



# Part-of-Speech Tagging in Shakespeare: Trials, Tribulations and why one might Bother

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### What is POS tagging?



#### <u>Grammar</u> – not necessarily a sexy topic:

Jack Cade: "It will be proved to thy face that thou hast men about thee that usually talk of a noun and a verb, and such abominable words as no Christian ear can endure to hear." 2H6 IV.vii

Part-of-speech tagging involves adding codes to words which indicate the grammatical category (noun, verb, adverb, adjective, etc.) to which they are deemed to belong.

To\_TO be\_VBI or\_CC not\_XX to\_TO be\_VBI that\_DD1 is\_VBZ the\_AT question\_NN1

The tagging process can be automated by programs such as CLAWS.

There is no such thing as 100% accuracy; the aim is to be good enough



- (1) It reveals patterns of grammatical usage, and this can help us:
- Write descriptive grammar books
- > Teach English grammar
- Write dictionaries
- > Study variation in English, e.g. dialects
- > Study change in English (i.e. the history of the English language)
- > Study the 'style' of a particular period or author



(2) It improves the accuracy of other automated processes (e.g. lemmatization, semantic tagging)

#### What is lemmatization?

A process that involves grouping word variants or word-forms into 'lemmas' (which are like dictionary headwords).

- Dictionary headword/lemma: do = 1
- Modern (morphological) word-forms: do, does, doing, did, done =
- Early modern (morphological) word-forms: do, does, do(e)st, doth, doing, did, didst, done = 8



➤ POS-tagging improves lemmatization prospects, typically by disambiguating words, e.g. homonyms such as *leaves* (in Shakespeare two-thirds of cases are a noun, one third a verb)

### Semantic tagging

Semantic tagging involves adding codes to words which indicate the semantic/meaning category (e.g. people, time, power, being, food, thought, colour, liking, avarice, relationship) to which they are deemed to belong. Cf. *WMatrix* 



- (3) Some of the specific POS tags may be of interest, e.g.
- ➤ NP1/2 Singular/plural proper noun (e.g. London, Jane, Frederick)
- NNB Preceding noun of title (e.g. Mr., Prof., Lord)
- > FW Foreign word

### **Trials and tribulations**



- Grammatical phenomena which are marginal today, but may require addressing by the tagger for EModE
  - 2<sup>nd</sup> person singular
- Words not in the modern lexicon
- Words whose possible classifications have changed
  - what
- Words whose probability profile has changed
  - prostitute
- Extra cliticisations (me=thinks, me=thought)
- But we don't have the time for a radical system overhaul

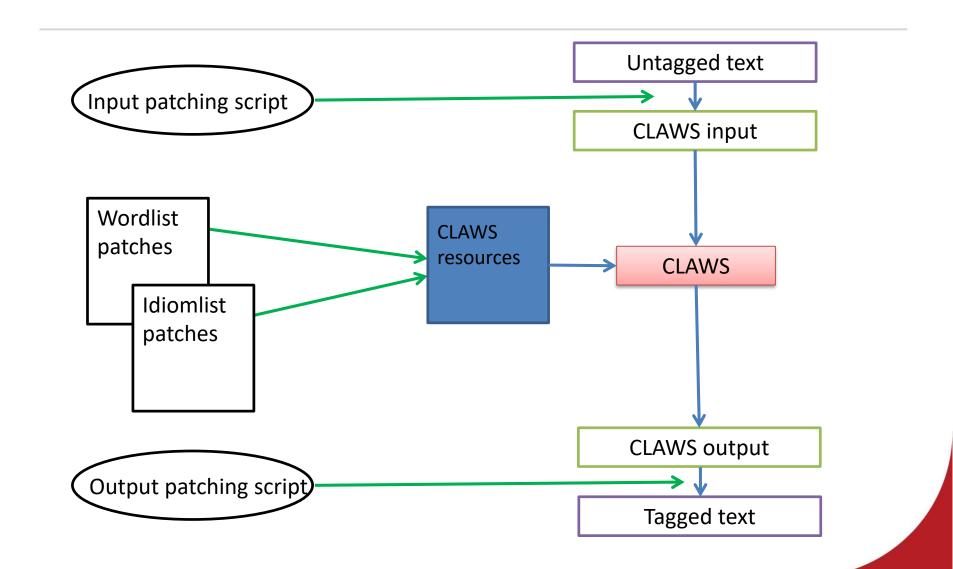
### Solution



- (1) Development work: Patch CLAWS three ways:
  - Resource patching
  - Input patching
  - Output patching
- (2) Manual post-editing (if necessary)



