

# A Machine Learning Framework for Large-Scale Weather and Climate Prediction

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*BoF: Achieving Performance on Large-Scale Intel Xeon-Based Systems*

SC18, Dallas, TX

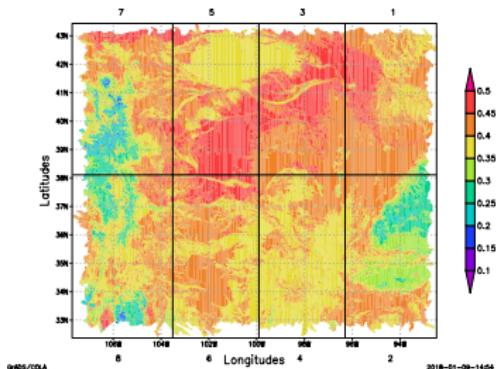


# Climate/Weather Forecasting

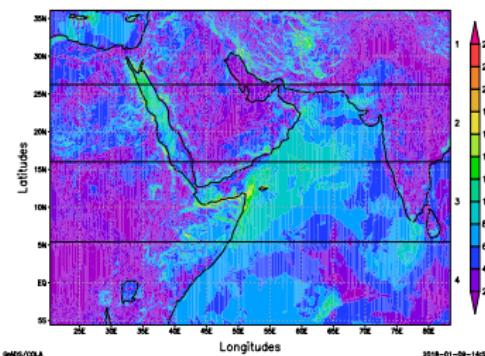
- Computational statistics: multivariate large spatial data sets in climate/weather modeling:

$$\ell(\boldsymbol{\theta}) = -\frac{1}{2}\mathbf{Z}^T \boldsymbol{\Sigma}^{-1}(\boldsymbol{\theta}) \mathbf{Z} - \frac{1}{2}\log|\boldsymbol{\Sigma}(\boldsymbol{\theta})|$$

(a) Problem Definition.



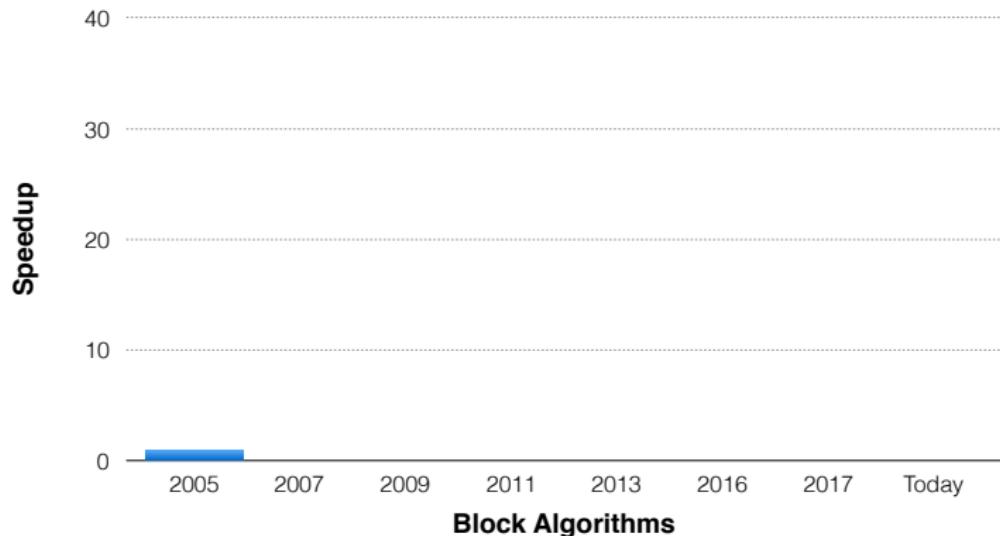
(b) Soil moisture.



