| CSE471/598 | NL2KR | Project |
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| COLTITION | 11111111 | 1 I O JCCC |

CSE471/598 NL2KR Project

| REVISION HISTORY | | | | | |
|------------------|------|-------------|------|--|--|
| NUMBER | DATE | DESCRIPTION | NAME | | |
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Contents

| 1 | Sentence 1 | 1 |
|---|-----------------------------|----|
| 2 | Sentence 2 | 2 |
| 3 | Sentence 3 | 3 |
| 4 | Sentence 4 | 4 |
| 5 | Sentence 5 | 5 |
| 6 | Building Lambda Definitions | 6 |
| 7 | Learning | 7 |
| 8 | Conclusion | 11 |

I broke the project into 4 phases to Train and Learn. I processed each sentence shown below.

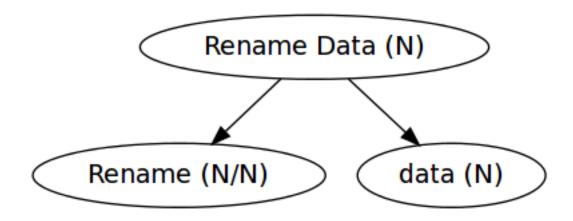
1 Sentence 1

Grammar for Rename data (1)

```
sentence=Rename data
syntaxFile=./examples/sample/syntax.txt
```

```
Tree number 1:
nl2kr_child_left("t_3","t_1")
  nl2kr_token("t_3", "Rename data", "N", -1)
  nl2kr_token("t_2","data","N",-1) #2
  nl2kr_child_right("t_3", "t_2")
  nl2kr_valid_rootNode("t_3")
  Tree number 2:
  nl2kr_token("t_3", "Rename data", "((S\\NP)\\((S\\NP))", -1)
  nl2kr_token("t_1", "Rename", "(N/N)", -1) #3
  nl2kr_child_left("t_4","t_1")
  nl2kr_child_left("t_3","t_1")
n12kr_token("t_4", "Rename data", "N", -1)
n12kr_child_right("t_4","t_2")
nl2kr_token("t_2","data","N",-1) #4
n12kr_child_right("t_3", "t_2")
 nl2kr_valid_rootNode("t_3")
  nl2kr_valid_rootNode("t_4")
20
21
  Tree number 3:
22 nl2kr_token("t_1", "Rename", "(N/N)", -1) #6
nl2kr_token("t_4", "Rename data", "N", -1)
26
  nl2kr_child_right("t_4", "t_2")
  nl2kr_token("t_2","data","N",-1) #6
  nl2kr_child_right("t_3", "t_2")
  nl2kr_valid_rootNode("t_3")
  nl2kr_valid_rootNode("t_4")
```

- CCG Grammar for Rename agrees across 3 parse treesCCG Grammar for _data_ agrees across 3 parse trees
- The first graph makes logical sense:



Each CCG of the individual words agree so we added this to the syntax file.

```
Rename (N/N) data (N)
```

And add to our training document

```
Rename data command > rename(data)
```

2 Sentence 2

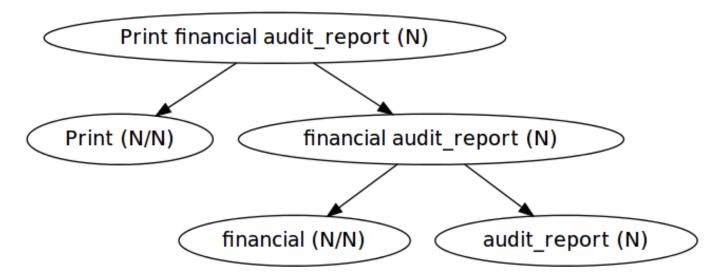
Next sentence we do the same thing

```
sentence=Print financial audit_report
syntaxFile=./examples/sample/syntax.txt
```

