

# An Improved Multi-Scale Modeling Framework for WRF Over Complex Terrain

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DISTRICT



# Outline

- Neighborhood-scale air quality modeling
- Introduction to multi-scale modeling
- Weather Research and Forecasting (WRF) model
- The immersed boundary method and WRF
- Vertical grid nesting in WRF
- WRF to WRF-IBM grid nesting (in development)

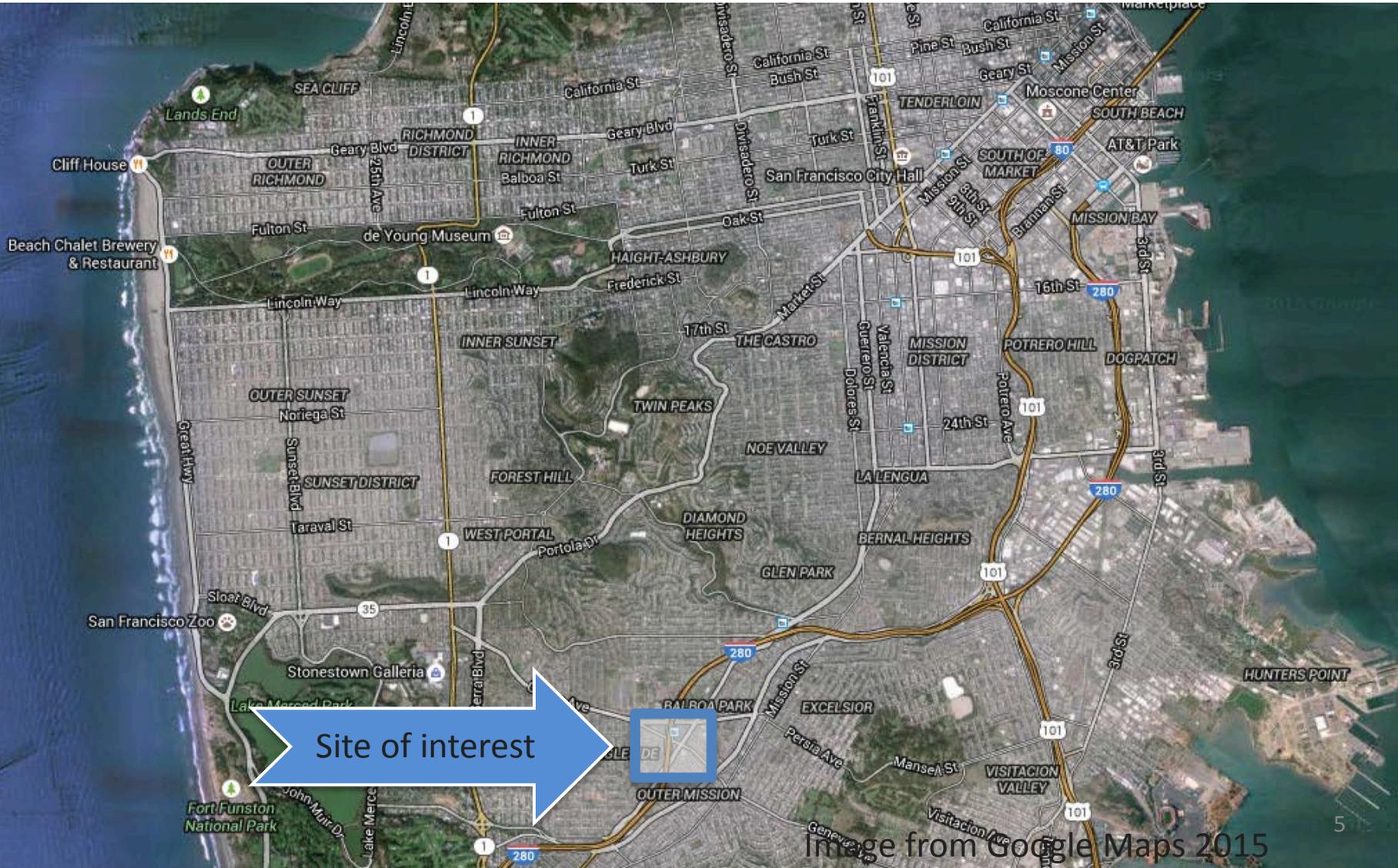
# San Francisco Air Quality Modeling



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Image from Google Earth 2013

