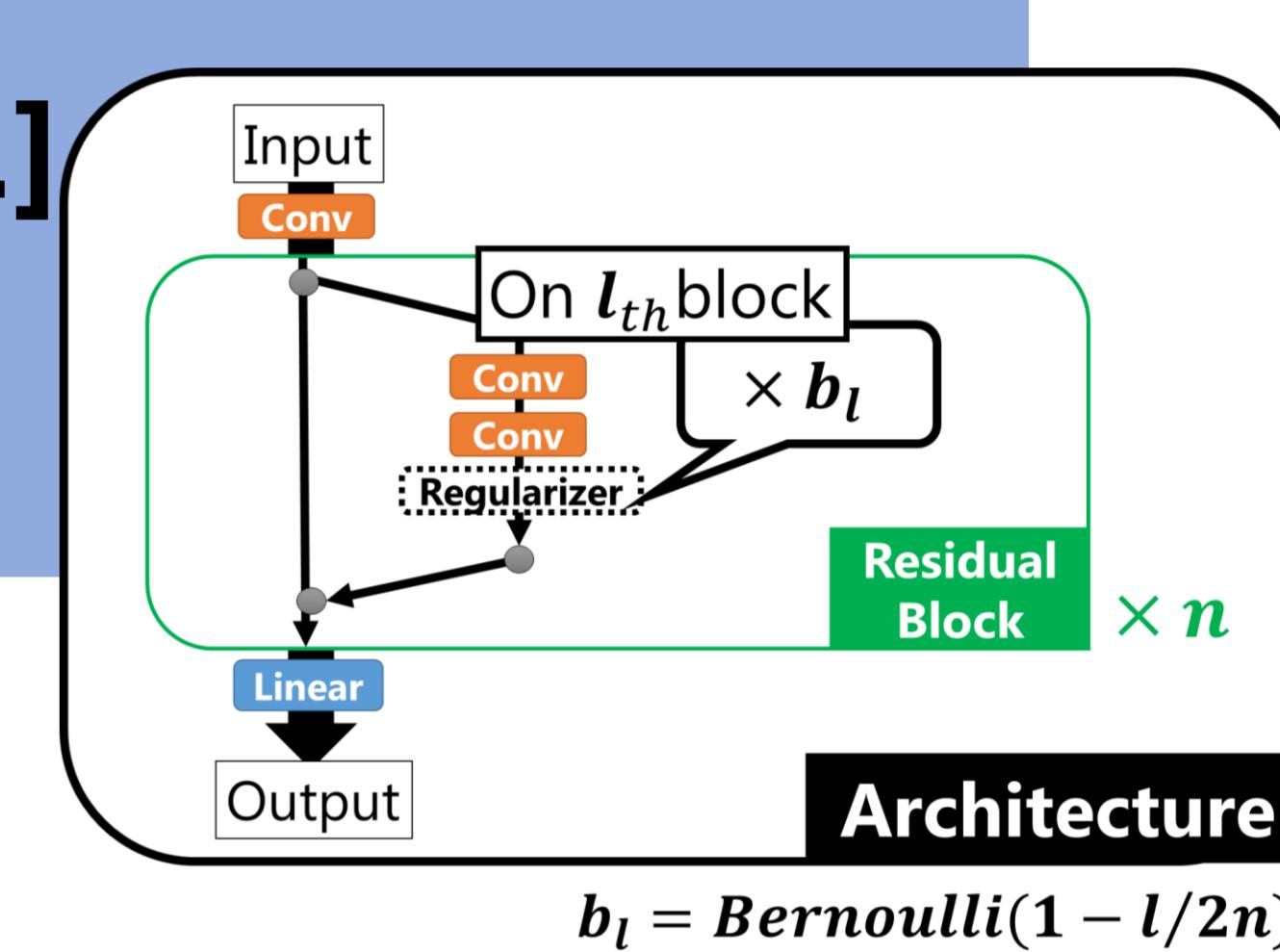
- 1-branch Shake**
(intermediate method)
- For any-branch networks
- Low accuracy