Which generates the following output

```
Tree number 1:
nl2kr_token("t_5", "Print financial audit_report", "N", -1)
nl2kr_token("t_4", "financial audit_report", "N", -1)
nl2kr_child_left("t_4","t_1")
nl2kr_token("t_3", "Print", "(N/N)", -1)
nl2kr_valid_rootNode("t_5")
nl2kr_child_right("t_5","t_4")
nl2kr_child_right("t_4","t_2")
nl2kr\_token("t\_1", "financial", "(N/N)", -1)
nl2kr_token("t_2", "audit_report", "N", -1)
nl2kr_child_left("t_5","t_3")
Tree number 2:
nl2kr_token("t_5","Print financial audit_report","N",-1)
nl2kr_child_right("t_4", "t_3")
nl2kr_child_right("t_5","t_1
nl2kr_child_left("t_5","t_4")
nl2kr_token("t_4", "Print financial", "(N/N)", -1)
nl2kr_child_left("t_4","t_2")
nl2kr_valid_rootNode("t_5")
nl2kr_token("t_1", "audit_report", "N", -1)
nl2kr_token("t_3", "financial", "(N/N)", -1)
nl2kr_token("t_2","Print","((N/N)/(N/N))",-1)
Tree number 3:
nl2kr_token("t_4", "financial audit_report", "N", -1)
nl2kr_token("t_5","Print financial audit_report","NP",-1)
nl2kr_child_right("t_4","t_1")
nl2kr_token("t_2", "Print", "(NP/N)", -1)
nl2kr_valid_rootNode("t_5")
nl2kr_child_left("t_4","t_3")
nl2kr_child_right("t_5", "t_4")
nl2kr_token("t_1", "audit_report", "N", -1)
nl2kr\_token("t\_3","financial","(N/N)",-1)
nl2kr_child_left("t_5", "t_2")
```

The first tree makes sense



So we append to our grammar file

```
Print (N/N)
financial (N/N)
audit_report (N)
```

And add to our training document (See phase 1)

```
Print financial audit_report command > print(audit_report(finance))
```

3 Sentence 3

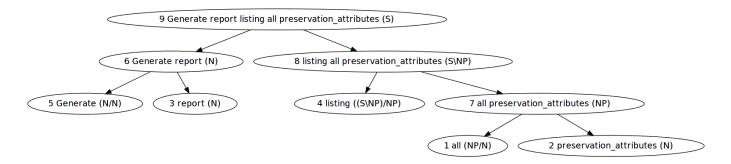
Next sequence we do the same thing

```
sentence=Generate report listing all preservation_attributes
syntaxFile=./examples/sample/syntax.txt
```

Which generates the following output

```
Tree number 1:
nl2kr_token("t_6", "Generate report", "N", -1)
nl2kr_token("t_9", "Generate report listing all preservation_attributes", "S", -1)
nl2kr_child_right("t_8", "t_7")
nl2kr\_token("t\_5", "Generate", "(N/N)", -1)
\verb|nl2kr_token("t_2", "preservation_attributes", "N", -1)|\\
nl2kr_child_left("t_7", "t_1")
nl2kr_child_left("t_6","t_5")
nl2kr_child_left("t_8","t_4")
nl2kr_token("t_1","all","(NP/N)",-1)
nl2kr_child_right("t_7", "t_2")
nl2kr_child_right("t_9","t_8")
nl2kr_token("t_7", "all preservation_attributes", "NP", -1)
nl2kr_token("t_3", "report", "N", -1)
nl2kr\_token("t\_4","listing","((S\NP)/NP)",-1)
nl2kr_child_left("t_9","t_6")
nl2kr_child_right("t_6", "t_3")
nl2kr_token("t_8","listing all preservation_attributes","(S\\NP)",-1)
nl2kr_valid_rootNode("t_9")
```

The tree makes sense



So we append to our syntax file

```
Generate (N/N)
report (N)
listing ((S\\NP)/NP)
all (NP/N)
preservation_attributes (N)
```