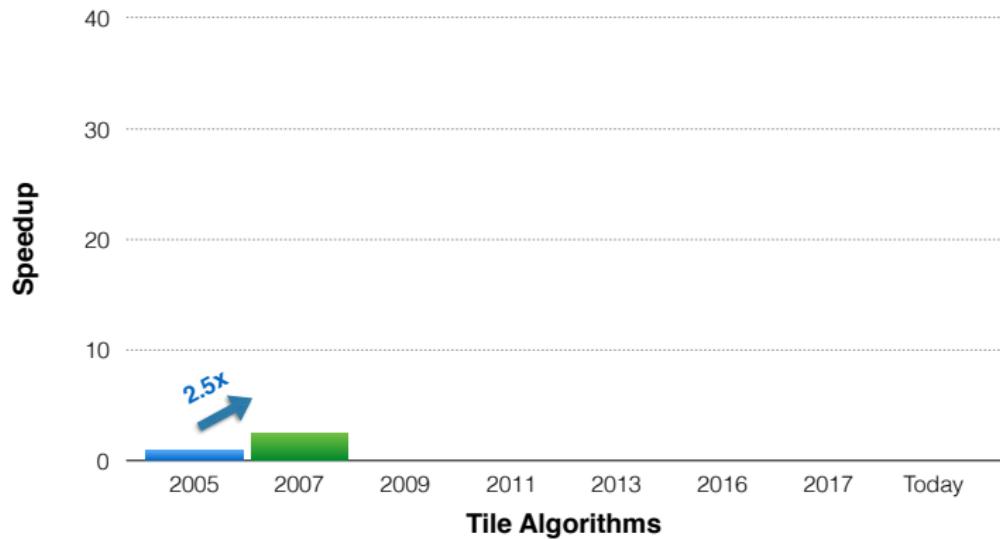
(c) Wind speed.

w/ Y. Sun and M. Genton

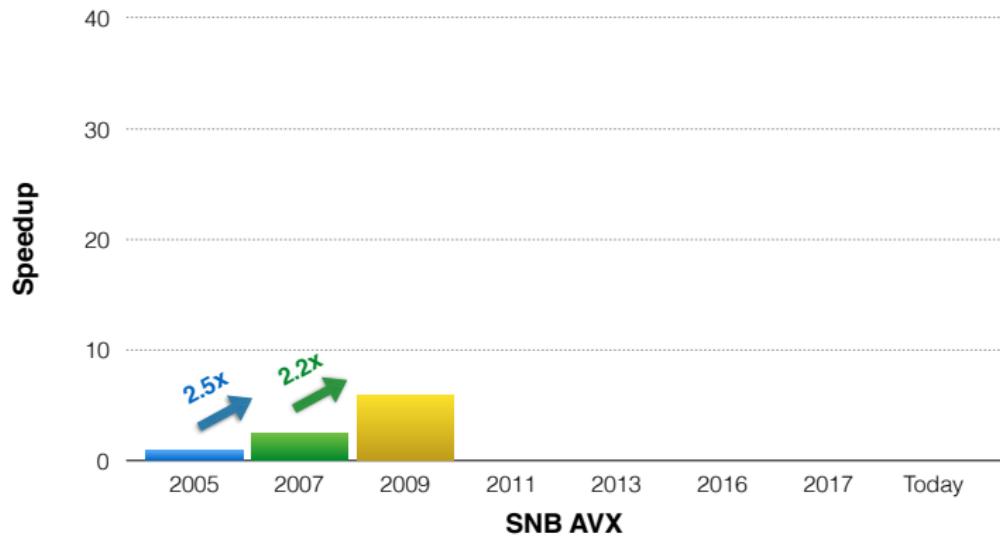
# Performance Evolution of Dense Cholesky Factorization



