L90 Practical, Part II Overview of Natural Language Processing

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2015/12/02

Sentiment Classification, Part 2

- We assume you now have (a) working baseline system(s)
- You can now automatically classify a given review from IMDB into Negative or Positive
- You used machine learning (NB, maybe SVM) on bags of words (maybe POS, bigrams etc)
- But this does not take much of the linguistic processing you encountered in L90 into account.
- Today get you started on extending this to a more sophisticated system
- ... and do good science while you're at it

Goal of this Practical - "good science"

- Getting high numerical results isn't everything neither in this practical nor in science in general.
- Good science means:
 - an interesting research question
 - sound methodology
 - insightful analysis (something non-obvious)
- First part choose your research question

Possible Research Questions

- You know from L90 some techniques how syntactic information can be automatically determined.
- Can this information capture additional meaning (beyond words) in a way that demonstrably helps with this task?
- Should we determine other units but verbs or bigrams?
 "Adjective + Noun" units?
- The clearest case of semantic information is negation.
 - Is negation present in a sentence (at all)?
 - Which unit in the sentence is negated?
 - If so, how can the negation information be gainfully used?

More Possible Research Questions

- Wordnet is an ontology listing lexical relations between (mainly) nouns – how could this help (maybe in connection with a sentiment lexicon?)
 - One relationship between adjectives is antonymy, eg. "boring" / "exciting"
- Turning to discourse effects why would anaphora resolution possibly help?
- Pragmantic effects:
 - Plot Description vs. Evaluation
 - Advice to the reader
 - Violation of expectations; "underdog" story lines
 - Rhetorical questions? Irony?

Don't overdo the mixing and matching

- One research question is enough.
- In fact, exploring one research question well and thorougly often makes for the best scientific experiment.

Null results

- What to do if you have tried and tried and you cannot beat your best baseline system?
- It's possible that your idea just didn't pan out, and that what you have achieved simply is the best possible outcome
- ... if you can show that you have used the right methodology
- Don't vary more than one variable at a time when measuring effects
- Test for significance before making any claims that something is better than something else

Unseen data (Repetition slide)

- For testing, only ever use truly unseen data.
- How could data be "seen" (and thus tainted) by your system?
 - In ML systems, parameters are directly estimated from the data ("training corpus")
 - Cross-validation is a way of pretending to close our eyes and "unsee" data
 - Even in symbolic systems, characteristics of the data can taint the test because they can go via the brain of the developer
 - Careful once the developer has looked at the data ("development corpus"), they can never really "forget" what they have seen.
 - You might want to make sure your test data is unreadable to yourself.

Writing the report

- No more than 4000 words; with word count.
- Submission 12 January 2016, noon
- Must include a pointer to running code on Mphil machines (your account)

Writing tips

- Make it look like a paper (including formatting)
- Use scientific language
 - Eradicate all forms of colloquial language
 - Mimic the author's voice in published papers
- Introduction: pretend this is not an L90 assignment but your own idea
- Reader has no pre-knowledge
- Describe your methodology appropriately
 - Not too detailed (otherwise you look like a beginner)
 - Enough detail to allow somebody to reimplement your solution
 - Technical terms: use them define them first
- Describe your numerical results (after your methods, clearly separated).
- Analyse your numerical results, using your brain and the English language.

Deployment test – voluntary

- After submission: test your system on new, real data.
- Actually, the data you will test on is really new and real because you create it.
- Why a deployment test if you are satisfied with your system's performance on the 2000 articles?
- Because any of the following may have happened:
 - Wrong assumptions about data (type of films, language, ...)
 - Unrepresentative sampling
 - Bugs
 - Model over- or underfitting

Deployment Test - How to

- Think of four films or series you have recently seen and/or feel strongly about
- Score them between 10 and 1
- Write a review [in the style of the IMDB reviews]
- We will collect and publish all texts on L90 website
- You run your systems and give us your results
- We will correlate your system outputs and the real scores and announce the results
- Winner gets small prize and is announced on L90 website