Assignment 1

- Is now available!

- Asks you to implement a set of neural dependency parsers.

- Due on Oct. 7th, at 11:59 pm.
Assignment 1

- Note: Remote GPU access on teach.cs is currently unavailable due to an ongoing system upgrade.

- An announcement will be made on Piazza if this changes.
Assignment 1

- Part 1: Transition-based dependency parser

- Part 2: Graph-based dependency parser
Assignment 1

- Part 1: Transition-based dependency parser
  - We will focus on this part today.

- Part 2: Graph-based dependency parser
Outline

- Dependency Parsing Example
  - Obtaining the necessary parsing steps for a dependency tree.

- Gap Degree Example

- Neural Dependency Parser
  - With PyTorch pointers 😊
Transition-based Parser - Review

- Dependency parser: Given a sentence, output a dependency parse tree.

- Three things to keep track of:
  1. A stack of words being processed.
  2. A buffer of words to be eventually pushed onto the stack.
  3. A list of predicted dependencies (i.e. arcs).
Transition-based Parser - Review

- Three possible operations:
  1. **SHIFT**: removes the first word from the buffer and pushes it onto the stack.
  2. **LEFT-ARC**: marks the second-from-top item (i.e., second-most recently added word) on the stack as a dependent of the first item and removes the second item from the stack.
  3. **RIGHT-ARC**: marks the top item (i.e., most recently added word) on the stack as a dependent of the second item and removes the first item from the stack.
SHIFT Operation

- Removes the first word from the buffer and pushes it onto the stack.

- Step T:
  - Stack: [ROOT, John, saw]; Buffer: [dogs, yesterday]

- Step T+1:
  - Stack: [ROOT, John, saw, dogs]; Buffer: [yesterday]
  - Action: SHIFT
LEFT-ARC Operation

- Marks the second-from-top item (i.e., second-most recently added word) on the stack as a dependent of the first item and removes the second item from the stack.

- Step T:
  - Stack: [ROOT, John, saw]; Buffer: [dogs, yesterday]

- Step T+1:
  - Stack: [ROOT, saw]; Buffer: [dogs, yesterday]
  - New Dependency: saw -> John, nsubj
  - Action: LEFT-ARC
RIGHT-ARC Operation

- Marks the top item (i.e., most recently added word) on the stack as a dependent of the second item and removes the first item from the stack.

- Step T:
  - Stack: [ROOT, saw, dogs]; Buffer: [yesterday]

- Step T+1:
  - Stack: [ROOT, saw]; Buffer: [yesterday]
  - New Dependency: saw -> dogs, dobj
  - Action: RIGHT-ARC
Dependency Parse Example

- Given a dependency tree, figure out the intermediate parsing steps.
- Check the top of your stack to see whether it is appropriate to create an arc.
- After creating an arc, record it, and then remove the dependent word from the stack.
Dependency Parse Example

- Step 0:
  - Stack: [ROOT]; Buffer: [John, saw, dogs, yesterday]
Dependency Parse Example

- **Step 0:**
  - **Stack:** [ROOT];  **Buffer:** [John, saw, dogs, yesterday]

- **Step 1:**
  - **Stack:** [ROOT, John];  **Buffer:** [saw, dogs, yesterday]
  - **New Dependency:** None
  - **Action:** SHIFT
Dependency Parse Example

- From Step 1:
  - **Stack**: [ROOT, John]; **Buffer**: [saw, dogs, yesterday]

- Step 2:
  - **Stack**: [ROOT, John, saw]; **Buffer**: [dogs, yesterday]
  - **New Dependency**: None
  - **Action**: SHIFT
Dependency Parse Example

- From Step 2:
  - Stack: [ROOT, John, saw]; Buffer: [dogs, yesterday]

- Step 3:
  - Stack: [ROOT, saw]; Buffer: [dogs, yesterday]
  - New Dependency: saw \rightarrow John, nsubj
  - Action: LEFT-ARC

For this assignment:
Choose LEFT-ARC over SHIFT when both are valid and generate the same tree.
Dependency Parse Example

- From Step 3:
  - Stack: [ROOT, saw]; Buffer: [dogs, yesterday]

- Step 4:
  - Stack: [ROOT, saw, dogs]; Buffer: [yesterday]
  - New Dependency: None
  - Action: SHIFT
Dependency Parse Example