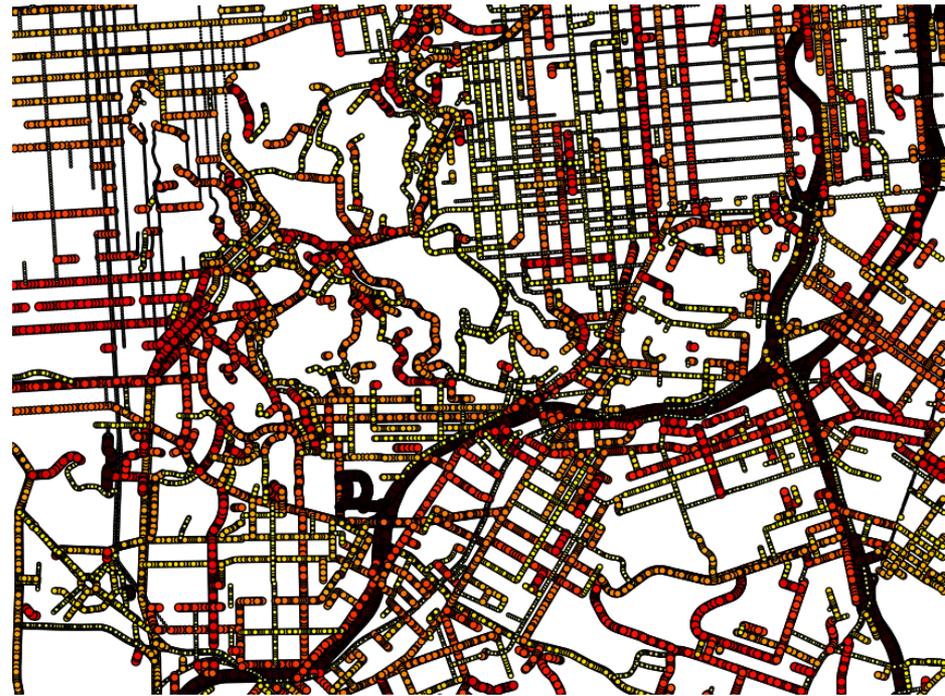
# Urban Topography

- LiDAR dataset of building heights above ground level
  - Provided by the San Francisco Department of Public Health
- Combined with National Elevation Dataset 1/3<sup>rd</sup> arc-second ground topography



# PM2.5 Emissions

- Provided by the Bay Area Air Quality Management District.
- ~2m resolution.
- Weighted depending on the time of day and weekday.

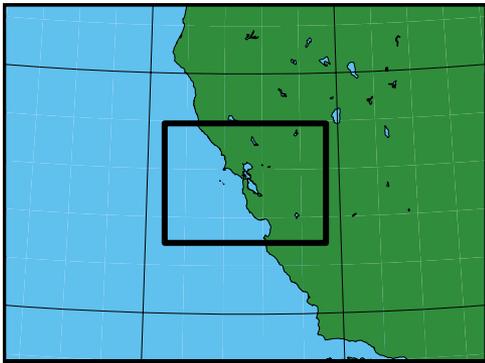


# Options For Modeling of Urban Dispersion

- 1) Add atmospheric physics to a computational fluid dynamics (CFD) model.
- 2) Couple a CFD model to a numerical weather prediction (NWP) model.
- 3) Downscale to CFD-scales within a NWP model.

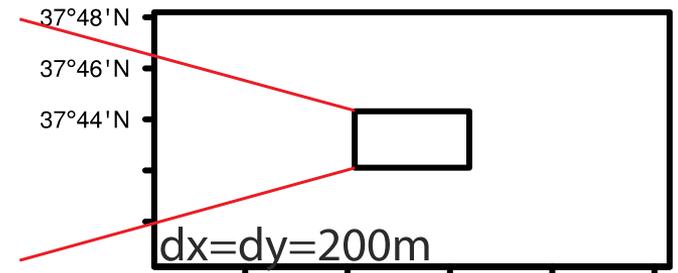
# Multi-Scale Atmospheric Modeling

- Resolves features between synoptic-scale and turbulent-scale.



