



# Performance Analysis and Optimizations of the Weather Research and Forecasting (WRF) Model

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University of Colorado  
Boulder

**Carnegie Mellon University**



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- Compilers and MPI details
- Scaling Summary
- Hybrid Parallelization
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# Introduction

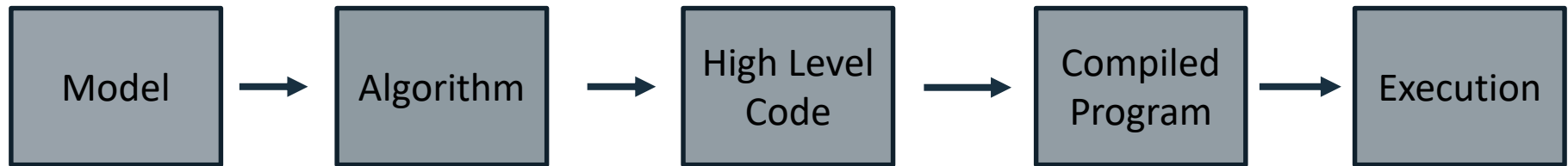
## **The Weather Research & Forecasting(WRF) Model**

- Mesoscale numerical weather prediction system
- Designed for both atmospheric research and operational forecasting needs.
- Used by over 30,000 Scientists around the world.

## **Cheyenne Supercomputer**

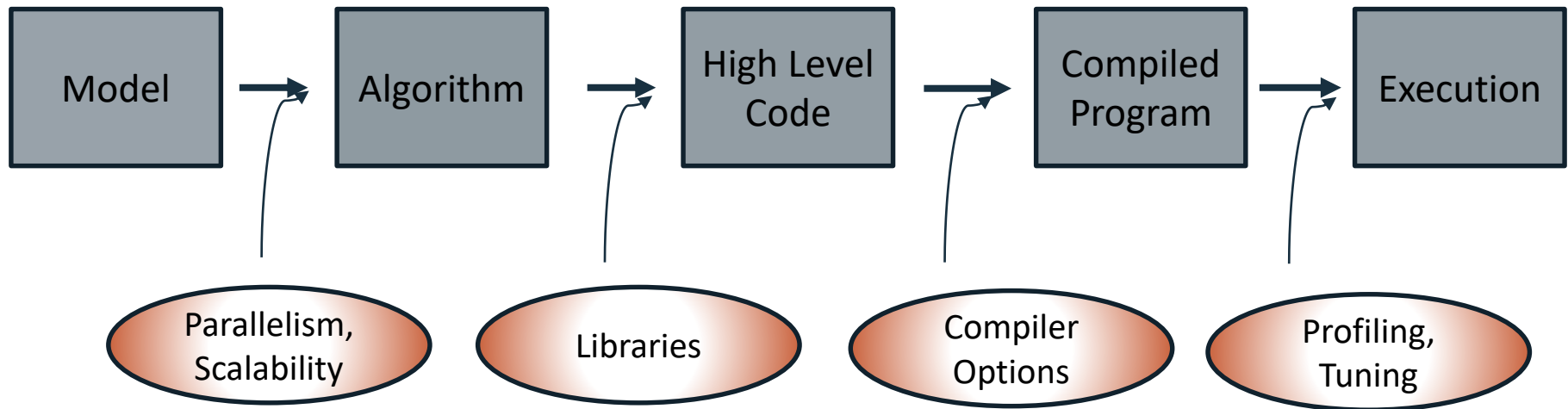
- 4032 dual-socket nodes
- 2.3-GHz Intel E5-2697v4 processors (Broadwell)
- 18 cores/socket
- 313 TB memory
- Partial 9D Enhanced Hypercube single-plane interconnect topology (25 GBps) - Mellanox EDR InfiniBand

# Motivation

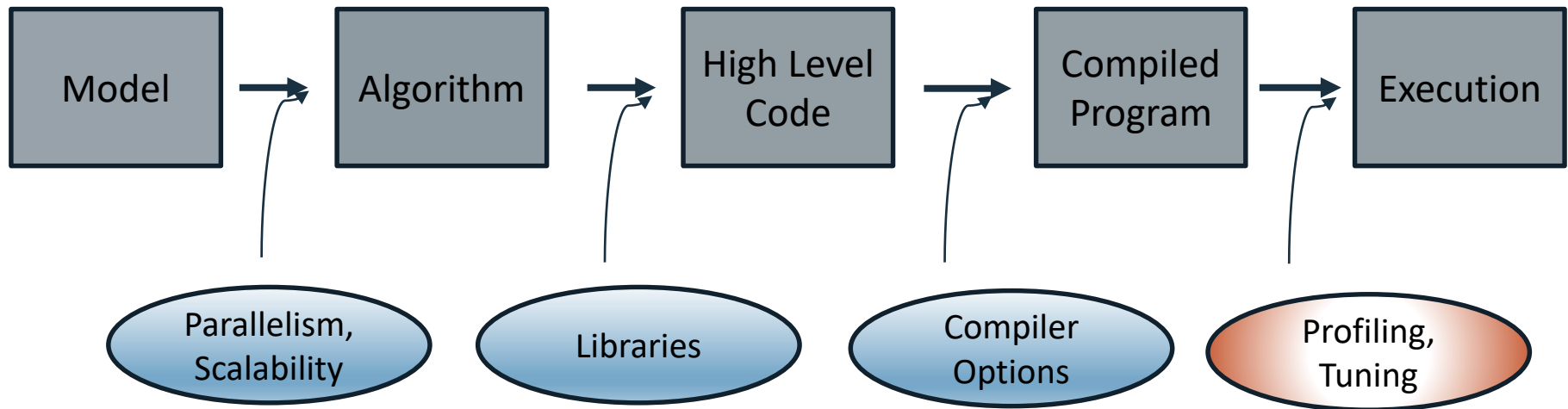


Reproduced from : <https://cvw.cac.cornell.edu/Optimization/overview>

# Motivation



# Motivation

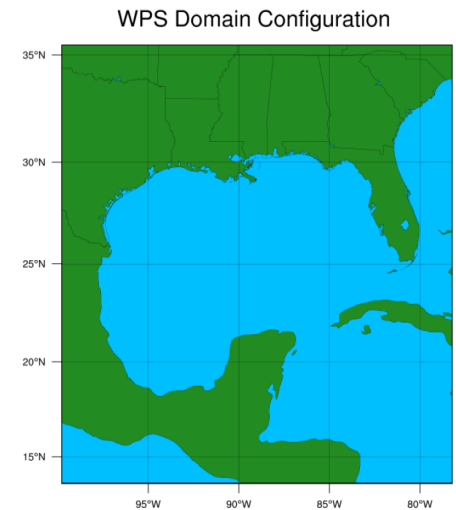


# Scaling WRF

- Motivation
  - How to optimize performance ?
  - Can I solve a problem of a given size in timely manner ?
  - How many core-hours would I need for my problem size ?

