

# TensorLy: Tensor Learning in



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# High level API for tensor method and deep tensorized architectures

Tensor decomposition

Tensor regression

Tensor + Deep

**Basic tensor operations** 

Kronecker  $\otimes$  , Khatri-Rao  $\odot$  , unfolding  $\mathbf{X}_{[n]}, vec(\hat{\mathcal{X}}), n$ -mode product,  $\cdots$ 

**Unified backend** 







- Flexibly backend system
- Easily extensible
- Consistent, clear, documented API tensors are NumPy arrays or PyTorch tensors
- Tested and optimized
- BSD-licensed: suitable for industry & academia



https://github.com/tensorly/tensorly

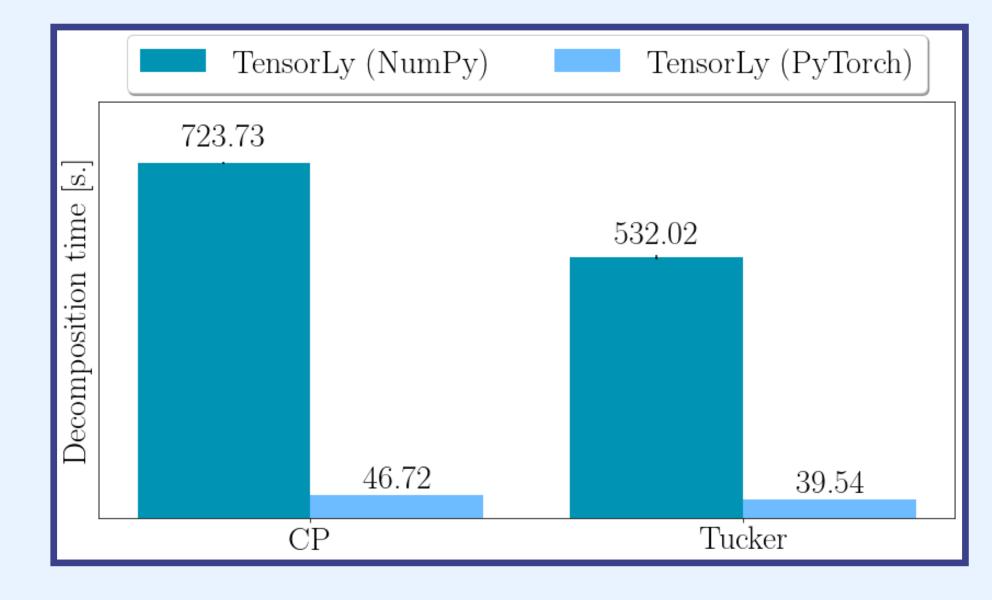


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API and doc: <u>tensorly.org/dev</u>

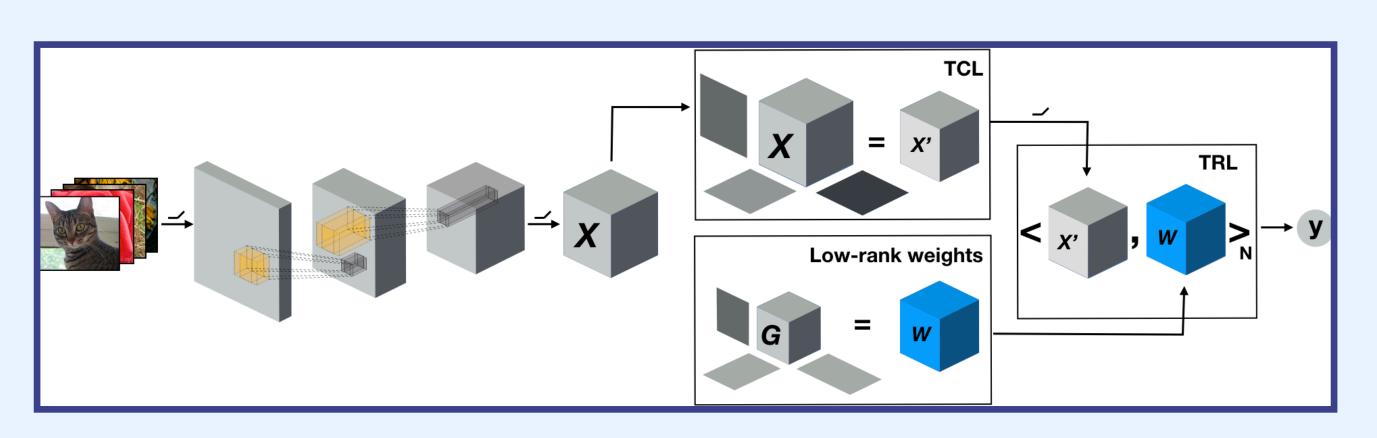
### Tensor algebra, decomposition and regression

- CANDECOMP-PARAFAC decomposition
- Non-negative and randomised CP
- Tucker decomposition (Higher-Order SVD)
- Non-negative Tucker
- Matrix-Product-State (Tensor-Train)
- Robust Tensor PCA
- Tensor ridge regression (Tucker and Kruskal)



Decomposing a 1-billion element tensor

## Deep tensorized architectures



- Speeding up convolutions with tensor decomposition
- Tensor contraction and regression networks, ...

# ResNet-101+TRL on ImageNet 90 85 75 70 Top-1 accuracy Top-5 accuracy 0 20 40 60 80 100 Space savings (in %)