And add to our training document

```
Generate report listing all preservation_attributes command > generate(report(list( \hookleftarrow preservation_attributes)))
```

4 Sentence 4

Next sentence

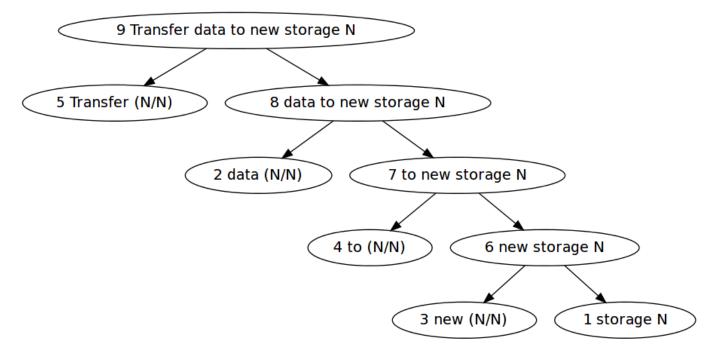
```
sentence=Transfer data to new storage
syntaxFile=./examples/sample/syntax.txt
```

Which generates the following output

```
Tree number 1:
nl2kr\_token("t\_5","Transfer","(N/N)",-1)
nl2kr_child_right("t_8", "t_7")
nl2kr_child_left("t_9","t_5")
nl2kr_token("t_1", "storage", "N", -1)
nl2kr_token("t_8", "data to new storage", "N", -1)
nl2kr_token("t_3", "new", "(N/N)", -1)
nl2kr_child_left("t_6", "t_3")
nl2kr_child_left("t_7", "t_4")
nl2kr_token("t_2", "data", "(N/N)", -1)
nl2kr_token("t_6", "new storage", "N", -1)
nl2kr_child_right("t_6", "t_1")
nl2kr_child_right("t_9","t_8")
nl2kr_token("t_7", "to new storage", "N", -1)
nl2kr_token("t_4","to","(N/N)",-1)
nl2kr_child_right("t_7","t_6")
nl2kr_child_left("t_8","t_2")
nl2kr_token("t_9", "Transfer data to new storage", "N", -1)
nl2kr_valid_rootNode("t_9")
Tree number 2:
nl2kr\_token("t\_5", "Transfer", "(N/N)", -1)
nl2kr_token("t_3","data","N",-1)
nl2kr\_token("t\_8","to new storage","(NP\\NP)",-1)
nl2kr_child_left("t_8","t_1")
nl2kr_child_left("t_6","t_5")
```

```
nl2kr_token("t_7", "new storage", "N", -1)
nl2kr_token("t_2", "storage", "N", -1)
nl2kr_token("t_9", "Transfer data to new storage", "NP", -1)
nl2kr_child_right("t_7", "t_2")
nl2kr_child_left("t_7", "t_4")
nl2kr_token("t_6", "Transfer data", "N", -1)
nl2kr_token("t_1", "to", "((NP\\NP)/NP)", -1)
nl2kr_child_right("t_8", "t_7")
nl2kr_child_left("t_9", "t_6")
nl2kr_token("t_4", "new", "(N/N)", -1)
nl2kr_token("t_4", "new", "(N/N)", -1)
nl2kr_child_right("t_6", "t_3")
nl2kr_child_right("t_9", "t_8")
nl2kr_valid_rootNode("t_9")
```

The tree makes sense



So we append to our syntax file

```
Transfer (N/N) data (N/N) to (N/N) new (N/N) storage (N)
```

And add to our training document

```
Transfer data to new storage command > transfer(data, storage(new))
```