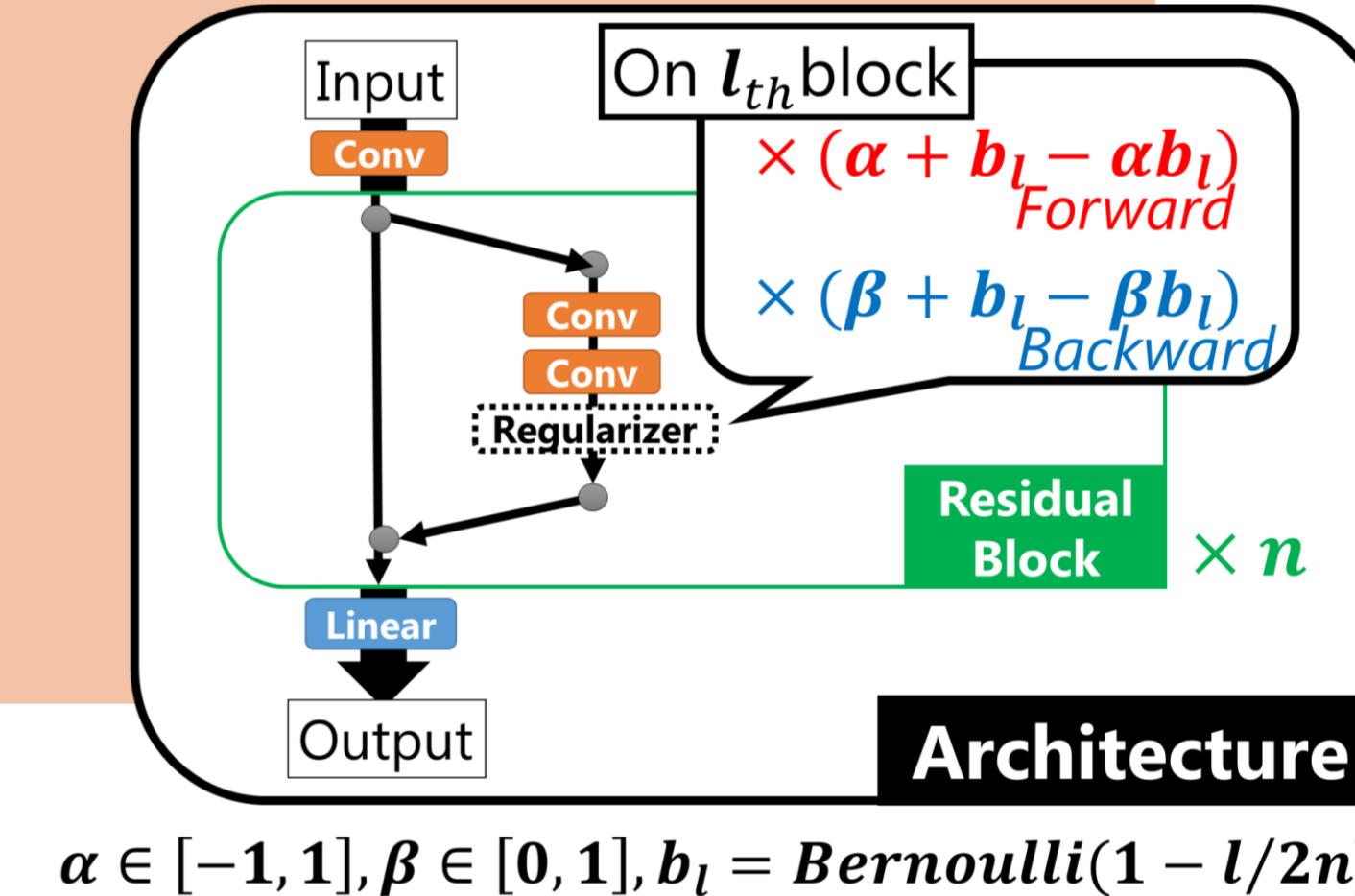
Comparison of Regularization methods

- StochasticDepth [1]**
- For any-branch networks
- Low accuracy

↓ Stabilize

