#### Ministério da Ciência, Tecnologia e Inovações



#### Centro Brasileiro de Pesquisas Físicas



# Redes Neurais profundas e aplicações Deep Learning

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### ResNet as an Emsemble of shallow nets

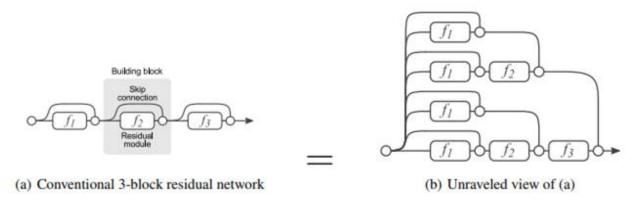


Figure 1: Residual Networks are conventionally shown as (a), which is a natural representation of Equation (1). When we expand this formulation to Equation (6), we obtain an *unraveled view* of a 3-block residual network (b). Circular nodes represent additions. From this view, it is apparent that residual networks have  $O(2^n)$  implicit paths doubles the number of paths.

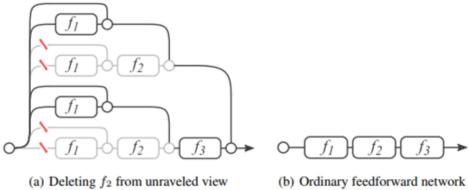


Figure 2: Deleting a layer in residual networks at test time (a) is equivalent to zeroing half of the paths. In ordinary feed-forward networks (b) such as VGG or AlexNet, deleting individual layers alters the only viable path from input to output.

A. Veit, M. Wilber and S. Belongie. Residual Networks Behave Like Ensembles of Relatively Shallow Networks. arXiv:1605.06431v2,2016.

### ResNet as an Emsemble of shallow nets

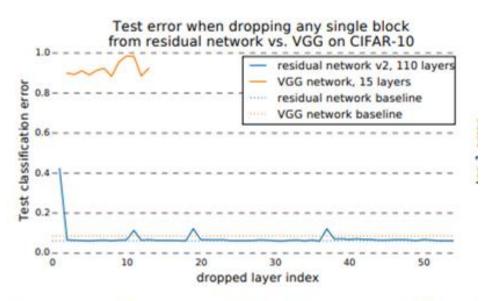
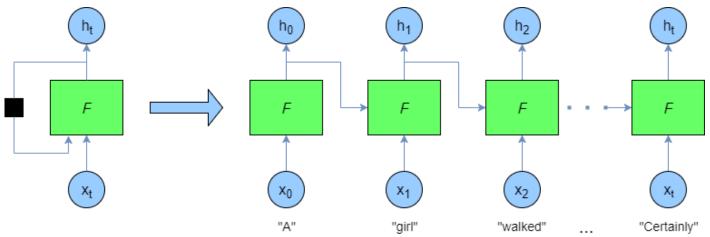


Figure 3: Deleting individual layers from VGG and a residual network on CIFAR-10. VGG performance drops to random chance when any one of its layers is deleted, but deleting individual modules from residual networks has a minimal impact on performance. Removing downsampling modules has a slightly higher impact.



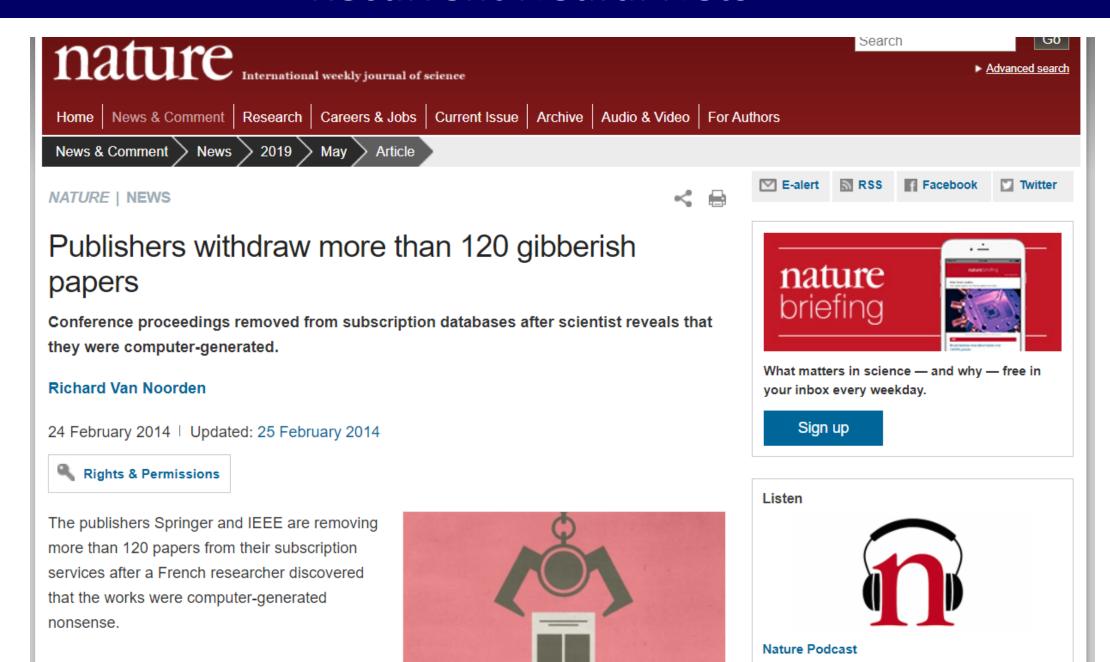
But .. there is the gradient vanishing problem ....