# Implementation of development work







| 1 prithee UH       |
|--------------------|
| 2 hark VV⊙         |
| 3 claudio NP1      |
| 4 signior NNl      |
| 5 timon NPl        |
| 6 valour NN1       |
| 7 falstaff NP1     |
| 8 troilus NP1      |
| 9 jove NP1         |
| 10 martius NPl     |
| 11 alarum NN1      |
| 12 angelo NP1      |
| 13 cassius NP1     |
| 14 bardolph NP1    |
| 15 palamon NP1     |
| 16 alack UH        |
| 17 iago NPl        |
| 18 arcite NPl      |
| 19 bolingbroke NP1 |
| 20 proteus NP1     |
| 21 silvia NP1      |
| 22 griefs NN2      |
| 23 benedick NP1    |
| 24 oaths NN2       |
| 25 caius NP1       |
| 26 emilia NP1      |
| 27 bianca NP1      |
| 28 demetrius NP1   |
| 29 warlike JJ      |

```
200 affliction NN1
201 anointed VVN JJ VVD@
202 bondage NN1
203 bootless JJ
204 corioles NP1
205 costard NP1
206 coxcomb NN1
207 infect VVO
208 ingratitude NNl
209 leonatus NP1
210 mantua NPl
211 messengers NN2
212 mischance NN1
213 polixenes NP1
214 reignier NP1
215 rogues NN2
216 shylock NP1
217 stephano NP1
218 trinculo NP1
219 tush UH
220 usurp VVO
221 alcibiades NP1
222 bachelor NN1
223 barbarous JJ
224 barnardine NP1
225 blushing JJ VVG NN1@
226 commends VVZ
227 cymbeline NP1
```

```
1247 embassage NN1
1248 endowments NN2
1249 enfranchised VVD VVN J
1250 esteems VVZ
1251 expostulate VVO
1252 extenuate VVO
1253 fawning VVG NN1 JJ
1254 fines VVZ NN2
1255 firmament NN1
1256 flatteries NN2
1257 flax NN1
1258 flaved VVD VVN JJ
1259 foison NN1
1260 foretell VVO
1261 forfeited VVD VVN JJ
1262 forgetfulness NN1
1263 forwardness NN1
1264 fulsome JJ
1265 furred JJ
1266 dash VVO NN1
1267 dashes VVZ NN2
1268 gentlemanlike JJ
1269 aibes NN2
1270 goblins NN2
1271 aoth NN1
1272 graceless JJ
1273 grafted VVD VVN JJ
1274 groats NN2
1275 grosser JJR
```

2623 unbowed JJ 2624 unbuckle VVO 2625 uncapable JJ 2626 unconquered JJ 2627 uncouple VVO 2628 undrown VVO 2629 undeserver NN1 2630 undrowned JJ 2631 unforced JJ 2632 unquided JJ 2633 unheedful JJ 2634 unkennel VVO 2635 unmake VVO **2636** unmask VVO 2637 unminaled JJ 2638 unpractised JJ 2639 unpregnant JJ 2640 unprizable JJ 2641 unquestioned JJ 2642 unauietness NN1 2643 unsubstantial JJ 2644 untender JJ





```
10 // splits that CLAWS does for us already:
11 // twas
12 // tis
13 // twould
14 // twere
15
16 $splits_raw = <<<END
17 melthinks
18 me | thought
19 me | thoughts
20 mel seems
21 melseemeth
22 me seemed
23 t as
24 t|will
25 END;
```