# Scaling Summary

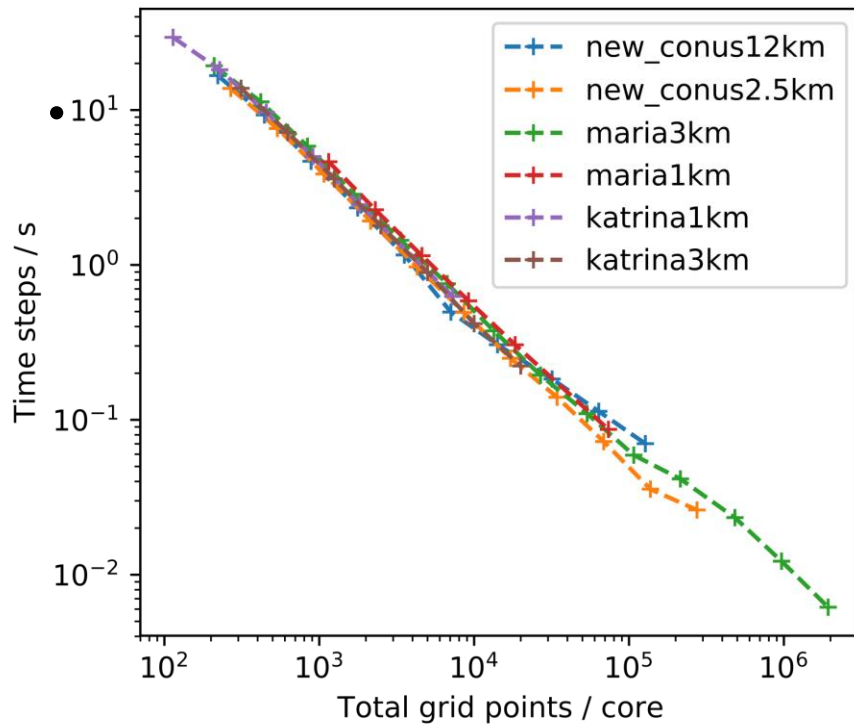
- Compilers : Intel (18,17) , GNU (6.3.0,8.1.0)
- MPI : MPT (2.18) , MVAPICH2, IMPI (2018)
- Case : Katrina 1km, Katrina 3km
- Domain :



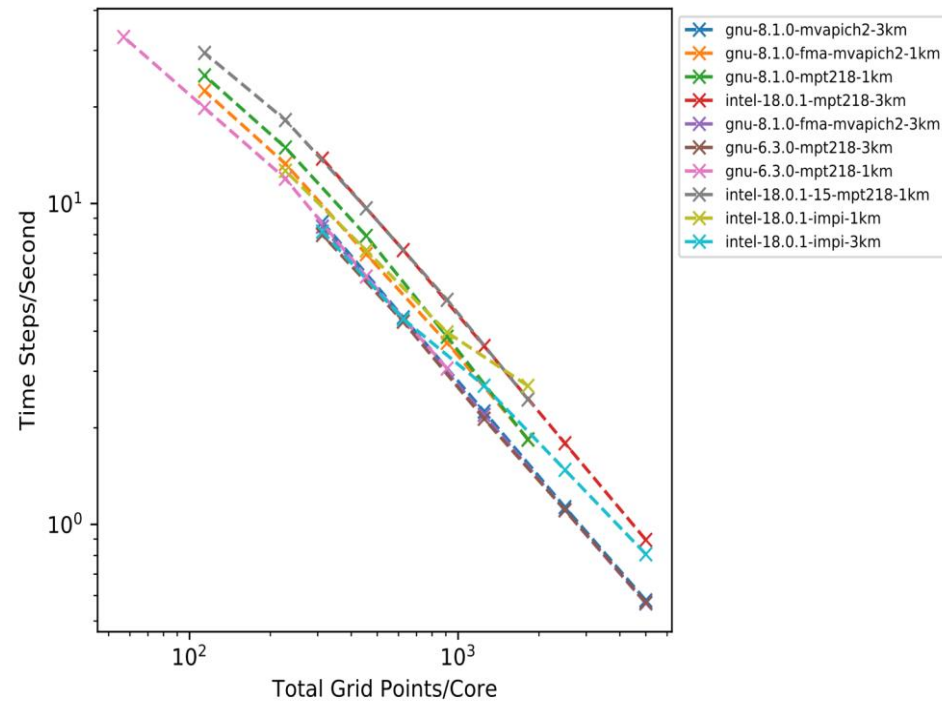
| Case Resolution | Grid Size      | Total Grid Points | Time Steps (sec) | Simulation |
|-----------------|----------------|-------------------|------------------|------------|
| Katrina 1km     | 512 x 512 x 35 | 262,144           | 6                | 12 Hours   |
| Katrina 3km     | 800 x 900 x 35 | 720,000           | 12               | 12 Hours   |

- Physics suite = 'Conus' :
- Higher problem size makes the model unstable (CFL violations)

