(D) Pay Attention (1/2) [10 Points]

The meaning of a word depends on its context. For example, in the sentence “The farmer seeded the field with corn,” the word seeded means “added seeds to.” However, in the sentence “The chef seeded the tomato,” the word seeded means “took seeds away from.” Similarly, bat means different things in “The baseball player swung the bat” vs. “The bat flew through the air.”

If you were building a model of language, how would you get it to recognize the way that a word’s meaning depends on context? One popular technique for achieving this goal is a mechanism called attention. In the way that attention is implemented in current state-of-the-art models of language, the model has a large number of attention heads, each of which is denoted by a pair of numbers (for examples, 8-10). When the model processes a sentence, for every pair of words in the sentence, each head calculates the “relatedness” of the two words.

The one wrinkle is that we do not know what exactly “relatedness” should mean, so instead of telling the model how to define “relatedness,” we let the model learn its own definition of relatedness. Recently, computer scientists have started to analyze what these attention heads have learned, and this analysis shows that they often reflect linguistic information! For example, here’s the output of one attention head (head 8-10) when we feed the following sentence into BERT\(^1\), which is one of the most popular models that uses attention heads:

**Example:** 
I\(_1\) see\(_2\) my\(_3\) sister\(_4\), but\(_5\) she\(_6\) can’t\(_7\) see\(_8\) me\(_9\) because\(_{10}\) she\(_{11}\) is\(_{12}\) reading\(_{13}\) a\(_{14}\) linguistics\(_{15}\) book\(_{16}\).

**Output:** 
4 → 2, 9 → 8, 16 → 13

This output signifies that head 8-10 connects word #4 (sister) to word #2 (see), as well as word #9 (me) to word #8 (see) and word #16 (book) to word #13 (reading). If you consider what all of those pairs of words have in common, you’ll see that each one is a verb and its direct object: sister is the direct object of the first instance of see, me is the direct object of the second instance of see, and book is the direct object of reading. It appears that head 8-10 has learn to connect verbs to their objects! (Note that these activations are directional; for example, word #2 is not connected to word #4.)

Why is this information useful? If we go back to the example with the verb seed, this sort of information can help the model figure out which version of seed is being used: If its direct object is something like field or lawn, then it probably means “to add seeds to;” if its direct object is something like tomato or watermelon, then it probably means “to take seeds away from.” Of course, one sentence isn’t enough to draw strong conclusions. Instead, computer scientists tend to use a corpus, or a database, of example sentences to find patterns in the data. On the next page is a small corpus, the NacloWeb Corpus\(^1\), which has 7 sentences.

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\(^1\) Some sentences derived from data in the English Web Treebank.
(D) Pay Attention (2/2)

NacloWeb Corpus
1. My experience with Gelda's House of Gelbelgarg has been extremely wonderful.
2. We use Google's models to delve into the inner workings of language.
3. At this corporation's meeting people are concerned about the company's plans.
4. In July we will interview the candidate and review her résumé again.
5. The platypus is a strange animal, with its eggs and its webbed feet.
6. I think that although my NACLO exam was difficult, it was a lot of fun.
7. Linguistics is a beautiful science that provides interdisciplinary insight into the human experience.

Note that the NacloWeb corpus treats the possessive element 's as a separate word. (So in Sentence #1, word #5 is 's and word #6 is House.)

In our experiment on the NacloWeb Corpus, we ran each of the corpus' sentences through BERT and recorded the outputs of four attention heads (8-11, 7-6, 9-6, and 5-4). Unfortunately, due to some extremely sloppy experimental procedure, we don’t remember in which order we ran them through the model; in addition, we forgot to record some data. Your job is to fill in the blanks! Note that some blanks may have more than one connection, and some may have none at all.

<table>
<thead>
<tr>
<th>Sentence</th>
<th>8-11</th>
<th>7-6</th>
<th>9-6</th>
<th>5-4</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sentence A</td>
<td>12 → 13</td>
<td>5 → 7</td>
<td>14 → 15</td>
<td>10 → 7, 5 → 1</td>
</tr>
<tr>
<td>Sentence B</td>
<td>(a)</td>
<td>8 → 9, 11 → 13</td>
<td>7 → 9, 7 → 13</td>
<td>8 → 2, 11 → 2</td>
</tr>
<tr>
<td>Sentence C</td>
<td>2 → 3, 10 → 11</td>
<td>4 → 5, 12 → 13</td>
<td>(b)</td>
<td>11 → 3</td>
</tr>
<tr>
<td>Sentence D</td>
<td>(c)</td>
<td>4 → 5</td>
<td>12 → 13, 8 → 11</td>
<td>None</td>
</tr>
<tr>
<td>Sentence E</td>
<td>3 → 5, 11 → 13</td>
<td>(d)</td>
<td>10 → 13</td>
<td>5 → 1</td>
</tr>
<tr>
<td>Sentence F</td>
<td>(e)</td>
<td>1 → 2, 5 → 6</td>
<td>7 → 8, 3 → 6</td>
<td>None</td>
</tr>
<tr>
<td>Sentence G</td>
<td>(f)</td>
<td>(g)</td>
<td>(h)</td>
<td>(l)</td>
</tr>
</tbody>
</table>

D1. Identify sentences A-G. Record your answers in the Answer Sheets.

D2. Fill in the missing data in the table in the Answer Sheets.