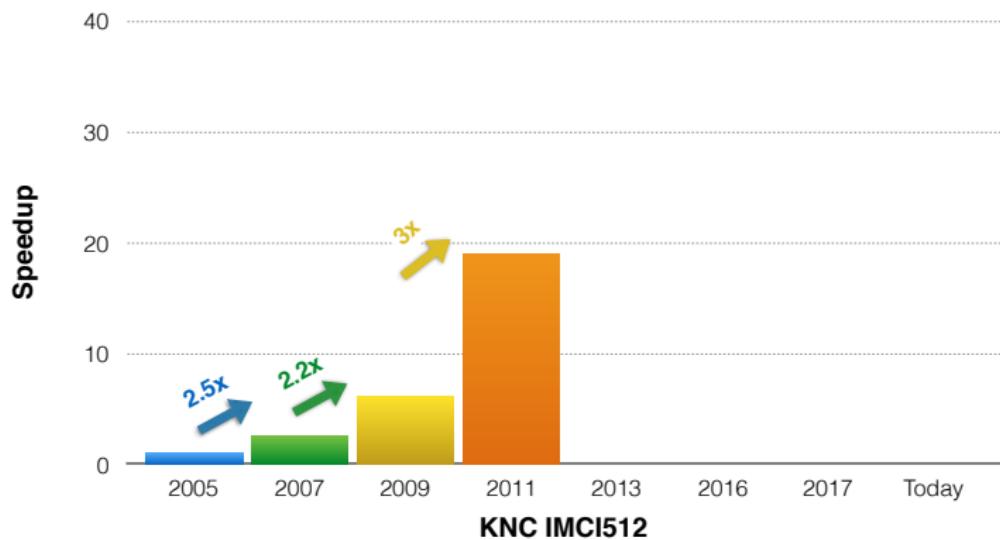
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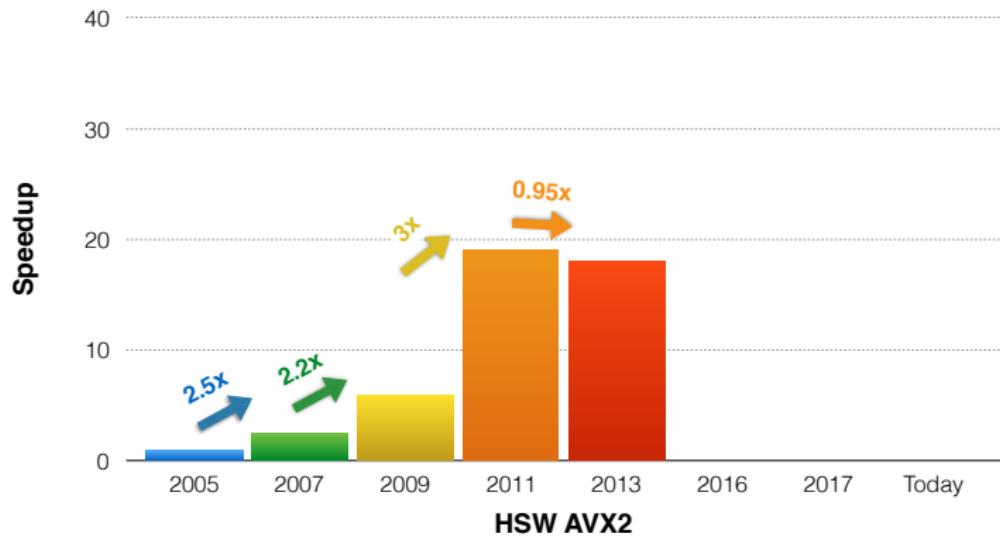
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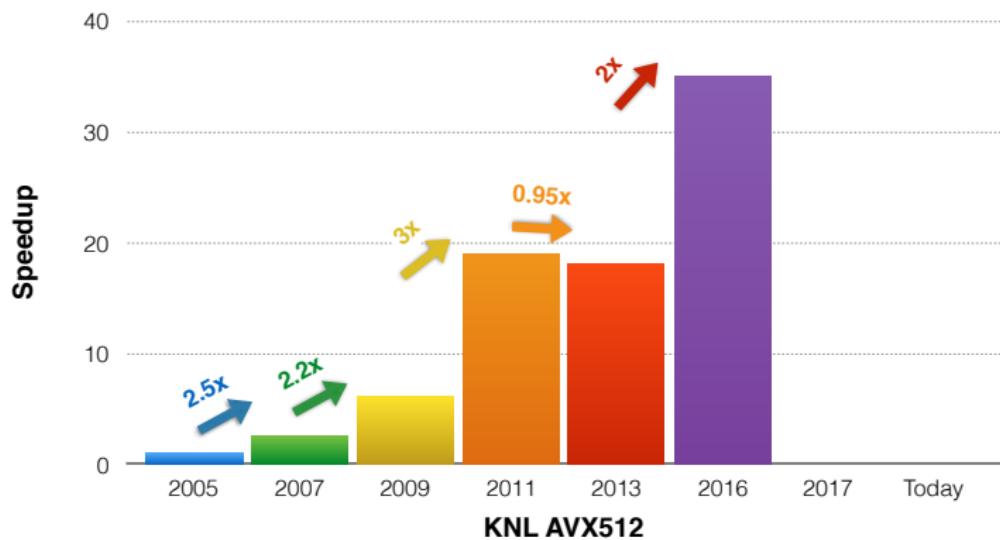
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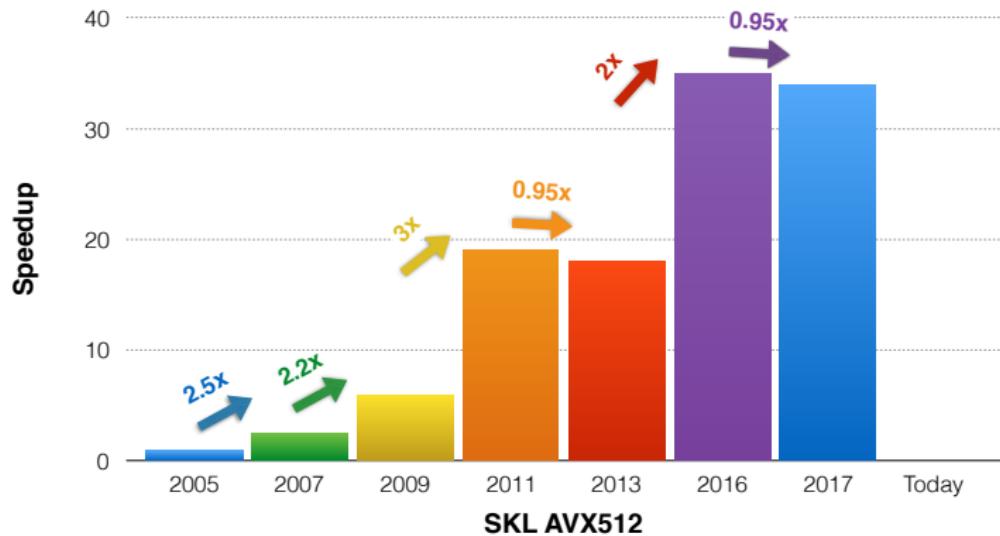