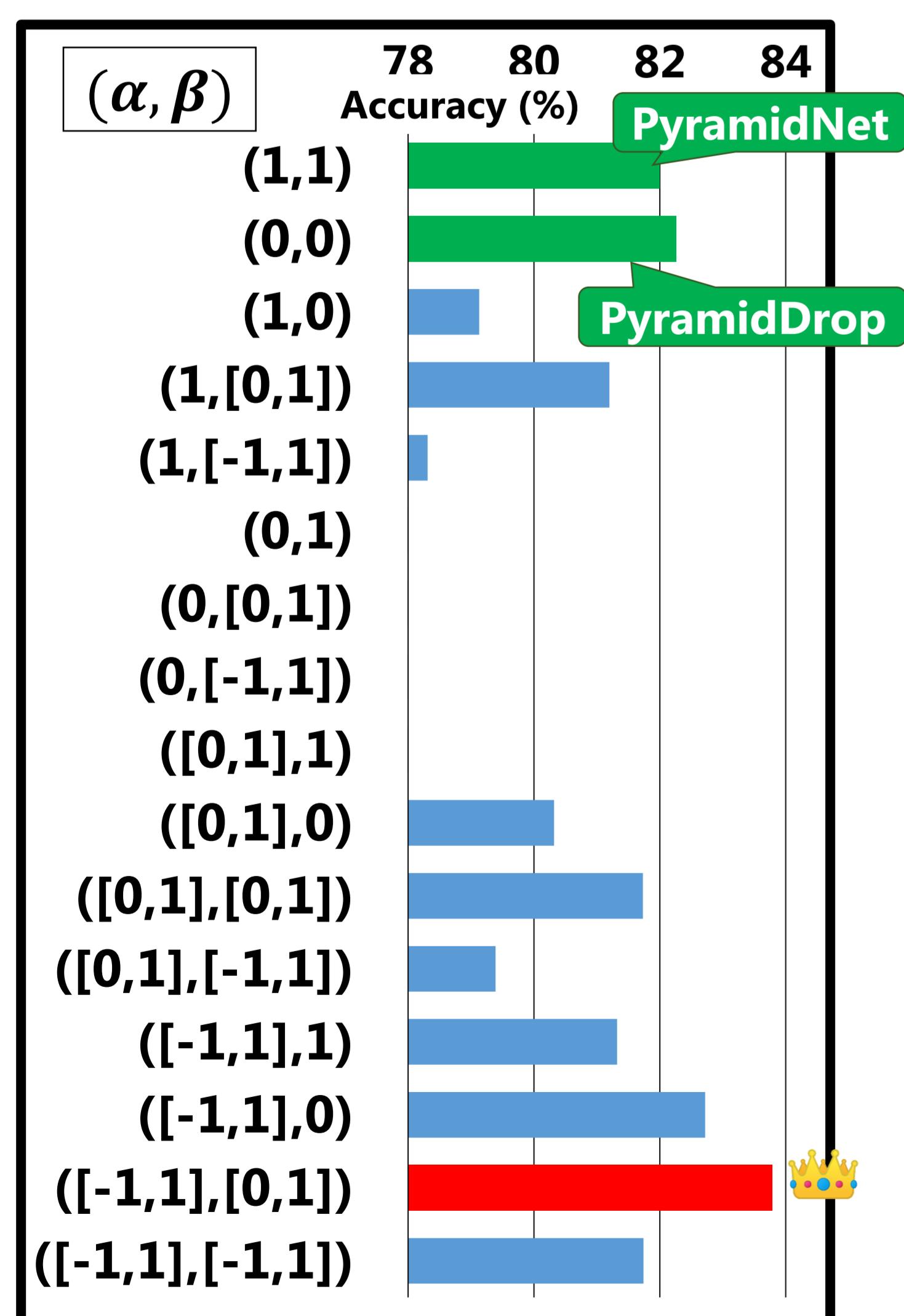


- ShakeDrop (proposed method)**
- For any-branch networks
- High accuracy



Experiments (image classification)

