

# Master Thesis Seminar Talk

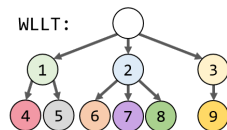
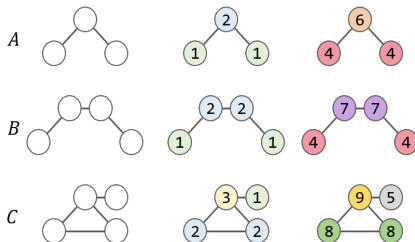
## Progress Update

Fabrice Beaumont

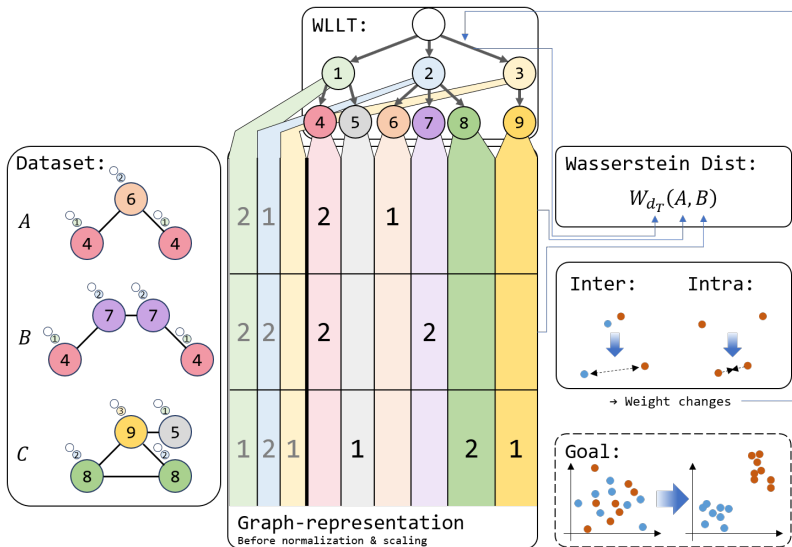
Department of Information Systems and Artificial Intelligence - **Dr. Pascal Welke**

10. November 2022

# Example of the whole procedure

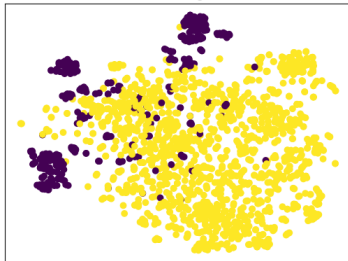


# Example of the whole procedure

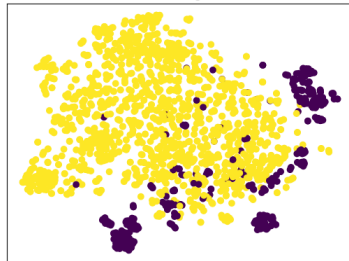


# Example: AIDS t-SNE

t-SNE Embedding - Iter: 0



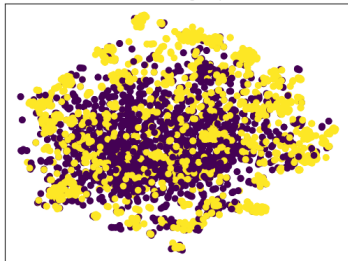
t-SNE Embedding - Iter: 50



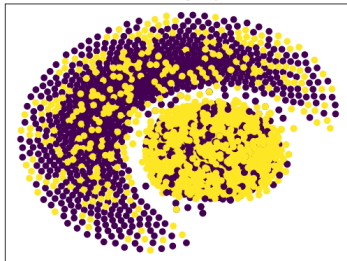
Bs: 5%, WLLT-d: 4, PP: 0.4, SVM-acc.: 80%