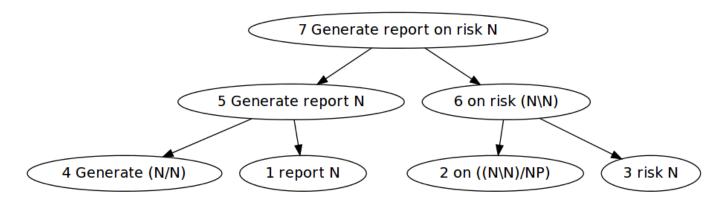
5 Sentence 5

```
sentence=Generate report on risk
syntaxFile=./examples/sample/syntax.txt
```

Which generates the following output

```
12kr_child_right("t_5","t_1")
n12kr_child_left("t_5","t_4")
n12kr_token("t_6","on risk","(N\\N)",-1)
n12kr_token("t_3","risk","N",-1)
n12kr_token("t_7","Generate report on risk","N",-1)
n12kr_token("t_4","Generate","(N/N)",-1)
n12kr_token("t_2","on","((N\\N)/NP)",-1)
n12kr_token("t_1","report","N",-1)
n12kr_token("t_1","report","N",-1)
n12kr_child_left("t_7","t_5")
n12kr_valid_rootNode("t_7")
n12kr_child_right("t_7","t_6")
n12kr_child_left("t_6","t_2")
n12kr_child_right("t_6","t_3")
n12kr_token("t_5","Generate report","N",-1)
```

The tree makes sense



So we append to our grammar gile

```
Generate (N/N) report N on ((N\N)/NP) risk N
```

And add to our training file

```
Generate report on risk command > generate(report(risk))
```

6 Building Lambda Definitions

Using the defined command parsing, we can infer the function application

```
print(audit_report(finance))
```

We can reverse the lambda function application to get the root expressions

```
print (audit_report (finance))
print (\f.audit_report (f) @finance)
a.print (a) @\f. (audit_report (f) @finance)
```

Thus the individual expressions are

```
#x.print(x)
#x.audit_report(x)
finance
```

Which we can add to our dictionary file.

```
print (N/N) #x.print(x)
financial (N/N) financial
audit_report (N) #x.audit_report(x)
```

7 Learning

Now that we have our 5 sentences, and we trained our system sufficiently, we can choose 3 sentences for learning. I choose the following sentences:

Chosen sentences

```
Rename collection
Print staff_experience report
Transfer ownership to rods
```

Learning Configuration

```
Ldata=../PartA/wright_train.txt
Ldictionary=../PartA/wright_dict.txt
Lsyntax=../PartA/wright_syntax.txt
Loutput=../PartA/wright_train.out
```

After correcting a few syntax errors in the dictionary file, generates the following lexicon file

```
0.01
financial
               [N/N] financial
to [N/N] to 0.01 data [N/N] data 0.01
             data 0.01
data [N]
audit_report [N] #x.audit_report(x)
audit_report [N] audit_report 0.01
                                              0.01
Print [N/N] #x.print(x)
                             0.01
Transfer [N/N] #x.#y.transfer(x,y)
                                              0.01
              risk
risk [N]
                      0.01
Rename [N/N] #x.rename(x)
                              0.01
new [N/N]
               new
                      0.01
listing [(S\NP)/NP]
                      #x.list(x)
                                      0.01
report [N] #x.report(x)
                              0.01
report [N]
               report 0.01
               [N/N]
                      \#x.generate(x) 0.01
Generate
storage [N]
               storage 0.01
preservation_attributes [N]
                             preservation_attributes 0.01
```