Long term correlations ....

Brazil is a great \_\_\_\_\_

"I have been staying in Brazil for the last 20 years. I can speak fluent \_\_\_\_\_."

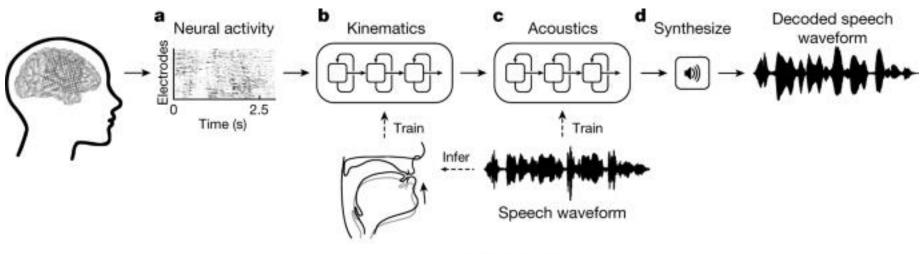


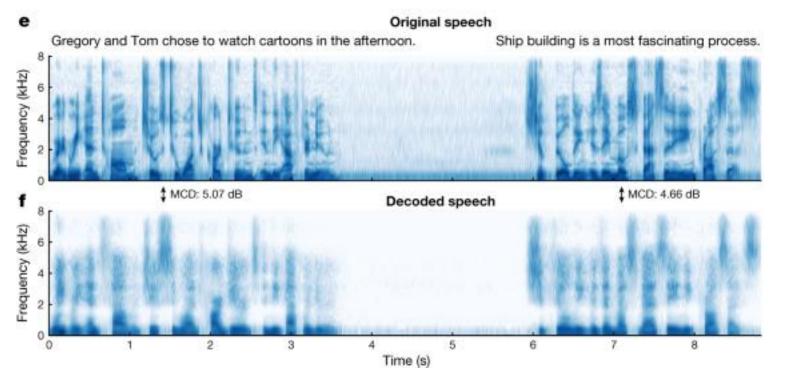


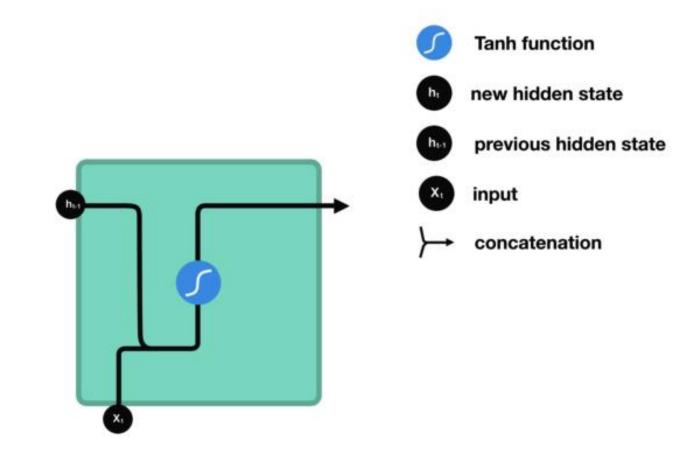
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## **Speech Synthesis**







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