
From: Joscha Bach [REDACTED]
Sent: Wednesday, October 11, 2017 5:56 PM
To: Jeffrey Epstein
Subject: Re:

After skimming their paper, the idea seemed unexciting to me at first: basically, if we have enough feature dimensions we can almost always find a linear separation. This is also related to how Support Vector machines work: they project the data into an extremely high-dimensional space, find a separating hyperplane with linear regression, and then project that plane back into the original space as the separator. A similar idea is behind Echo State networks, which use a randomly wired recurrent neural network and then only train the output layer with a single linear regression. The authors take an existing trained neural network, and whenever it makes a mistake, they train a linear classifier on the network state and data, i.e. they try to find out when the network goes wrong. Instead of improving the network (which is also likely to make it worse in other cases), they add an additional layer to it. For engineering, this makes a lot of sense, because large neural networks are cheap to use and employ but expensive to train.

On a more philosophical level, it is tempting to ask if that might be a general learning principle for brains: when you don't perform well, add more control structure on top. It probably makes sense whenever you are confident that training the existing structure won't improve it that much, but unless training the weights in an existing network, it also adds quite a few milliseconds to the processing time. There is probably an optimal tradeoff for this. The other thing is that the new layer is a linear classifier only (at least in this paper), and it is creating a local override on the system's results, instead of integrating with it, somewhat similar to how reasoning might override our subconscious behavior. One of the drawbacks is that this won't allow us to use the new layer for simulating/understanding the structure of the domain modeled by the rest of the network.

– Joscha

> On Oct 10, 2017, at 09:43, jeffrey E. <jeevacation@gmail.com> wrote:

>
> <https://www.sciencedaily.com/releases/2017/08/170821102725.htm>
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