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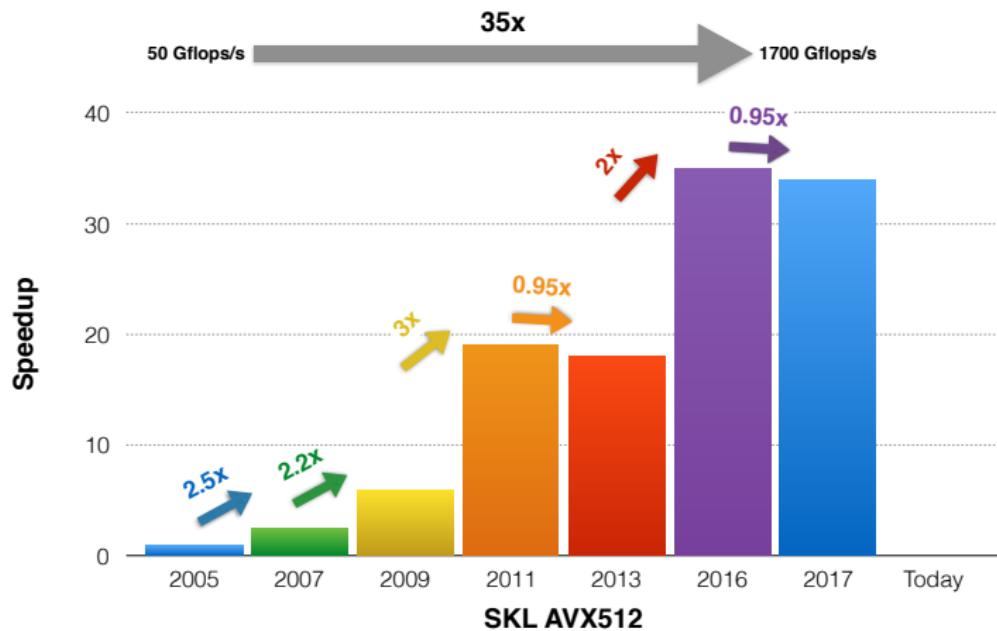
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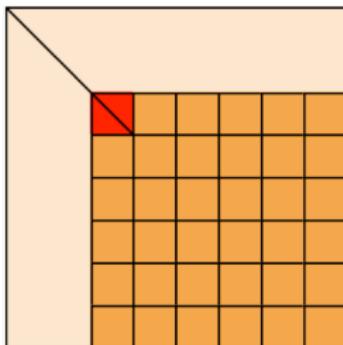
# Performance Evolution of Dense Cholesky Factorization