# Scaling Summary

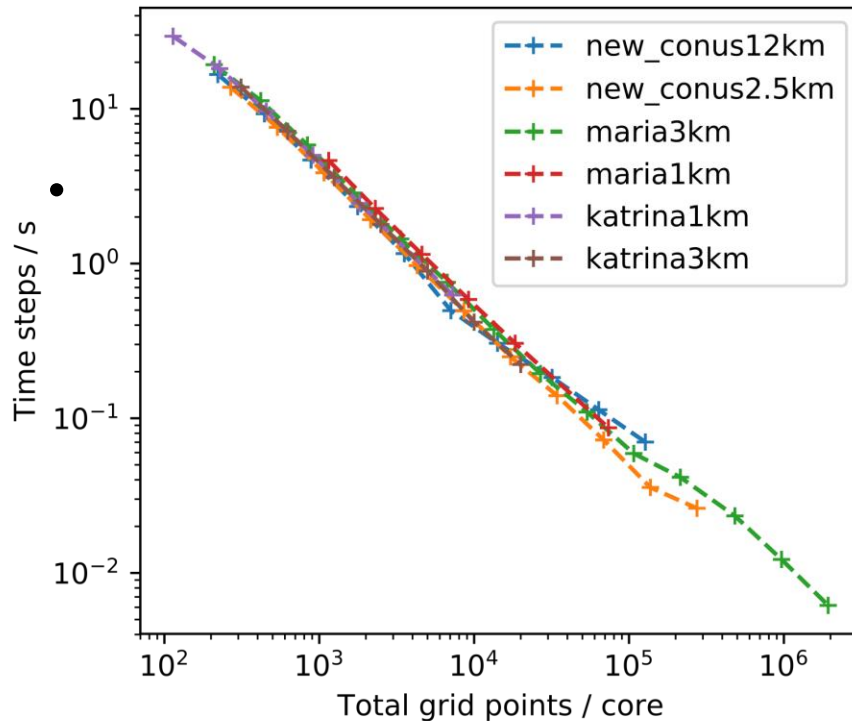


- All cases

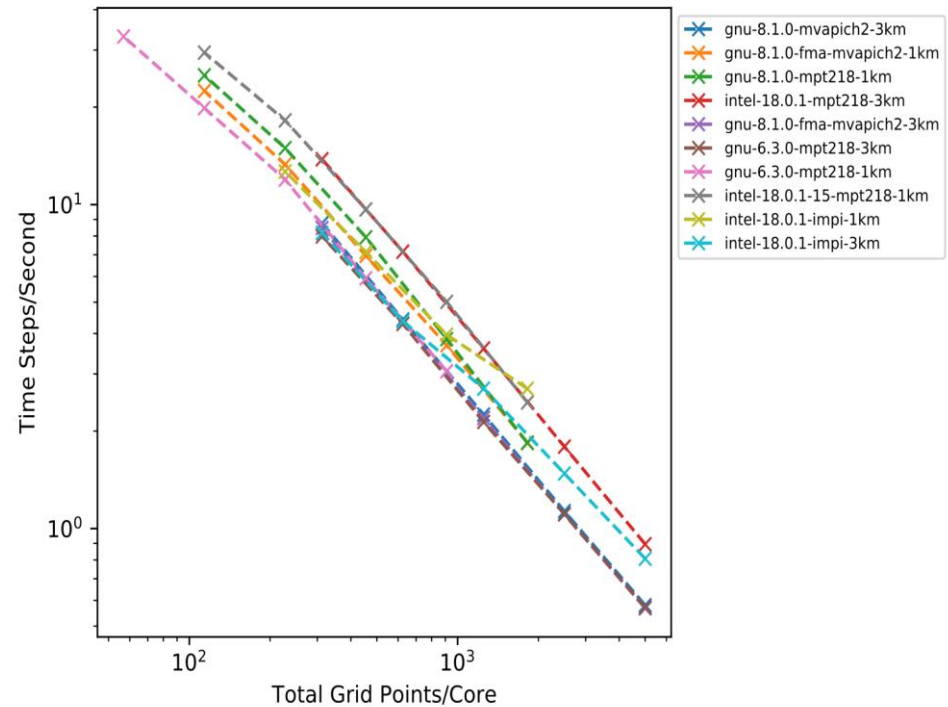


- Katrina Cases

# Scaling Summary



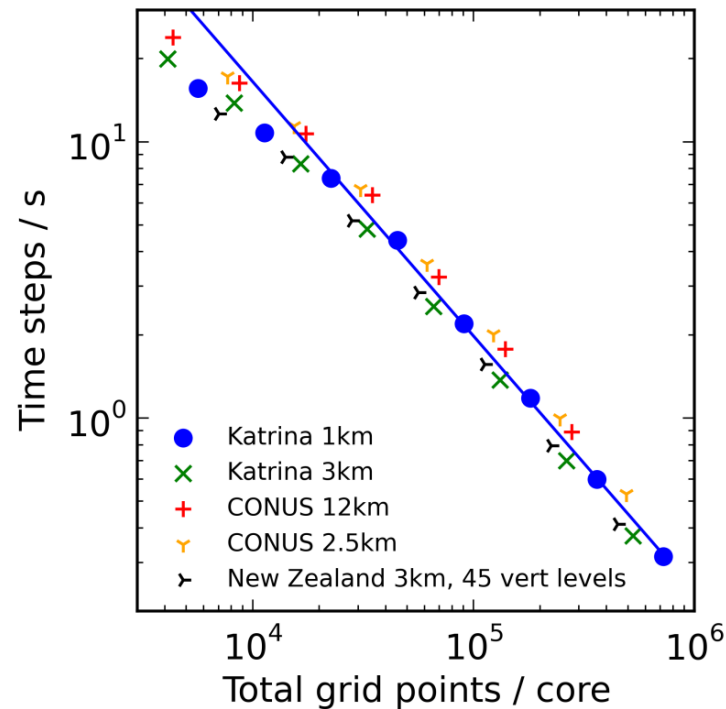
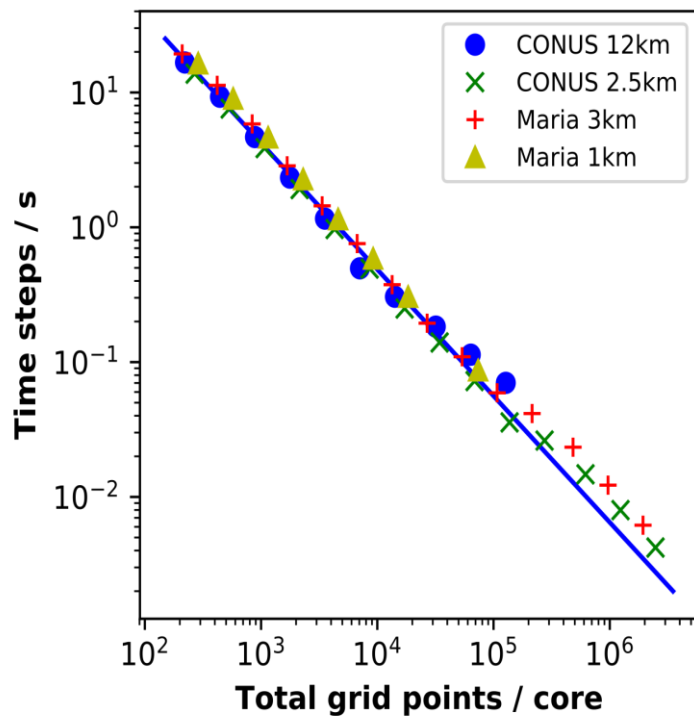
All cases



Katrina Cases

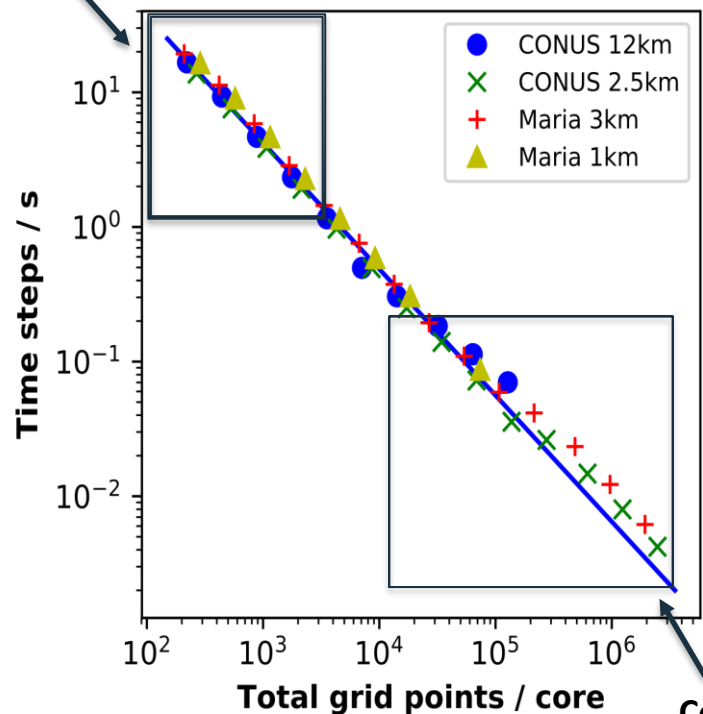
- **Intel 18.0.1 + SGI MPT 2.18 gives best performance**
- GNU + MVAPICH2 < GNU + SGI MPT
- IMPI at high node count doesn't do well.