To which we can test new files. This resulted in the following error:

```
TestingProcess: 3 testing data read.

******Parsing Sentences ...

Parsing test sentence: Rename collection

Expected Representation: command > rename(collection)

Predicted Result: command > rename(collection)

Correct Prediction

Parsing test sentence: Print staff_experience report

Expected Representation: command > print(report(staff_experience))

Predicted Result: command > print(report(staff_experience))

Correct Prediction

Parsing test sentence: Transfer ownership to rods

Expected Representation: command > transfer(ownership, rods)
```

```
java.io.FileNotFoundException: resources/aspccqtk-parser/output/ ←
    output_Transfer_ownership_to_rods.asp (No such file or directory)
        at java.io.FileInputStream.open(Native Method)
        at java.io.FileInputStream.<init>(FileInputStream.java:138)
        at java.io.FileInputStream.<init>(FileInputStream.java:97)
        at java.io.FileReader.<init>(FileReader.java:58)
        at bioai.ccgprocessor.ccgparsing.aspccgtkParser.ASPCCGTKWrapper.callASPCCGParser( \leftarrow
            ASPCCGTKWrapper.java:185)
        at bioai.ccgprocessor.ccgparsing.aspccgtkParser.ASPCCGParser.parse(ASPCCGParser. \leftrightarrow
            java:32)
        at bioai.ccgprocessor.pccg.parser.PCCGParser.parseTable(PCCGParser.java:172)
        at bioai.ccgprocessor.pccg.parser.PCCGParser.parse(PCCGParser.java:251)
        at bioai.ccgprocessor.translation.TranslationProcess.testPair(TranslationProcess. \leftarrow
            java:196)
        at bioai.ccgprocessor.translation.TranslationProcess.test(TranslationProcess.java \leftarrow
            :112)
        at bioai.ccgprocessor.tests.scripts.NL2KR_TTest.main(NL2KR_TTest.java:90)
java.lang.NullPointerException
        at bioai.ccgprocessor.ccgparsing.aspccgtkParser.ASPCCGParser.parse(ASPCCGParser. \leftrightarrow
            java:37)
        at bioai.ccgprocessor.pccg.parser.PCCGParser.parseTable(PCCGParser.java:172)
        at bioai.ccgprocessor.pccg.parser.PCCGParser.parse(PCCGParser.java:251)
        at bioai.ccgprocessor.translation.TranslationProcess.testPair(TranslationProcess. \leftarrow
            java:196)
        at bioai.ccgprocessor.translation.TranslationProcess.test(TranslationProcess.java \leftarrow
        at bioai.ccgprocessor.tests.scripts.NL2KR_TTest.main(NL2KR_TTest.java:90)
java.lang.NullPointerException
        at bioai.ccgprocessor.pccg.parser.PCCGParser.parse(PCCGParser.java:252)
        at bioai.ccgprocessor.translation.TranslationProcess.testPair(TranslationProcess. \leftarrow
            java:196)
        at bioai.ccgprocessor.translation.TranslationProcess.test(TranslationProcess.java \leftrightarrow
            :112)
        at bioai.ccgprocessor.tests.scripts.NL2KR_TTest.main(NL2KR_TTest.java:90)
```

Thus we need to provide more context to the training engine.

Create a new learning file

```
Ldata=../PartA/wright3_learn.txt
Ldictionary=../PartA/wright3_dict.txt
Lsyntax=../PartA/wright3_syntax.txt
Loutput=../PartA/wright3_policy.out
```

We want to teach the system what transfer means so we provide the dictionary for some nouns

```
ownership N ownership rods N ownership
```

Run the learning engine again to learn the new vocabulary.