- From Step 4:
  - **Stack**: [ROOT, saw, dogs]; **Buffer**: [yesterday]

- Step 5:
  - **Stack**: [ROOT, saw]; **Buffer**: [yesterday]
  - **New Dependency**: saw \( \rightarrow \) dogs, dobj
  - **Action**: RIGHT-ARC
Dependency Parse Example

- From Step 5:
  - **Stack**: [ROOT, saw];  **Buffer**: [yesterday]

- Step 6:
  - **Stack**: [ROOT, saw, yesterday];  **Buffer**: []
  - **New Dependency**: None
  - **Action**: SHIFT
Dependency Parse Example

- From Step 6:
  - Stack: [ROOT, saw, yesterday]; Buffer: []

- Step 7:
  - Stack: [ROOT, saw]; Buffer: []
  - New Dependency: saw $\rightarrow$ yesterday, npadvmod
  - Action: RIGHT-ARC
Dependency Parse Example

- From Step 7:
  - Stack: [ROOT, saw]; Buffer: []

- Step 8:
  - Stack: [ROOT]; Buffer: []
  - New Dependency: ROOT -> saw, root
  - Action: RIGHT-ARC
We’ve figured out all the parsing steps!

Similar exercise in the assignment.

How to do this algorithmically? What are the conditions?
The gap degree of a word in a dependency tree is the least $k$ for which the subsequence consisting of the word and its descendants (both direct and indirect) is entirely comprised of $k + 1$ maximally contiguous substrings. Equivalently, the gap degree of a word is the number of gaps in the subsequence formed by the word and all of its descendants, regardless of the size of the gaps.

The gap degree of a dependency tree is the greatest gap degree of any word in the tree.
Gap Degree Example

For each word, check the substring consisting itself and all its descendants:
- ROOT: ROOT John saw dogs yesterday
- John: John
- saw: John saw dogs yesterday
- dogs: dogs
- yesterday: yesterday

All substrings are contiguous! \( k = 0 \)
Neural Dependency Parser

- Now assume we don’t have the dependency tree.
Now assume we don’t have the dependency tree.

When do we need to make decisions when parsing?
Neural Dependency Parser

Suppose we have the following partial parse:
- Stack: [ROOT, John, saw]; Buffer: [dogs, yesterday]

Now we need to decide which transition to do next:
- **SHIFT**: Shift dogs onto the stack
- **LEFT-ARC**: create the arc: saw -> john
- **RIGHT-ARC**: create the arc john -> saw
Neural Dependency Parser

ROOT  John  saw  dogs  yesterday

- Use a neural network to make a prediction at each parse step.
- Implement this in PyTorch, read the docs if you’re not familiar:
Neural Dependency Parser

ROOT  John  saw  dogs  yesterday

- Input: Word level features (e.g. word embeddings) for each word in the sentence.
  - `torch.nn.Embedding(size, shape)`
  - `torch.nn.Embedding.from_pretrained(...)`
    - Make sure you DON'T freeze the pre-trained embeddings!!
Neural Dependency Parser

ROOT John saw dogs yesterday

- Input: Word level features (e.g. word embeddings) for each word in the sentence.
- One linear (fully-connected) hidden layer.
  - hidden_layer = torch.nn.Linear(input_size, output_size)
  - To apply: hidden_layer(features)
- Also checkout torch.nn.relu(...) and torch.nn.dropout(...)
Neural Dependency Parser

ROOT  John  saw  dogs  yesterday

- Input: Word level features (e.g. word embeddings) for each word in the sentence.
- One linear (fully-connected) hidden layer.
- A softmax layer to obtain a probability distribution over transitions.
Neural Dependency Parser

- Suppose our neural network gives us an answer:
  a) **SHIFT**: Shift dogs onto the stack
  b) **LEFT-ARC**: create the arc: saw -> john
  c) **RIGHT-ARC**: create the arc john -> saw

- How can we tell whether we have made the right choice?
How can we tell whether we have made the right choice?
- Implement an "oracle" that peaks into the parsed tree and tells us the correct transition to make.

Think about the first example we did in this tutorial.
- How to make the process automatic?
- What conditions need to be met to make a particular transition?
To be continued...

- The transition-based parser can only handle projective parse trees (think about why this is the case).

- Next time, we will look at graph-based dependency parsing, which accounts for non-projective trees.