# Artificial Intelligence: *Modeling Human Intelligence with Networks*

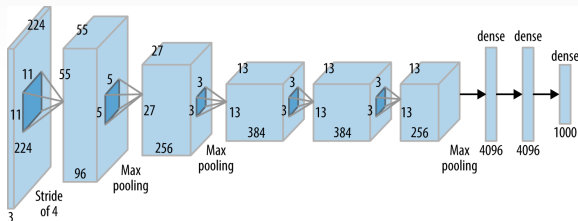Jeová Farias Sales Rocha Neto

`jeova_farias@brown.edu`

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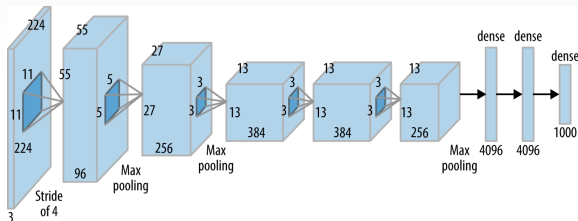
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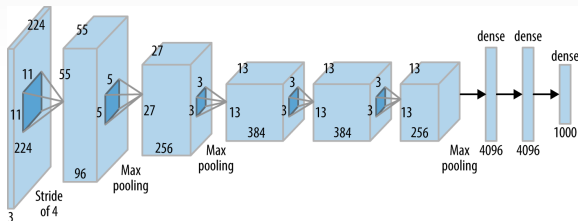
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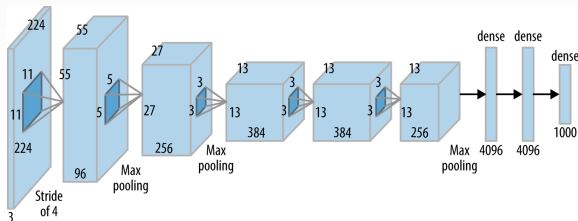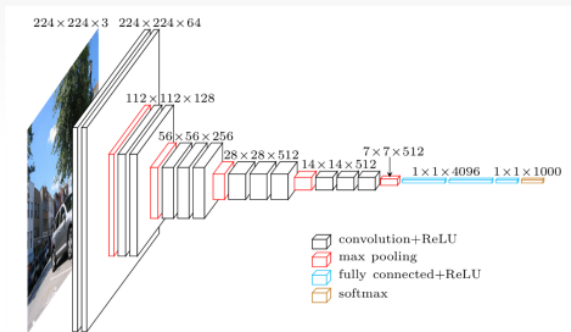- Training time:

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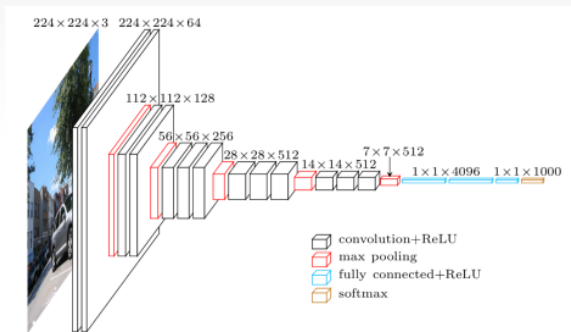
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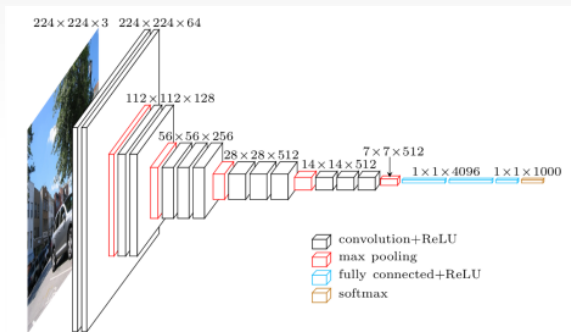
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- "Only" 25 million parameters (used a residual architecture).

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- Things about it:
  - ▸ More that 1.2 million images!
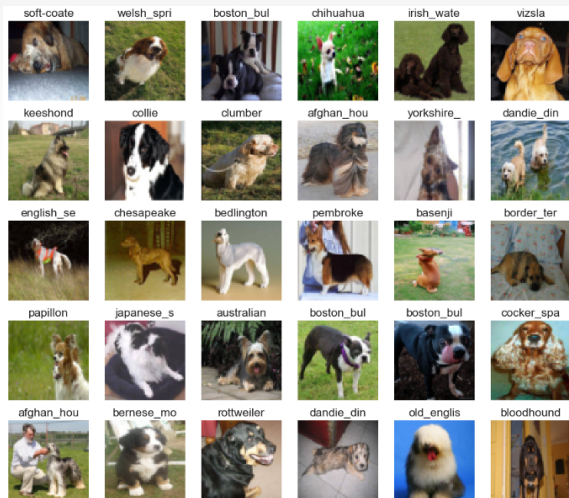  - ▸ 1000 classes (several hundred images per class)!
  - ▸ Very realistic images!

# Image Net
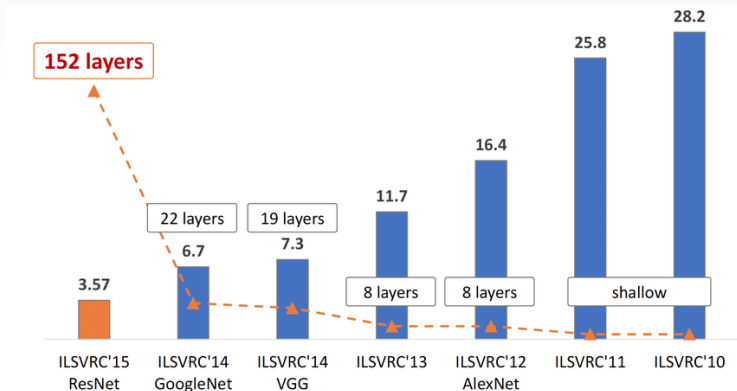
- For example:
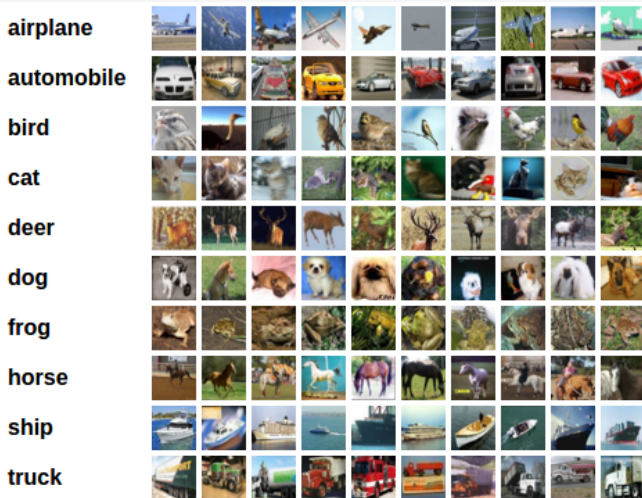
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- Here's the champions year by year (top-5 error rate):

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- But we can still use the *pre-trained* models with Keras!
- Keras offers ResNet (any some others) model, for example!
- Jupyter notebook! (Our last one...)