We repaired the error, but still no parse tree.

```
Line[3] Syntax:[[N]] Semantics:[data]
Line[4] Syntax:[[N]] Semantics:[#x.audit_report(x)]
Line[5] Syntax:[[N]] Semantics:[audit_report]
Line[6] Syntax:[[N/N]] Semantics:[#x.print(x)]
Line[7] Syntax:[[N/N]] Semantics:[#x.#y.transfer(x,y)]
Line[8] Syntax:[[N]] Semantics:[risk]
Line[9] Syntax:[[N/N]] Semantics:[#x.rename(x)]
Line[10] Syntax:[[N/N]] Semantics:[new]
Line[11] Syntax:[[(S\NP)/NP]] Semantics:[#x.list(x)]
Line[12] Syntax:[[N]] Semantics:[#x.report(x)]
Line[13] Syntax:[[N]] Semantics:[report]
Line[14] Syntax:[[N/N]] Semantics:[#x.generate(x)]
Line[15] Syntax:[[N]] Semantics:[storage]
Line[16] Syntax:[[N]] Semantics:[preservation_attributes]
TestingProcess: 3 testing data read.
*****Parsing Sentences ...
Parsing test sentence: Rename collection
Expected Representation: command > rename(collection)
Predicted Result: command > rename(collection)
Correct Prediction
Parsing test sentence: Print staff_experience report
Expected Representation: command > print(report(staff_experience))
Predicted Result: command > print(report(staff_experience))
Correct Prediction
Parsing test sentence: Transfer ownership to rods
Expected Representation: command > transfer(ownership, rods)
Generalizing ownership = null
Generalizing ownership = null
Correct output does not exist in the parse result
Predicted Result:null
Wrong Prediction
Correct Predictions: 2/3
Incorrect Predictions: 0/3
Predictions for sentences having unknown Expected Representations: 0/0
No Predictions: 1/3
Total evaluation costs: 00h:00m:47s:012ms
```

We have the policy learnt from the previous step, we can append this to the overall lexicon. The resulting policy file is:

```
0.01
Refinancial
              [N/N]
                     financial
to [N/N]
             to 0.01
                     0.01
data
     [N/N] data
data [N]
             data
                     0.01
             [N] #x.audit_report(x)
[N] audit_report 0.0
audit_report
                                           0.01
audit_report
                                    0.01
Print [N/N] #x.print(x)
              [N/N] #x.#y.transfer(x,y)
risk 0.01
Transfer
risk [N]
Rename [N/N]
              #x.rename(x)
                            0.01
       [N/N] new
new
                    0.01
                     #x.list(x)
listing [(S\NP)/NP]
report [N] #x.report(x)
report [N] report 0.01
report [N]
Generate
             [N/N]
                     \#x.generate(x) 0.01
storage [N] storage 0.01
preservation_attributes [N] preservation_attributes 0.01
ownership [N] ownership
                                    0.01
             rods 0.01
rods [N]
rods [N] ownership
                             0.01
```

Still unable to parse the result

```
*****Reading test data: ../PartA/wright_train.txt
Test line: 0
Test line: 1
Test line: 2
*****Reading lexicon file: ../PartA/wright_learn.out
Line[0] Syntax:[[N/N]] Semantics:[financial]
Line[1] Syntax:[[N/N]] Semantics:[to]
Line[2] Syntax:[[N/N]] Semantics:[data]
Line[3] Syntax:[[N]] Semantics:[data]
Line[4] Syntax:[[N]] Semantics:[#x.audit_report(x)]
Line[5] Syntax:[[N]] Semantics:[audit_report]
Line[6] Syntax:[[N/N]] Semantics:[#x.print(x)]
Line[7] Syntax:[[N/N]] Semantics:[#x.#y.transfer(x,y)]
Line[8] Syntax:[[N]] Semantics:[risk]
Line[9] Syntax:[[N/N]] Semantics:[#x.rename(x)]
Line[10] Syntax:[[N/N]] Semantics:[new]
Line[11] Syntax:[[(S\NP)/NP]] Semantics:[#x.list(x)]
Line[12] Syntax:[[N]] Semantics:[#x.report(x)]
Line[13] Syntax:[[N]] Semantics:[report]
Line[14] Syntax:[[N/N]] Semantics:[#x.generate(x)]
Line[15] Syntax:[[N]] Semantics:[storage]
Line[16] Syntax:[[N]] Semantics:[preservation_attributes]
Line[17] Syntax:[[N]] Semantics:[ownership]
Line[18] Syntax:[[N]] Semantics:[rods]
Line[19] Syntax:[[N]] Semantics:[ownership]
TestingProcess: 3 testing data read.
*****Parsing Sentences ...
Parsing test sentence: Rename collection
Expected Representation: command > rename(collection)
Predicted Result: command > rename(collection)
Correct Prediction
Parsing test sentence: Print staff_experience report
Expected Representation: command > print(report(staff_experience))
Predicted Result: command > print(report(staff_experience))
Correct Prediction
Parsing test sentence: Transfer ownership to rods
Expected Representation: command > transfer(ownership, rods)
Correct output does not exist in the parse result
Predicted Result:null
Wrong Prediction
Correct Predictions: 2/3
Incorrect Predictions: 0/3
Predictions for sentences having unknown Expected Representations: 0/0
No Predictions: 1/3
Total evaluation costs: 00h:00m:47s:729ms
```