# Scalability Summary

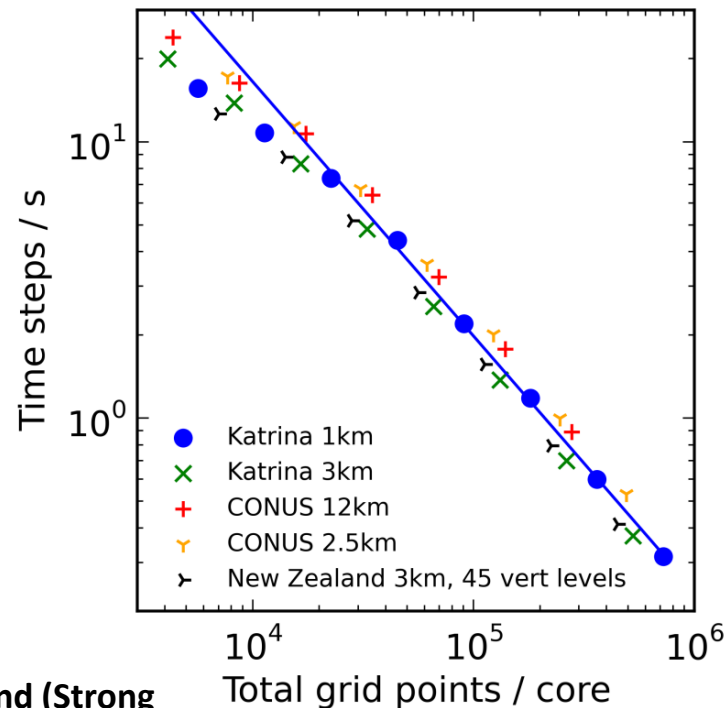


# Scalability Summary

MPI Bound



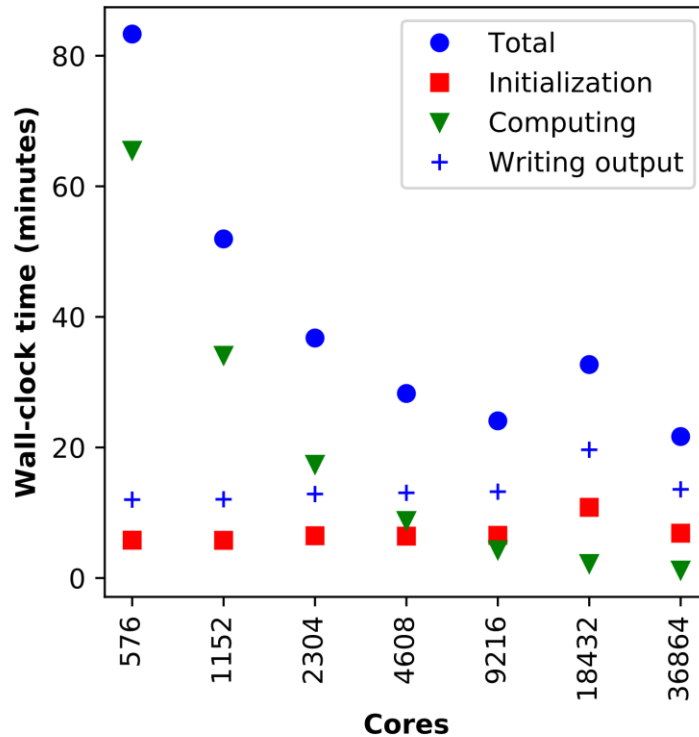
- Cheyenne



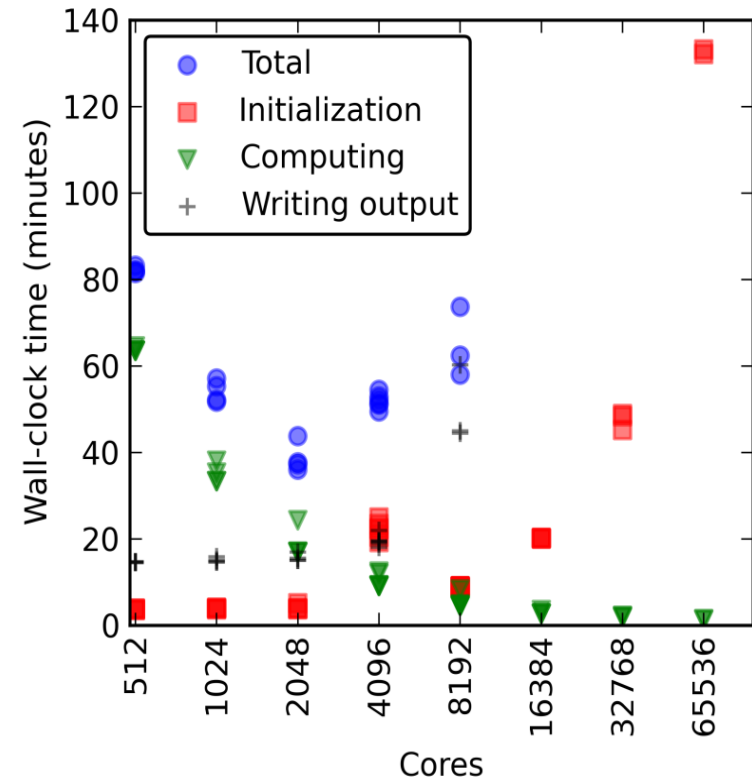
- Yellowstone

- Strong scaling : Keeping problem size fixed, increasing the core-count will increase performance, while the (approx.) same core-hours are consumed