# Example: NCI1 t-SNE

t-SNE Embedding - Epoch: 0



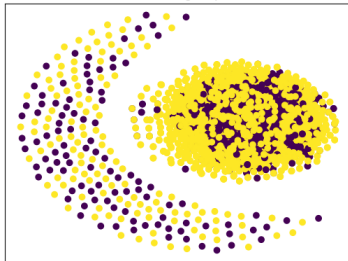
t-SNE Embedding - Epoch: 20



Bs: 5%, WLLT-d: 4, Pull: 1.0, Push: 0.1, SVM-acc.: 48%

# Example: NCI1 t-SNE

t-SNE Embedding - Epoch: 40



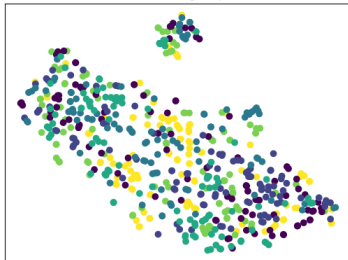
t-SNE Embedding - Epoch: 200



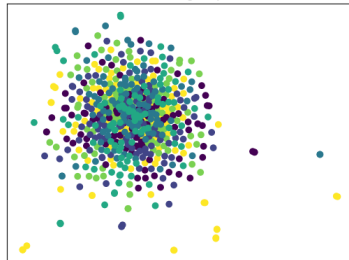
Bs: 5%, WLLT-d: 4, Pull: 1.0, Push: 0.1, SVM-acc.: 48%

# Example: ENZYMES t-SNE

t-SNE Embedding - Epoch: 0



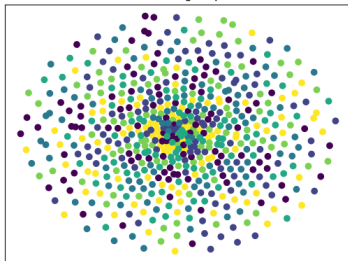
t-SNE Embedding - Epoch: 40



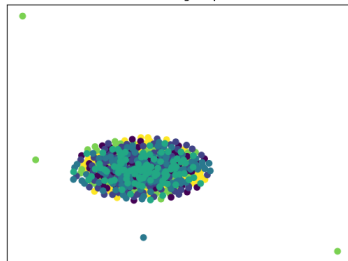
Bs: 5%, WLLT-d: 4, Pull: 1.0, Push: 0.1, SVM-acc.: 11%

# Example: ENZYMES t-SNE

t-SNE Embedding - Epoch: 80



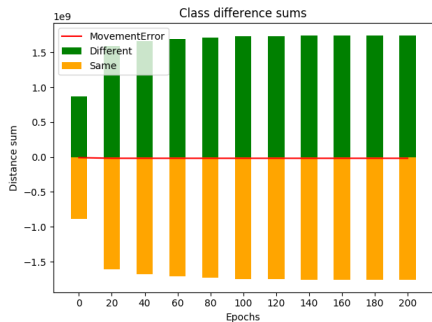
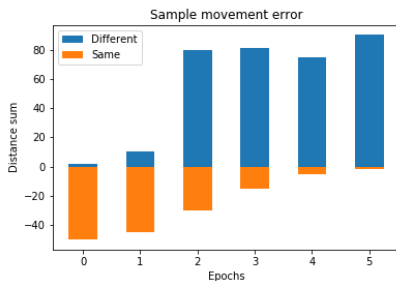
t-SNE Embedding - Epoch: 200



Bs: 5%, WLLT-d: 4, Pull: 1.0, Push: 0.1, SVM-acc.: 11%

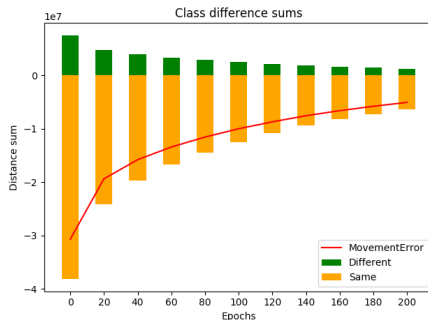
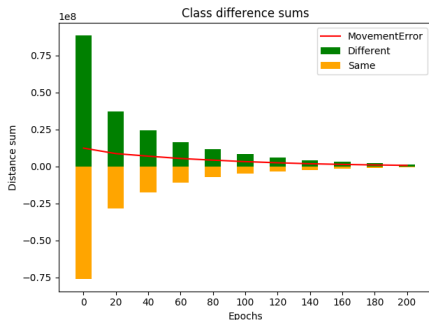