Trying a new third sentence. Trained the result with file phase 4.

```
Rename collection

Print staff_experience report

file is master_copy •
```

• Changed sentence.

Still cannot learn the third sentence

```
*****Reading test data: ../PartA/wright_train.txt
```

```
Test line: 0
Test line: 1
Test line: 2
*****Reading lexicon file: ../PartA/wright_learn.out
Line[0] Syntax:[[N/N]] Semantics:[financial]
Line[1] Syntax:[[N/N]] Semantics:[to]
Line[2] Syntax:[[N/N]] Semantics:[data]
Line[3] Syntax:[[N]] Semantics:[data]
Line[4] Syntax:[[N]] Semantics:[#x.audit_report(x)]
Line[5] Syntax:[[N]] Semantics:[audit_report]
Line[6] Syntax:[[N/N]] Semantics:[#x.print(x)]
Line[7] Syntax:[[N/N]] Semantics:[#x.#y.transfer(x,y)]
Line[8] Syntax:[[N]] Semantics:[risk]
Line[9] Syntax:[[N/N]] Semantics:[#x.rename(x)]
Line[10] Syntax:[[N/N]] Semantics:[new]
Line[11] Syntax:[[(S\NP)/NP]] Semantics:[#x.list(x)]
Line[12] Syntax:[[N]] Semantics:[#x.report(x)]
Line[13] Syntax:[[N]] Semantics:[report]
Line[14] Syntax:[[N/N]] Semantics:[#x.generate(x)]
Line[15] Syntax:[[N]] Semantics:[storage]
Line[16] Syntax:[[N]] Semantics:[preservation_attributes]
Line[17] Syntax:[[N]] Semantics:[ownership]
Line[18] Syntax:[[N]] Semantics:[rods]
Line[19] Syntax:[[N]] Semantics:[ownership]
Line[20] Syntax:[[N]] Semantics:[master_copy]
Line[21] Syntax:[[N]] Semantics:[file]
TestingProcess: 3 testing data read.
*****Parsing Sentences ...
Parsing test sentence: Rename collection
Expected Representation: command > rename(collection)
Predicted Result: command > rename(collection)
Correct Prediction
Parsing test sentence: Print staff_experience report
Expected Representation: command > print(report(staff_experience))
Predicted Result: command > print(report(staff_experience))
Correct Prediction
Parsing test sentence: file is master_copy
Expected Representation: master_copy(file)
Generalizing is = null
Correct output does not exist in the parse result
Predicted Result:null
Wrong Prediction
Correct Predictions: 2/3
Incorrect Predictions: 0/3
Predictions for sentences having unknown Expected Representations: 0/0
No Predictions : 1/3
Total evaluation costs: 00h:00m:47s:085ms
```

At this point, I cannot determine what I am missing in the third sentence.

8 Conclusion

In this project, worked out some manual CCG grammars to verify that the tree's generated by the tool made sense. Several times the CCG tree I generated was incorrect, and the multiple parse trees given by the tool demonstrated my error. Therefore the biggest return I got from this project was the CCG grammar parsing. I faced numerous errors with the other tools, and it was difficult to work through a stack of java exceptions to figure out the underlying problem. Otherwise, it was an interesting project.