# Scalability Summary



- Cheyenne

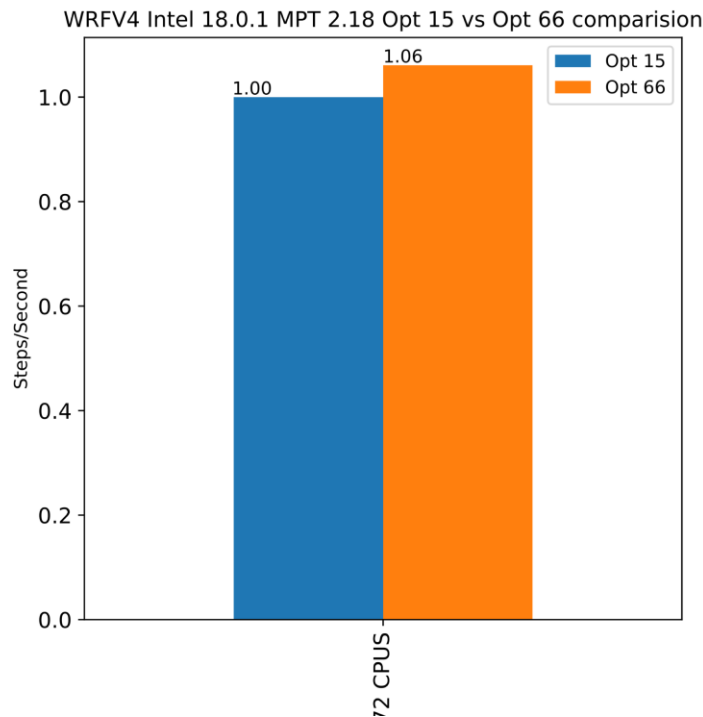


- Yellowstone

- Much better Initialization and I/O due to improvements in WRF

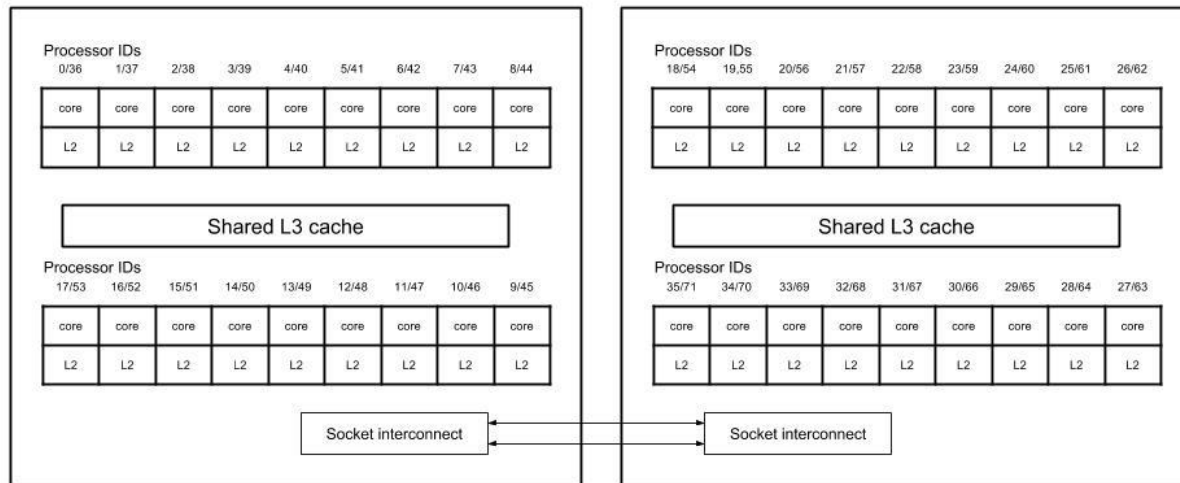
# Compiler Optimizations

- GNU : **-ofast**
- Intel : **-xHost -fp-model fast =2**
- Use Option 66 or 67 for Intel Compiler :
  - **xHost -fp-model fast=2 -xCORE-AVX2**
  - **-no-heap-arrays -no-prec-div -no-prec-sqrt -fno-common**



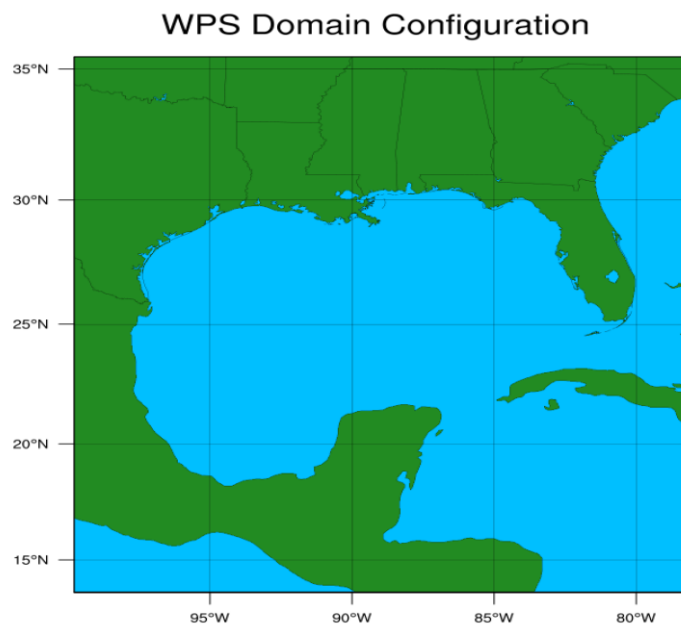
# Hybrid Parallelism

- MPI (Distributed Memory) + OpenMP (Shared Memory)
- Why Hybrid ?
  - Eliminates domain decomposition at node level
  - Better Memory Coherency and less data movement within node
- Cheyenne Node Layout :



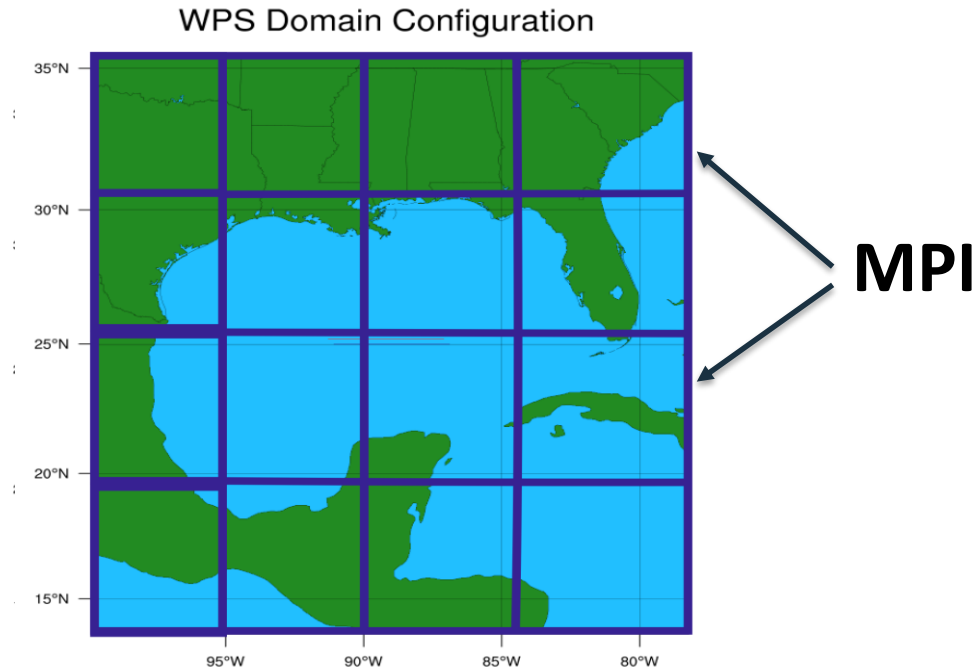
# Hybrid Parallelism

- WRF Tiling :
  - Domain decomposition to divide work



# Hybrid Parallelism

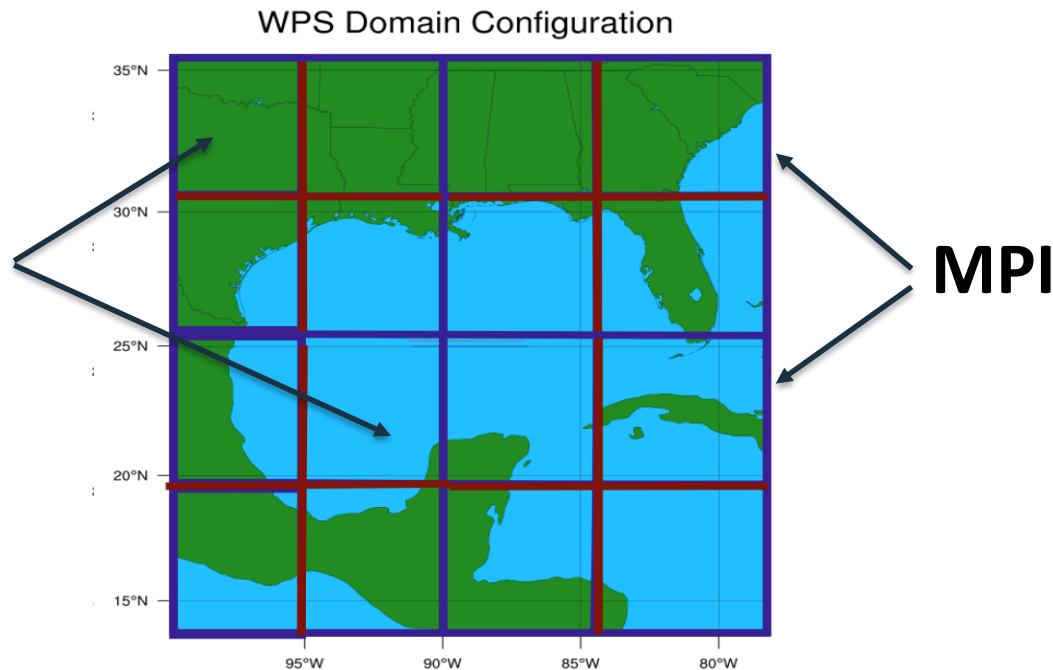
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  - Domain decomposition to divide work
  - Domain first broken into pieces called patches