### **Output patching**



/ pronouns
thou PPY PPYS1
thee PPY PPYS1
th' PPY PPYS1

/ verbs
art VBR VBT
beest VBR VBT
wast VBDR VBDT
wert VBDR VBDT
hast VHO VHT
havest VHO VHT
haddest VHD VHDT
dost VDO VDT
didst VDO VDT
wilt VM VMT
wouldst VM VMT

seemedst VVD VVDT seemest VVO VVT seemst VVO VVT seest VVO VVT showedest VVD VVDT showedst VVD VVDT showdst VVD VVDT showest VVO VVT showst VVO VVT showst VVO VVT startedest VVD VVDT startedst VVD VVDT startest VVO VVT startst VVO VVT takest VVO VVT takst VVO VVT talkedest VVD VVDT talkedst VVD VVDT

owst VVO VVT
scaldst VVO VVT
scoldst VVO VVT
scornst VVO VVT
scorndst VVD VVDT
seekst VVO VVT
sentst VVD VVDT
servst VVO VVT
setst VVO VVT VVD VVDT
settlest VVO VVT
shamst VVO VVT
shrugst VVO VVT



## **Manual Post-editing**

```
35293 0001365 181
                                                      . 03 .
35294 0001365 182 -----
35295 0001365 190
                                                    What 93 DDO
35296 0001365 191
                                                    's 96 VBZ
35297 0001365 192 <1b/>
                                          ERROR?
                                                      01
35298
      0001365 200
                                                    the 93 AT
35299 >
35300 0001365 210
                                                    News 93 NN1
35301 >
35302 0001365 220
                                                     in 93 [II/100] RP@/0
35303 0001365 230
                                                    Rome 93 NP1
35304 0001365 231
                                                      : 03 :
35305 0001365 240
                                                      I 93 [PPIS1/100] MC1%/0 ZZ1%/0
35306 >
35307 0001365 250
                                                    have 93 VHO
35308 >
35309 0001365 260
                                                      a 93 AT1
35310 0001365 270
                                                   Note 93 [NN1/100] VV0/0
35311 0001365 280
                                                    from 93 II
35312 0001365 290
                                                    the 93 AT
35313 >
35314 0001365 300
                                                Volscian 93 JJ
35315 >
35316 0001365 302 <1b/>
                                          ERROR?
                                                        01
35317 0001365 310
                                                   state 93 [NN1/95] VVO/5
35318 0001365 320
                                                    to 97 TO
35319 >
35320 0001365 330
                                                    find 97 VVI
35321 >
35322 0001365 340
                                                    you 93 PPY
                                                    out 93 [RP/100] II%/0
35323 0001365 350
                                                   there 93 [RL/100] EX/0
35324 0001365 360
35325 0001365 361
35327
      0001365 370
                                                    You 93 PPY
```



# Methods for manual post-editing

- 1. Search on the word itself and check, e.g. what
  - "And what was he?" = determiner
  - "What ho Brabantio" = interjection
- 2. Search on tags which we anticipate may need fixing, e.g. tag ZZ1 (singular letter of the alphabet) wrongly applied to pronoun *l*.
- 3. Use regular expressions, e.g. to find and check words ending in –ing (disambiguating nouns, verbs and adjectives)\S\S\Sing \d\d
- Check by reading ...

### **Recurrent issues (1)**



- Familiar words in unfamiliar grammatical roles
  - e.g. marry can be an interjection as well as a verb
     "Marry [VV0/86] UH/14 for justice she is so employed" (Tit 4\_3)
  - fright can be a verb as well as a noun
     "What shall they seek the Lion in his den, And fright him there?" (KJ)
- Unfamiliar phrases
  - e.g. go to (to is an adverb not a preposition here)"Go to, you're a dry fool:" (TN 1\_5)
- Some names of characters not recognised as proper nouns
  - e.g. [Mistress] Quickly (not an adverb), [Lord] Say (not a verb)

## Recurrent issues (2)



- Wordplay sometimes confuses CLAWS
  - "A mark, O mark but that mark: a mark says my Lady" (LLL 4\_1)
    - CLAWS tags all four cases as nouns; the second is a verb

- "Marry this is Miching Mallico, that means Mischief" (Ham 3\_2)
  - marry wrongly tagged as verb miching mallico tagged as verb, proper noun, but more likely to be adjective, noun (meaning unclear)