# Example: Sample movement error



NCI1, Bs: 5%, WLLT-d: 4, Pull: 0.1, Push: 0.5, SVM-acc.: 48%

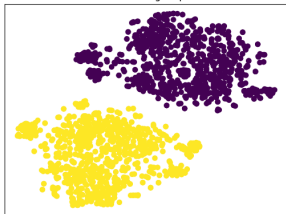
# Example: Sample movement error



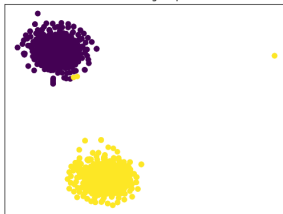
PROTEINS  $\bar{c}$ , Bs: 5%, WLLT-d: 4, Pull: 1.0, Push: 0.1, SVM-acc.: 64%  
 ENZYMES,  $\bar{B}$ s: 5%, WLLT-d: 4, Pull: 1.0, Push: 0.1, SVM-acc.: 11%

# Example: Sample movement error

t-SNE Embedding - Epoch: 0



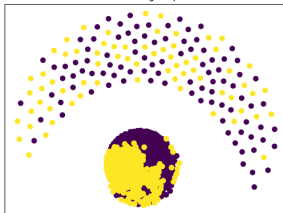
t-SNE Embedding - Epoch: 40



t-SNE Embedding - Epoch: 100



t-SNE Embedding - Epoch: 200



## Example: AIDS\_perfect

Separate clusters for:

WLLT-d=4, 100 epochs, Bs=5%, He\_thdl=0.6, Pull=0.1, Push=0.1

And with changed:

- Bs=20%
- WLLT-d=2
- Lr=0.5

Assume that these parameters do not interfere with the cluster separation. Suspect instead the scaling effect of multiplicative updates. Thus try absolute updates.

# Example: AIDS\_perfect - SVM accuracy

Expected (almost) 100% for iteration 0. But got only **51%**.

Testing the SVM with other **kernel lambdas**  $\lambda$  besides the standard 'scale' in the computation of the kernel matrix from the distance matrix  $D$ :

$$K := \exp(-\lambda D)$$

$\lambda$	scale	<b>auto</b>	0.1	0.5	1.0
Avg.Acc.	50.43	97.94	79.99	50.54	50.91
Std.dev.	3.69	2.53	1.26	0.93	0.55

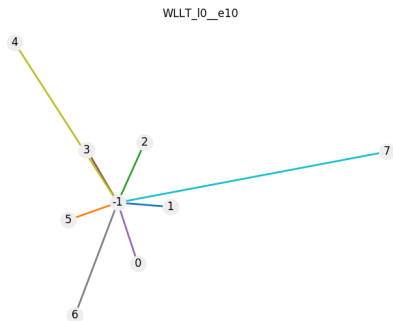
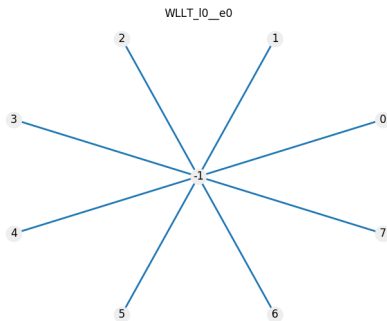
Where:

- auto:  $\lambda = 1/(\#\{\text{features}\} * \text{var}(D))$
- scale:  $\lambda = 1/(\#\{\text{features}\})$

'scale' is the default of sklearn's svm implementation (since version 0.22).