# Hybrid Parallelism

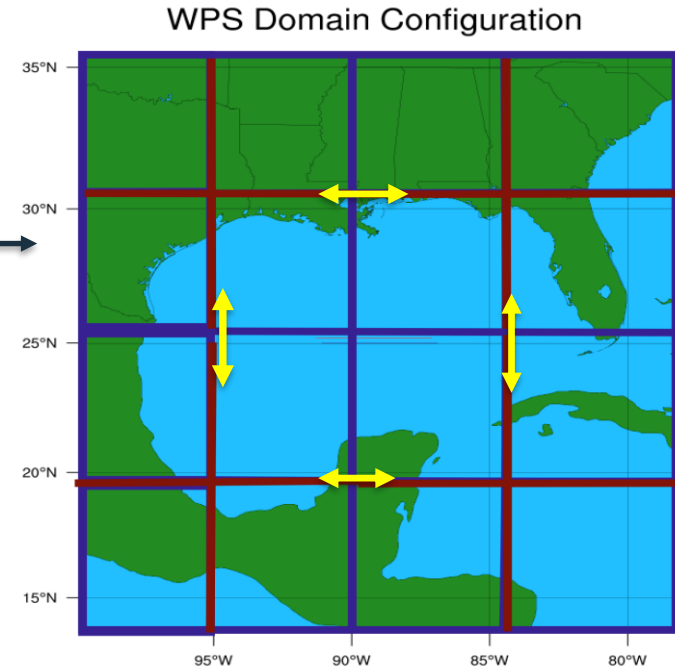
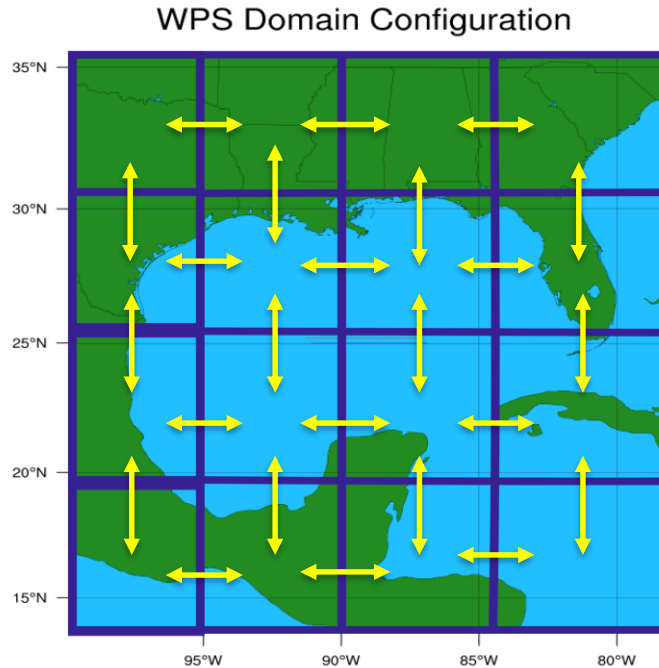
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  - Domain first broken into pieces called patches
  - Each can be further sub divided for shared memory parallelism

**Shared  
Memory**



# Hybrid Parallelism

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  - Domain decomposition to divide work
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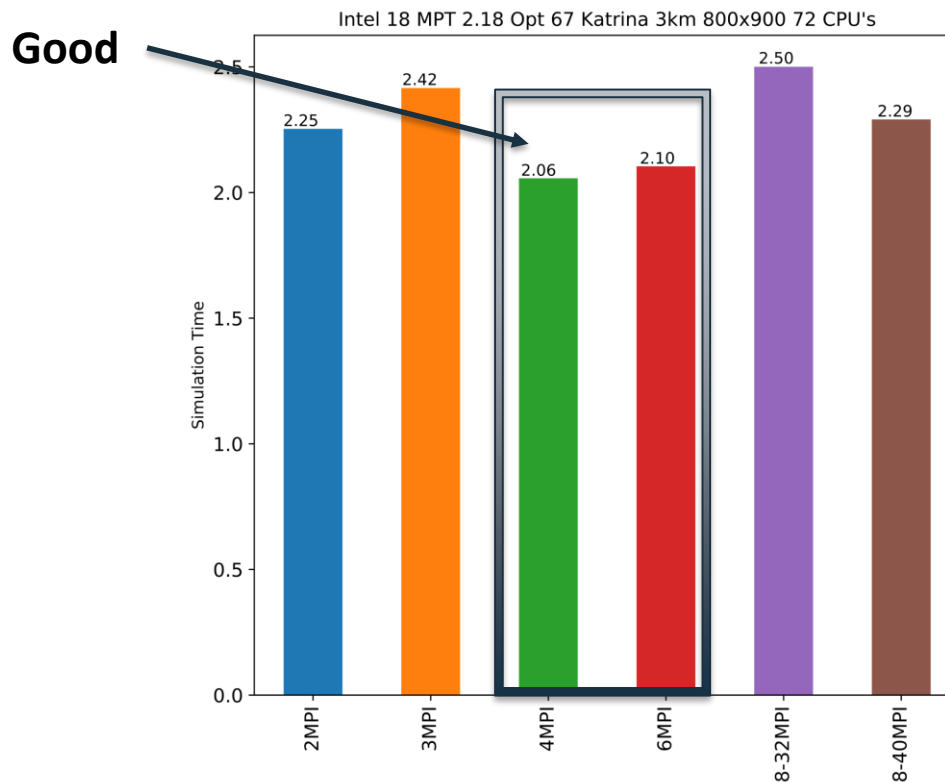


# Hybrid Parallelism

- How many OpenMP threads and MPI tasks ?