① Parameter Search

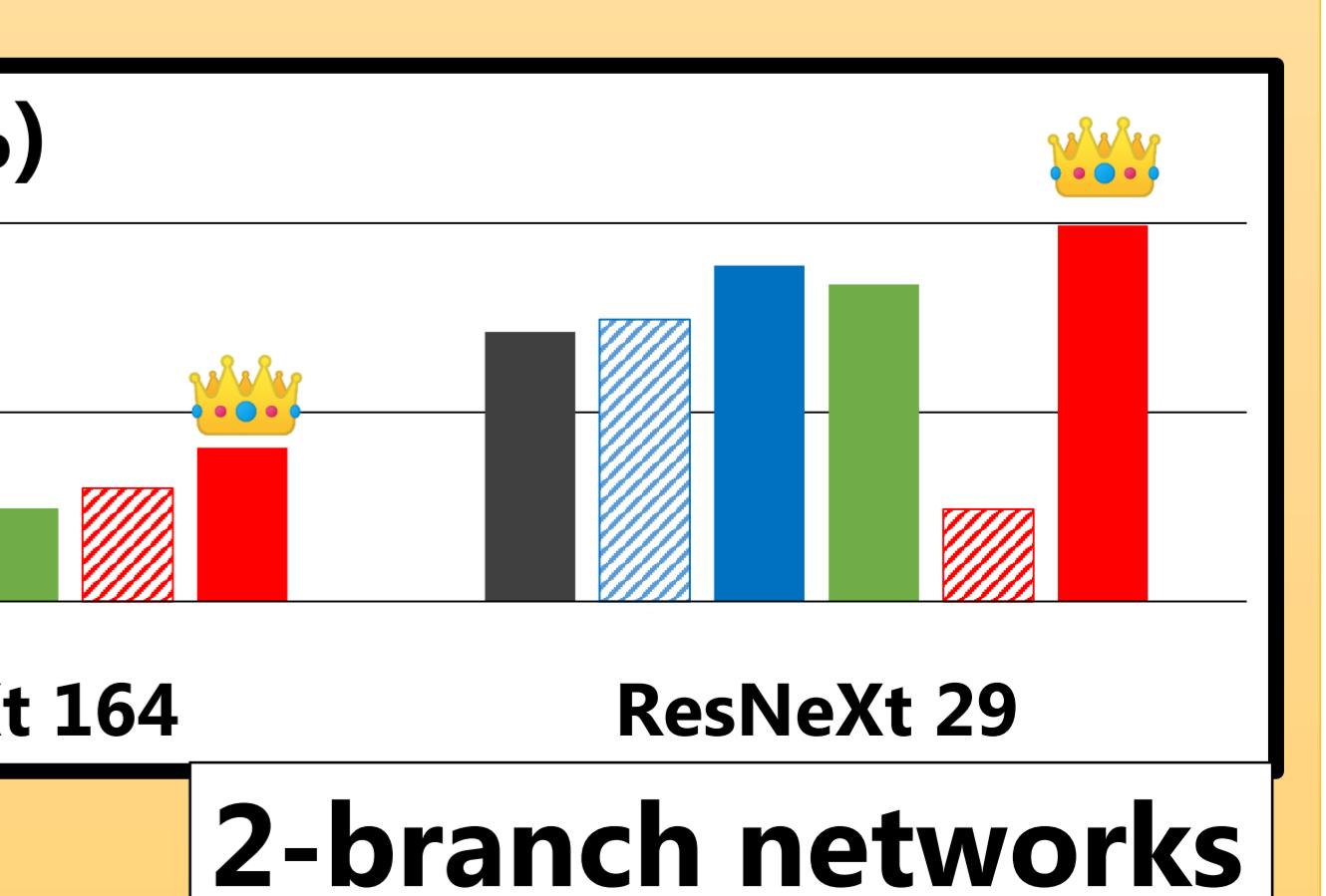
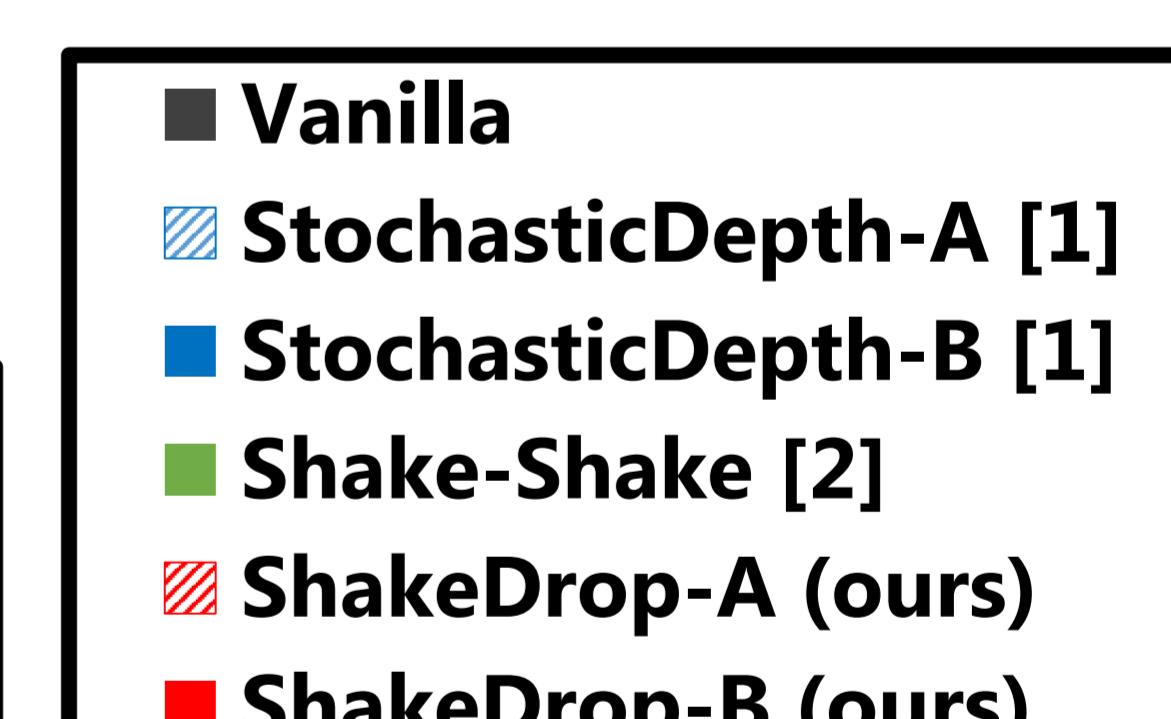
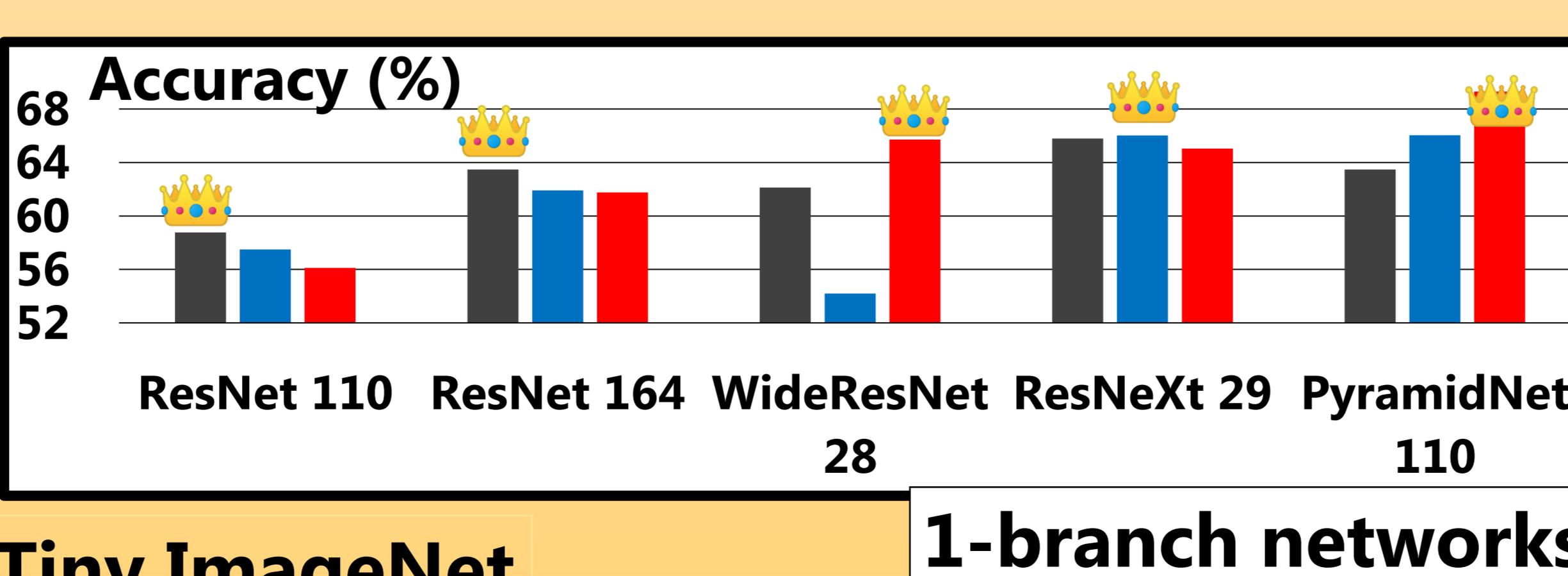
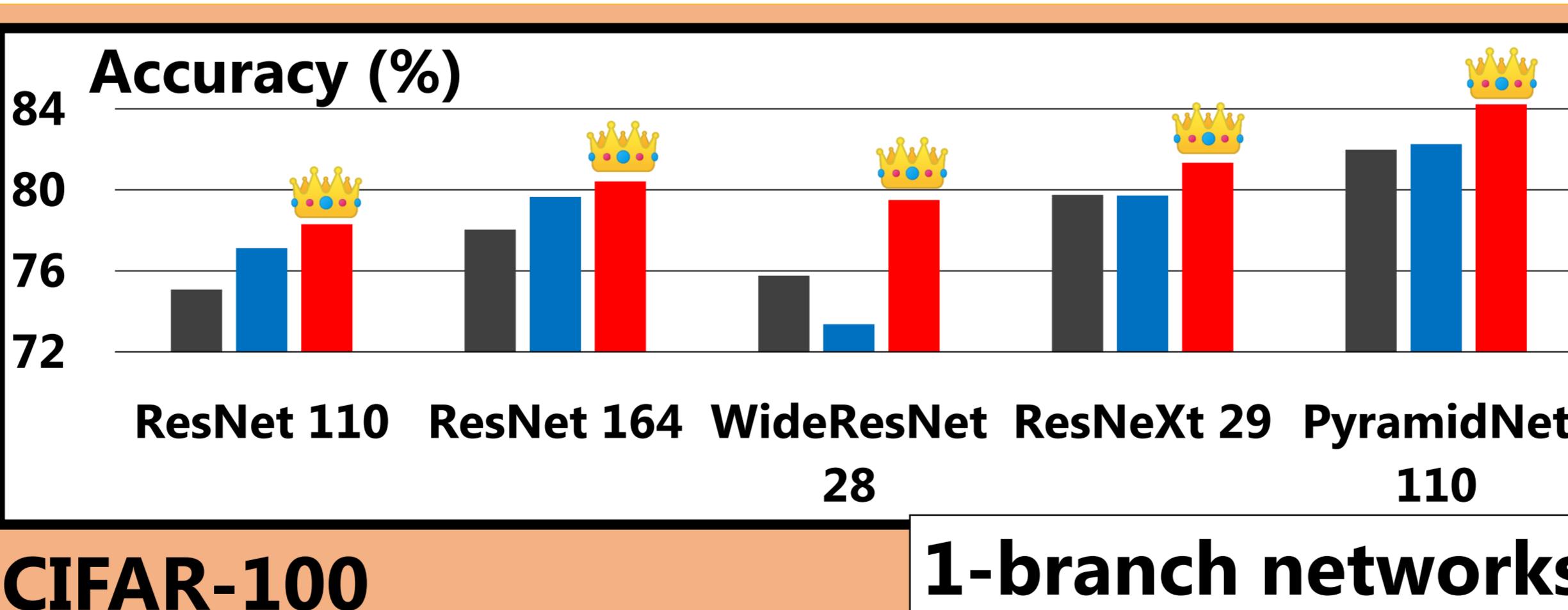


② Comparison with Baseline Methods

Best Parameters:

$$\alpha \in [-1, 1], \beta \in [0, 1]$$

- Vanilla
- StochasticDepth-A [1]
- StochasticDepth-B [1]
- Shake-Shake [2]
- ShakeDrop-A (ours)
- ShakeDrop-B (ours)



Best Parameters:
 $\alpha \in [-1, 1], \beta \in [0, 1]$

[1] Gao Huang, Yu Sun, Zhuang Liu, Daniel Sedra and Kilian Weinberger, "Deep Networks with Stochastic Depth," NIPS2016

[2] Xavier Gastaldi, "Shake-Shake Regularization of 3-branch Residual Networks," ICLR2017 workshop