#### **Project types**

- 1. Apply existing neural network model to a new task
- 2. Implement a complex neural architecture
- 3. Come up with a new neural network model
- 4. Theory of deep learning, e.g. optimization

- 1. Define Task:
  - Example: Summarization
- 2. Define Dataset
  - 1. Search for academic datasets
    - They already have baselines
    - E.g.: Document Understanding Conference (DUC)
  - 2. Define your own (harder, need more new baselines)
    - If you're a graduate student: connect to your research
    - Summarization, Wikipedia: Intro paragraph and rest of large article
    - Be creative: Twitter, Blogs, News

- 3. Define your metric
  - Search online for well established metrics on this task
  - Summarization: Rouge (Recall-Oriented Understudy for Gisting Evaluation) which defines n-gram overlap to human summaries
- 4. Split your dataset!
  - Train/Dev/Test
  - Academic dataset often come pre-split
  - Don't look at the test split until ~1 week before deadline!
     (or at most once a week)

- 5. Establish a baseline
  - Implement the simplest model (often logistic regression on unigrams and bigrams) first
  - Compute metrics on train AND dev
  - Analyze errors
  - If metrics are amazing and no errors: done, problem was too easy, restart:)
- 6. Implement existing neural net model
  - Compute metric on train and dev
  - Analyze output and errors
  - Minimum bar for this class

- 7. Always be close to your data!
  - Visualize the dataset
  - Collect summary statistics
  - Look at errors
  - Analyze how different hyperparameters affect performance
- 8. Try out different model variants
  - Soon you will have more options
    - Word vector averaging model (neural bag of words)
    - Fixed window neural model
    - Recurrent neural network
    - Recursive neural network
    - Convolutional neural network

## **Class Project: A New Model -- Advanced Option**

- Do all other steps first (Start early!)
- Gain intuition of why existing models are flawed
- Talk to researcher/mentor, come to project office hours a lot
- Implement new models and iterate quickly over ideas
- Set up efficient experimental framework
- Build simpler new models first
- Example Summarization:
  - Average word vectors per paragraph, then greedy search
  - Implement language model (introduced later)
  - Stretch goal: Generate summary with seq2seq!

#### **Project Ideas**

- Summarization
- NER, like PSet 2 but with larger data

  Natural Language Processing (almost) from Scratch, Ronan Collobert, Jason Weston, Leon Bottou, Michael Karlen, Koray Kavukcuoglu, Pavel Kuksa, http://arxiv.org/abs/1103.0398
- Simple question answering, <u>A Neural Network for Factoid Question Answering over</u>
   <u>Paragraphs</u>, Mohit Iyyer, Jordan Boyd-Graber, Leonardo Claudino, Richard Socher and Hal Daumé III (EMNLP 2014)
- Image to text mapping or generation,

  <u>Grounded Compositional Semantics for Finding and Describing Images with Sentences</u>, Richard Socher, Andrei

  Karnathy, Oues V. Le Christenber, D. Manning, Andrew V. Ng. (TACL 2014)

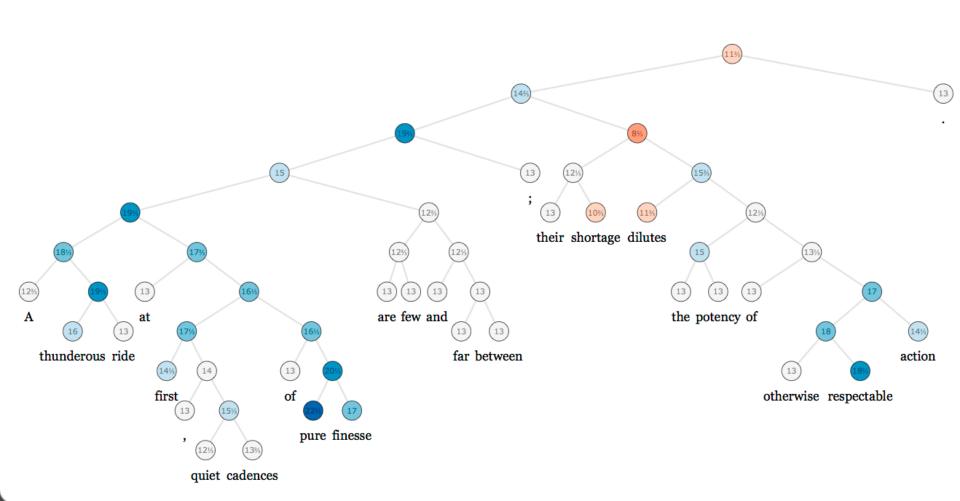
Karpathy, Quoc V. Le, Christopher D. Manning, Andrew Y. Ng. (TACL 2014) or

- Deep Visual-Semantic Alignments for Generating Image Descriptions, Andrej Karpathy, Li Fei-Fei
- Entity level sentiment
- Use DL to solve an NLP challenge on kaggle,

  Develop a scoring algorithm for student-written short-answer responses, <a href="https://www.kaggle.com/c/asap-sas">https://www.kaggle.com/c/asap-sas</a>

#### **Another example project: Sentiment**

- Sentiment on movie reviews: <a href="http://nlp.stanford.edu/sentiment/">http://nlp.stanford.edu/sentiment/</a>
- Lots of deep learning baselines and methods have been tried



#### **Next up**

- Some fun and fundamental linguistics with syntactic parsing
- TensorFlow lecture (for Ass.2 ) also useful for projects and life : )