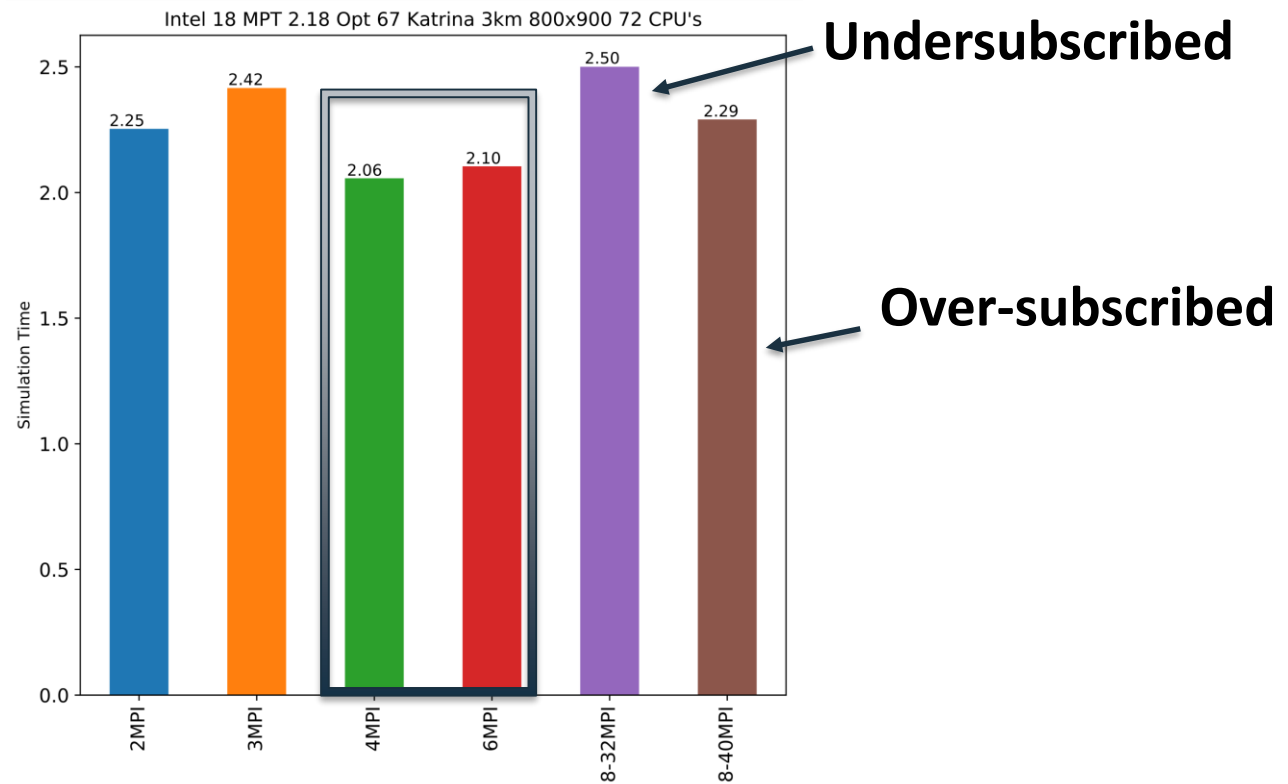
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  - 4MPI+9OMP or 6MPI+6OMP seems to work well



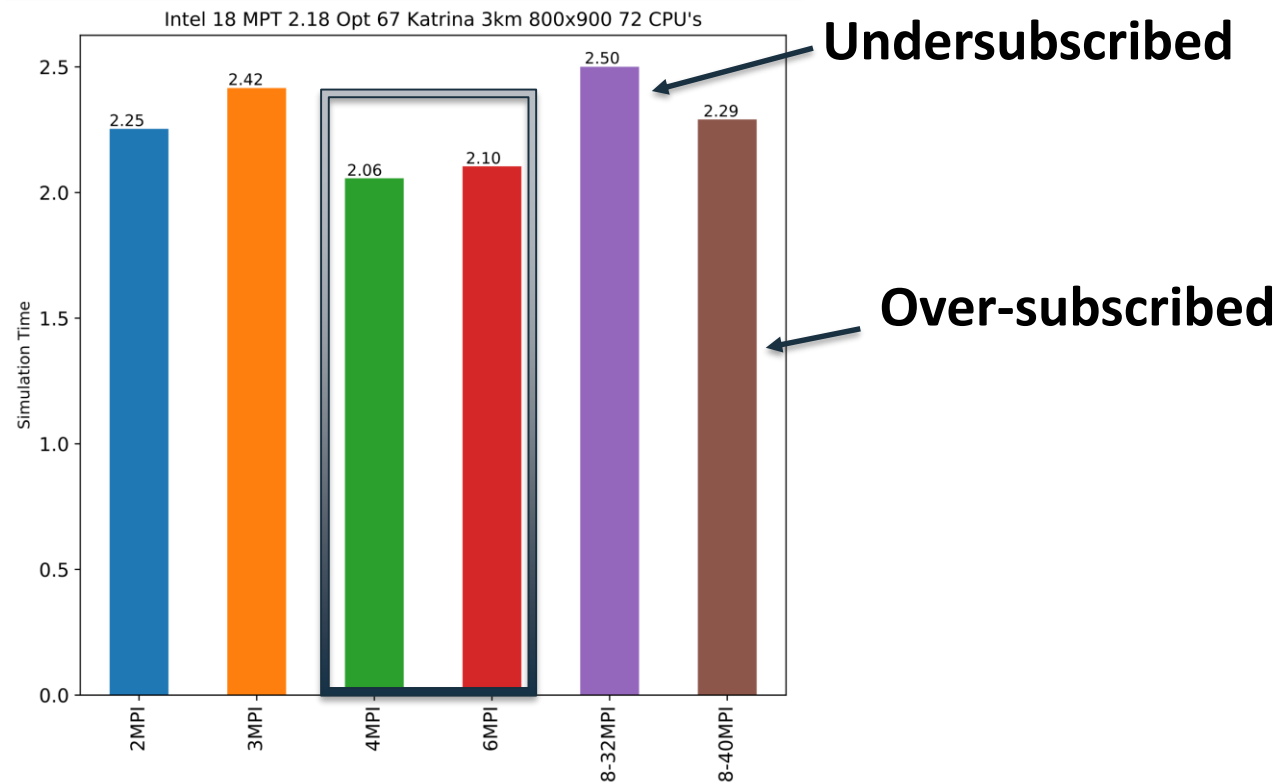
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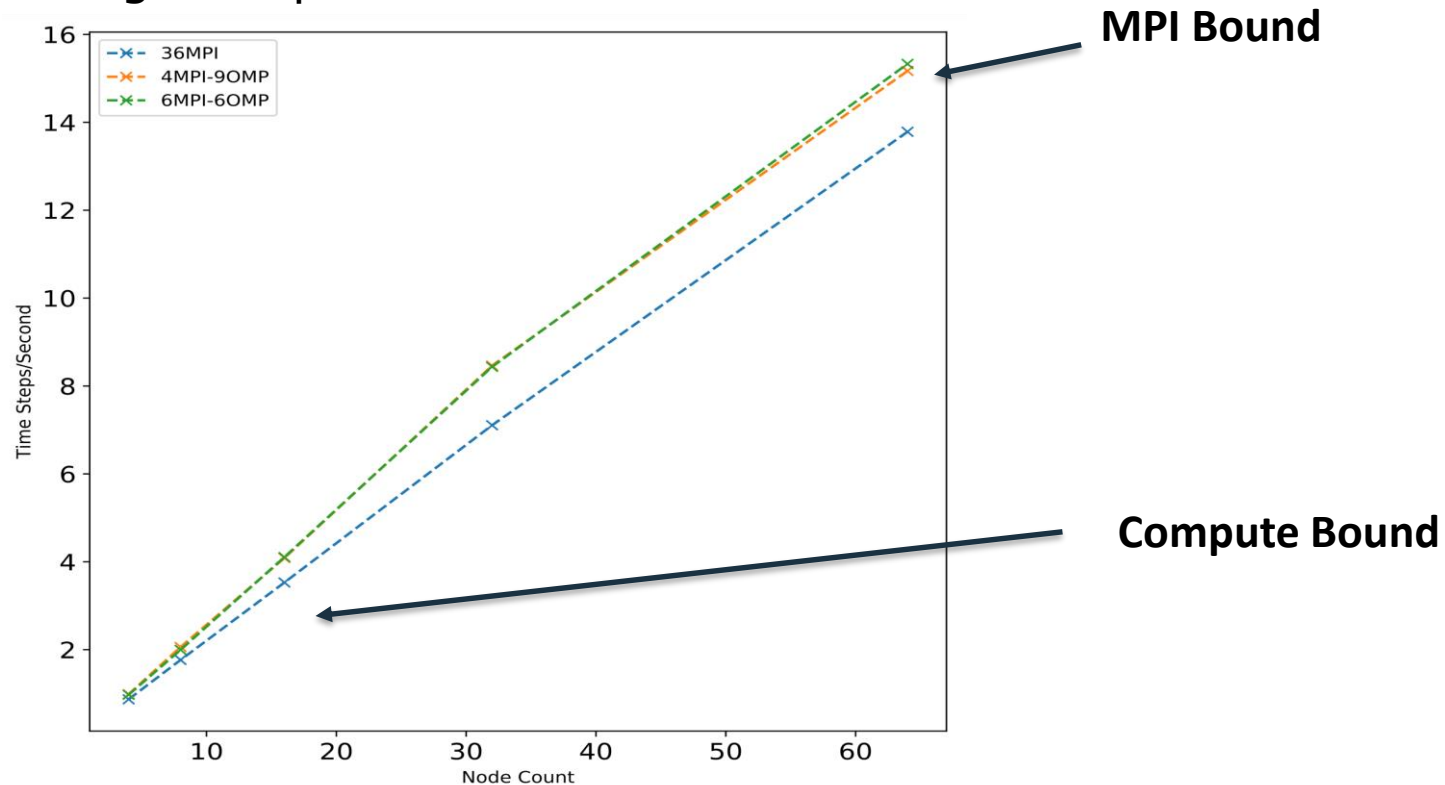
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# Hybrid Parallelism

