Talkin' bout a revolution (statistically speaking)

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This talk will describe new methods for generating Natural Language in interactive systems – methods which are similar to planning approaches, but which use statistical machine learning to develop adaptive NLG components. Employing statistical models of users, generation contexts, and of Natural Languages themselves, has several potentially beneficial features: the ability to train models on real data, the availability of precise mathematical methods for optimisation, and the capacity to adapt robustly to previously unseen situations. Rather than emulating human behaviour in generation (which can be suboptimal) these methods can even find strategies for NLG which improve upon human performance.

Recently, some encouraging results have been obtained with real users of 3 different systems developed using these methods, for the tasks of Information Presentation in an automated tourist guide, Referring Expression Generation in a technical support system, and generation of Temporal Referring Expressions in an appointment scheduling system. The results show that optimised NLG significantly outperforms related prior approaches, and can also improve the global performance of dialogue systems.

As well as explaining the core Reinforcement Learning and user modelling methods and concepts behind this work, I will also cover some recent work from other researchers which fits with this general perspective on NLG. Finally, I discuss some future directions for this research area, for example the issues of incremental generation and generation under uncertainty.

References

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