- “Finish” experiments with AIDS\_perfect  
(limits of push-pull, absolute weight update, single layer)
- Try to find more truly SME improving configuration for (normal) AIDS  
(Ideally increasing diff-cl distance **and** decreasing same-cl dist.)
- Besides this: **Terminate the evaluations** and report about the investigated parameter configurations.  
Outlook for improvement of the method: e.g. Layer gradient

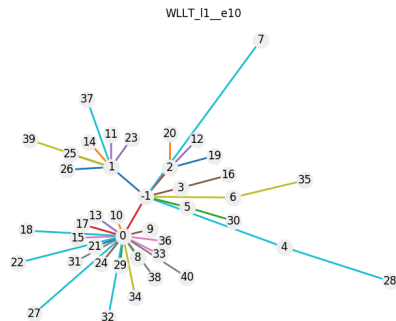
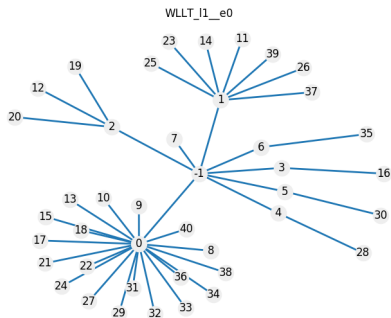
# Example: MUTAG WLLT layer 0



Bs: 20%, WLLT-d: 4, Pull: 0.3, Push: 0.1, SVM-acc.: 66%

# Example: MUTAG WLLT layer 1

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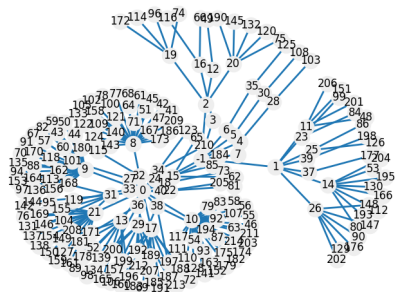
Bs: 20%, WLLT-d: 4, Pull: 0.3, Push: 0.1, SVM-acc.: 66%



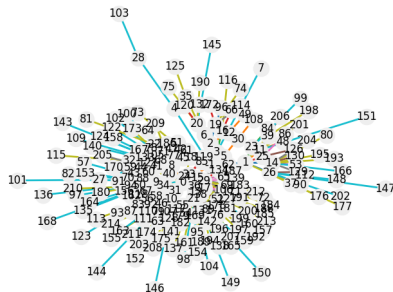
# Example: MUTAG WLLT layer 2

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WLLT\_I2\_e0



WLLT\_I2\_e10



Bs: 20%, WLLT-d: 4, Pull: 0.3, Push: 0.1, SVM-acc.: 66%

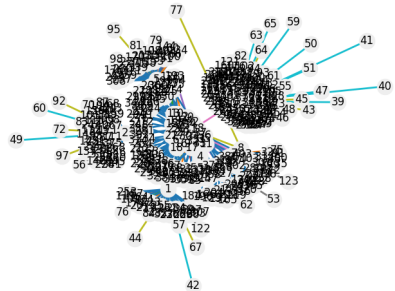
# Example: AIDS WLLT layer 2

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WLLT\_I2\_e0



WLLT\_I2\_e10



Bs: 5%, WLLT-d: 4, PP: 0.4, SVM-acc.: 80%

*Thank you all for listening.*

I will be happy to answer any **questions** and  
hear your **comments**.

# Preparation of the performance comparison

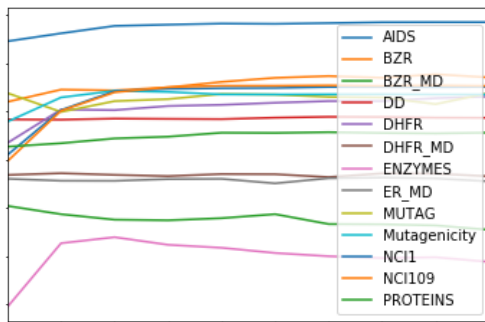
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Figure: Classification accuracies on databases using Weisfeiler-Lehman.

```
grakel.kernels.WeisfeilerLehman(n_iter=[1-10], base=grakel.kernels.VertexHistogram, normalize=True)  
grakel.utils.cross_validate_Kfold_SVM(K, y, n_iter=10)
```