# Dense Linear Algebra Renaissance

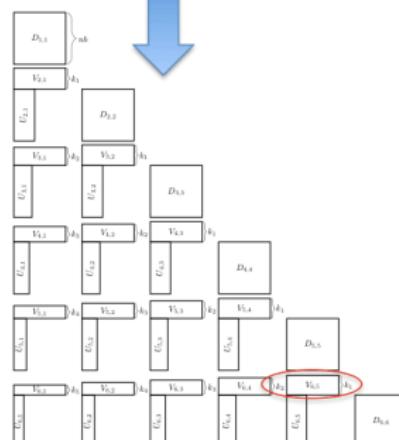


Fixed ranks  
Preconditioners  
Performance oriented



dense tiles  
**Cholesky:  $O(n^3)$**

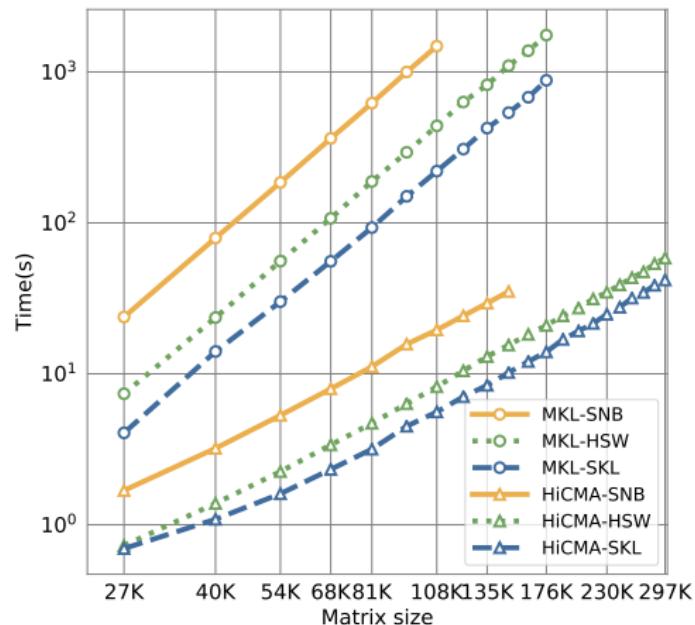
tile low rank  
**Cholesky:  $O(kn^2)$**



Fixed accuracy  
Variable ranks  
Dense/Sparse Direct Solvers

# HiCMA Vs Intel MKL on Shared-Memory Systems

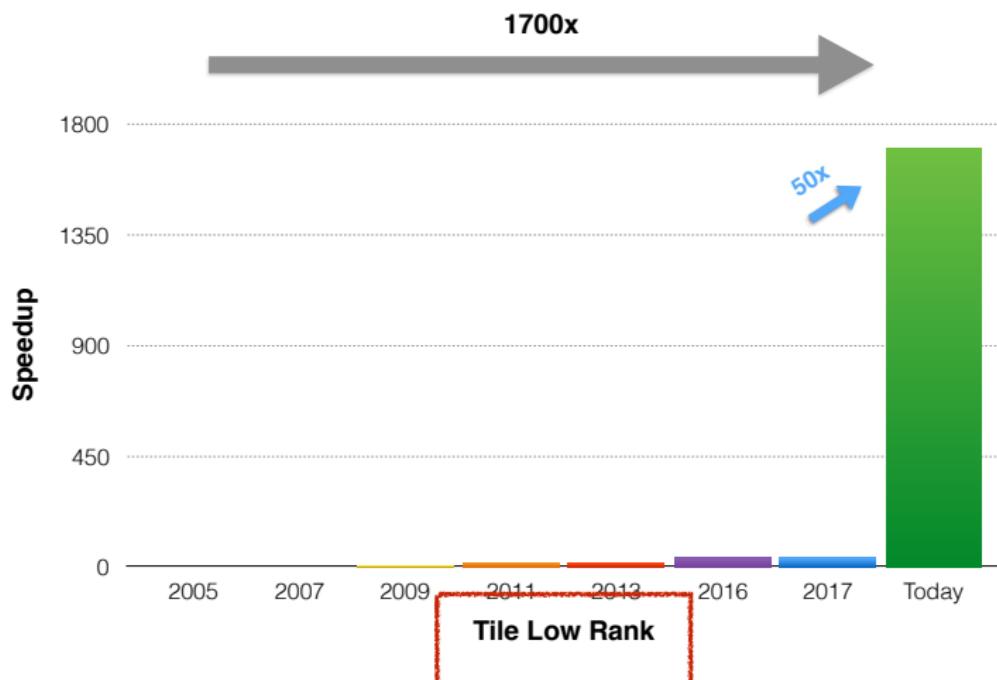
- Geospatial statistic w/ square exp. kernel and acc=1e-8



