Tips on neuralnet design

Reminds of the age when "quantization" was discovered in quantum physics

- 1. Write down the Hamiltonian of a system
- 2. Quantization of the Hamiltonian
- 3. Solve the Schrodinger equation

Same applies to neural net design?

- 1. Write down the "traditional" solution / algorithm
- 2. Identify the functions/components that could be switched out by neural network
 - Functions that can be learned with data (either existing or generatable (reinforcement framework)
 - Match with a repertoire of models
 - e.g. CNN for image, RNN for sequence, VAE for generative system
 - Applying tricks to neural network, e.g.
 - Collocation of information (e.g. channel in image processing)
 - Net-merger
 - Objective function customization

Scenario to use deep learning

- large amount of data
 - either existing or could be generated by rules

Scenario NOT to use deep learning

• deep / contextual understanding is required

List of unanswered questions

- 1. To what extent can the network learning be transferred?
 - CIFAR10 for medical image? astronomimcal images?
- 2. What do we build an effective model management system
 - Repository/catalogue of neural networks
- 3. How much data is enough to learn the function?
- 4. How do we find the hyperparameters?
 - structural, e.g. number of neurons, number of layers; optimizer, e.g. learning rate, momentum; initialization
- 5. How to reduce the computing power needed
 - e.g. Less parameters with performance trade-off (no one knows the trade-off curve)
- 6. How to synergize with other technology
 - e.g. robotics
- 7. How to incorporate knowledge
 - Through data
- 8. Resillence
 - How do we make a resilent network (to attack)
 - model averaging ?
- 9. Better methodology to control/incorporate the sub-nets / layers
- 10. How to extract "knowledge" (itself a fuzzy definition) from neural network
 - e.g. convert to decision tree, rules
- 11. What are the other possible useful deep layers representation? Can we design / control them?
 - think neural style transfer uses VGG. What others to use?
- 12. Further development of drop-out like technique
- 13. Further development of net-merger technique
 - A. "Circuit tester"?
- 14. Further development of dynamic neural network topology
- 15. ... (many many more) ...

Neural network and Scientific method

- Is it Science that we use a method is unfalsifiable?
- Are we heading (again) into Big science?
 - e.g. NASA / CERN, no other people can check their result
 - Neural network uses a lot of computing power

How to get a cheap paper in deep learning field

• Take one of the formula and slightly improve it

How to get a decent paper in deep learning field

• Come out with an architecture that fit with the data, generalize

How to get a good paper in deep learning field

- Cocktail with other algorithms
- AlphaZero = (ResNet + Reinforcement learning + MCTS)
- Variational autoencoder = (Generative network + Latent Gaussian mixture model + Variational bayesian)
- NEAT = (Simple) Neural network + Genetic algorithm

How to get a great paper in deep learning field

- Theorectical research
- Transfer concept from other fields