

t-SNE: Assisted Parameter Optimization by Approximating Neighbourhood Similarity

P1 | VDA Research Group
Raphael Mitsch
University of Vienna

I. Motivation

- Context: Master thesis on PSA for word embeddings
 - How to visualize single WE model with all records?
 - Reduce dim. with t-SNE to $d_{low} \ll d_{high}$ so that d_{low} can be reasonably interpreted in a SPLOM
 - How to choose hyperparameters for t-SNE?
- Constraint: DR is implicit step in the pipeline; user shouldn't have to invest cognitive effort

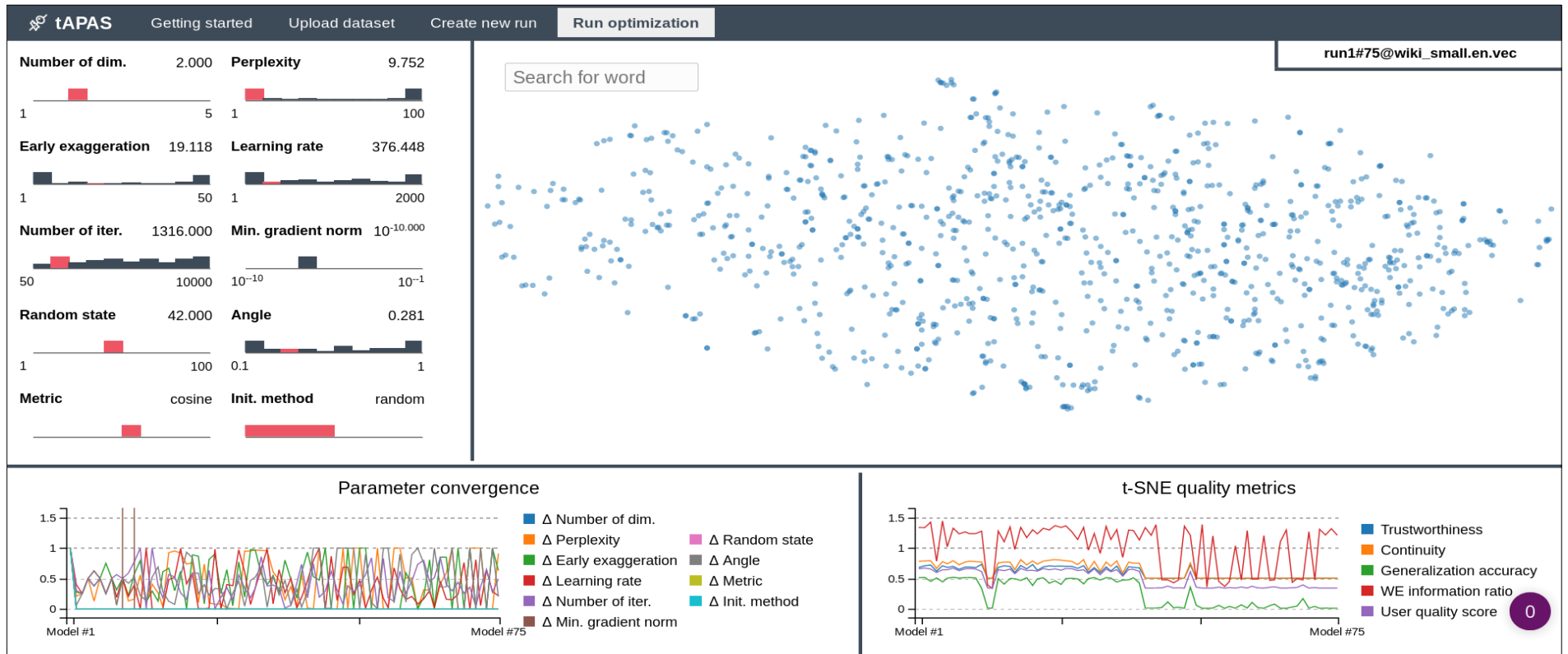
II. Approach

- Hyperparameter optimization:
 - Grid search, random., *Bayesian*, grad.-based, evolutionary, ...
- Questions:
 - How fast does BO converge?
 - Does it yield useful results for t-SNE?
 - Exploration vs. exploitation
- Build application tracking BO of t-SNE for word embeddings; evaluate efficacy and convergence behaviour

III. Concept & Prototype

- Different quality metrics (weighted average):
 - Faithfulness to original topology
 - Usefulness for domain tasks
- Plot convergence of hyperparameters and evolution of quality metrics
- Enable user to assess model quality; suggest rating

III. Concept & Prototype



IV. Evaluation

- Results so far show no consistent (positive) tendency – more runs & metric tuning necessary
- Exploring dimensionality reduction algorithms warrants dedicated investigation. Thus: Abandon original idea for thesis in favor of VPSA for DR algorithms

V. Future Work

- With better understanding of t-SNE after VPSA for DR: Re-evaluate design; improve prototype of optimization UI
- Investigate exploitation vs. exploration parameters for BO
- Ultimately: No need for human in the loop, providing BO for optimization of DR/t-SNE in the context of WE automatically

References

- [1] <https://github.com/rmitsch/tapas>
- [2] Y. Tsvetkov, M. Faruqui, W. Ling, G. Lample, and C. Dyer, “Evaluation of Word Vector Representations by Subspace Alignment,” 2015, pp. 2049–2054.
- [3] L. J. P. van der Maaten, E. O. Postma, and H. J. van den Herik, Dimensionality Reduction: A Comparative Review. 2008.
- [4] J. A. Lee and M. Verleysen, “Quality assessment of dimensionality reduction: Rank-based criteria,” Neurocomputing, vol. 72, no. 7, pp. 1431–1443, Mar. 2009.