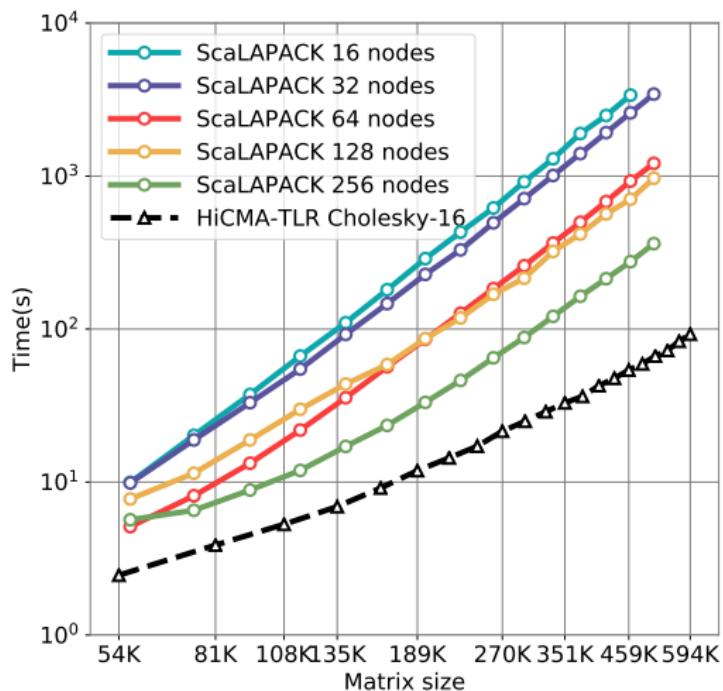
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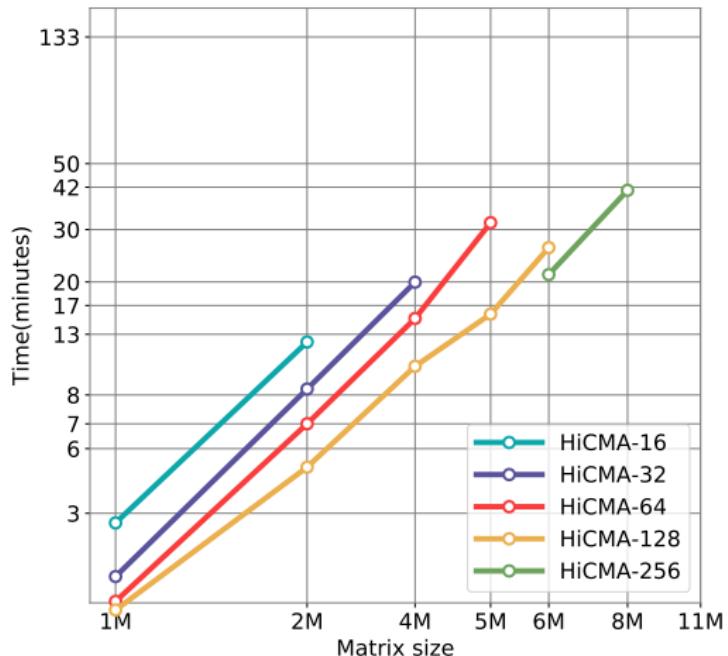
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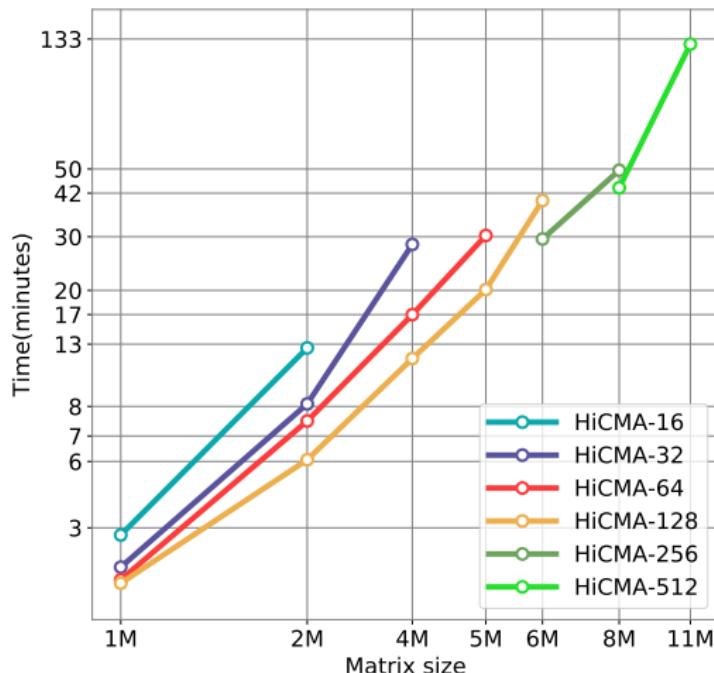
# HiCMA Vs ScaLAPACK on Distributed-Memory Systems