- How many OpenMP threads and MPI tasks ?
  - 4MPI+9OMP or 6MPI+6OMP seems to work well
  - Better Scaling than pure MPI

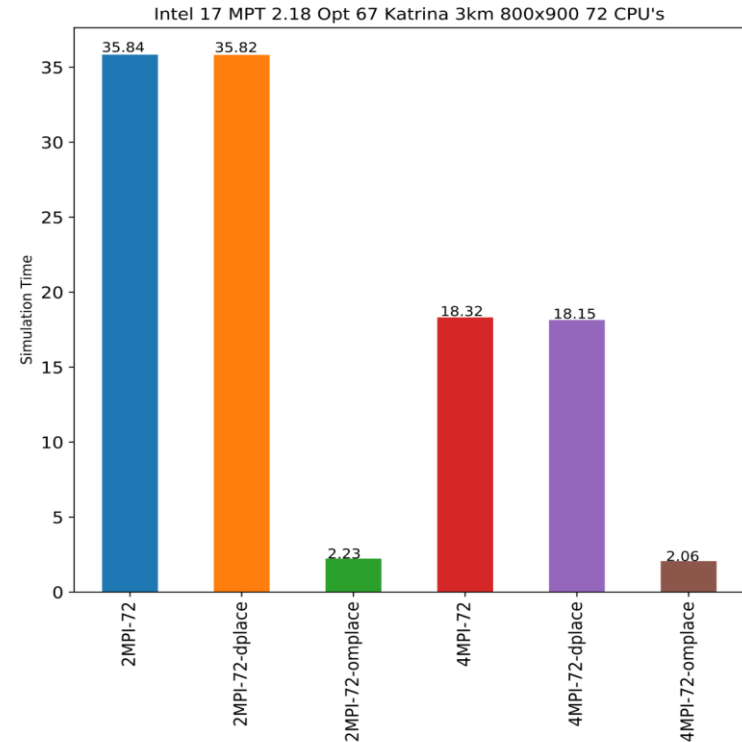


# Core Affinity/ Binding

- Above runs use core affinity

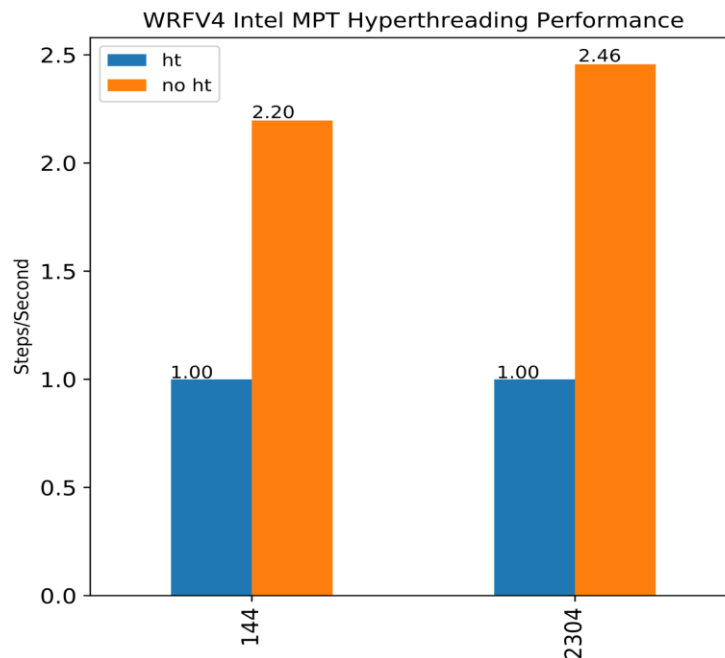
# Core Affinity/Binding

- Above runs use core affinity
  - Omplace -vv



# Hyperthreading Results

- Hyperthreading on Cheyenne :
  - Single Core acts like two logical cores
  - Model performance was significantly reduced
  - Do not recommend using more than 36 cores per node



# Conclusion

- We recommend running WRF with the latest Intel compiler (18.0.1) and MPT (2.18) library. It consistently gave better performance than other options.
- For intel compilation's : `-xHost -fp-model fast =2 -xCORE-AVX2` option turned on. For GNU, use `-ofast`
- For hybrid runs, thread affinity significantly affects performance. Use `omplace` or `dplace` (if you want to specify explicitly the CPU mapping)
- Hyperthreaded runs lowered model performance

# Future Work

1. Investigate MVAPICH Environment settings
  1. Eg : Inter-node Communication : Eager vs Rendezvous Protocol  
( MV2\_VBUF\_TOTAL\_SIZE & MV2\_IBA\_EAGER\_THRESHOLD & MV2\_SMP\_EAGERSIZE )
  2. WRF crashes around a size of **2k** & halts at **128k** (64 nodes)
2. Explore different patching/tiling strategies for domain decomposition
3. Explore different core binding strategies for hybrid runs to understand impact on performance at high node counts.
4. Personal : Tools to profile application : WRF Advection Code

# Acknowledgements

- Mentors :
  - Davide Del Vento
  - Brian Vanderwende
  - Negin Sobhani
  - Alessandro Fanfarillo
- Project Partner :
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  - Rich Loft
  - and fellow interns !