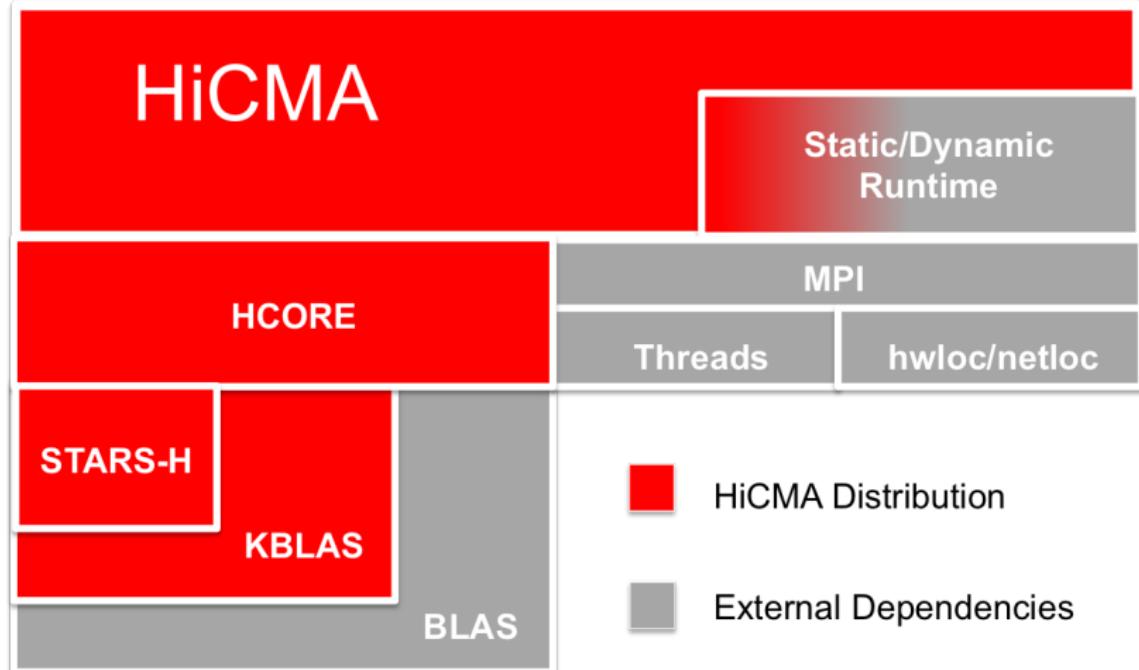
## TLR Cholesky up to 11M (*Shaheen-2*, HSW, Statistics - SqExp kernel, acc= $10^{-9}$ )



## TLR Cholesky up to 8M (SKL Cluster, Turbo On, Statistics - SqExp, acc=10<sup>-9</sup>)



# The HiCMA Library



Available at <http://github.com/ecrc/hicma>