$dx=dy=2.66\text{m}$

$dx=dy=40\text{m}$



# Meso-Scale to Micro-Scale

Scale	Feature Size	Features Resolved
Meso-alpha	2000km – 200km	tropical cyclones, weather fronts
Meso-beta	200km – 20km	land-sea breeze, lake effect snow storms
Meso-gamma	20km – 2km	thunderstorm convection, large-scale terrain effects
Micro	1km – 1m	turbulent mixing, convection



Current Generation Models

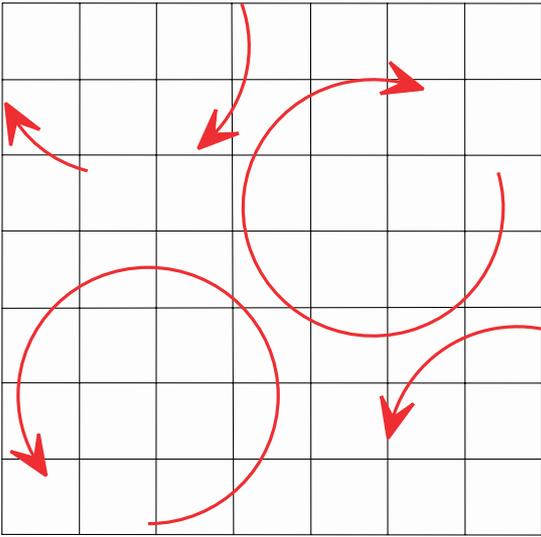
1950-1980



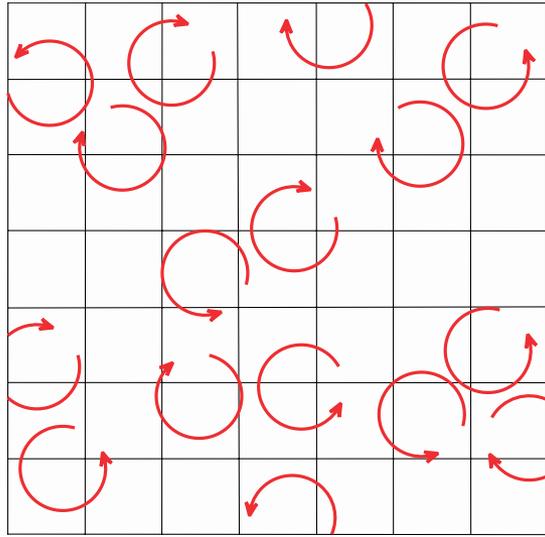
1980-1990

# Wyngaard's "Terra-Incognita"

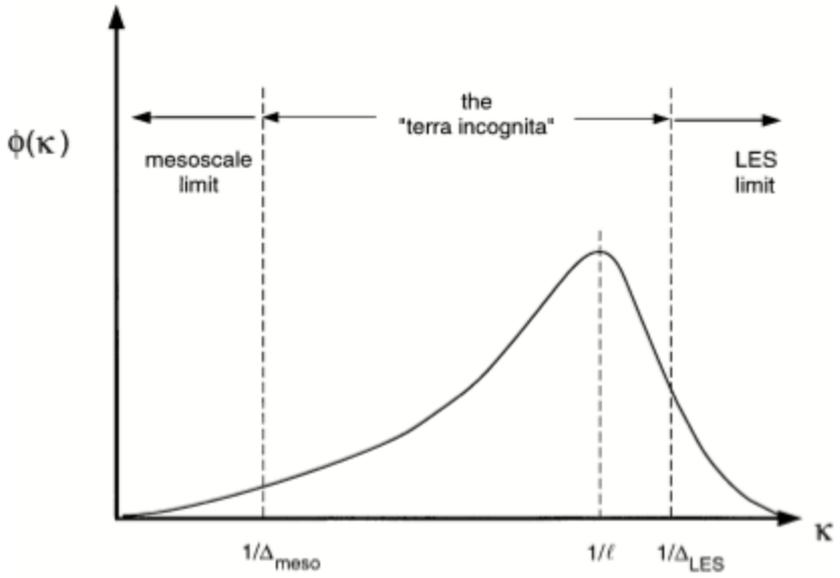
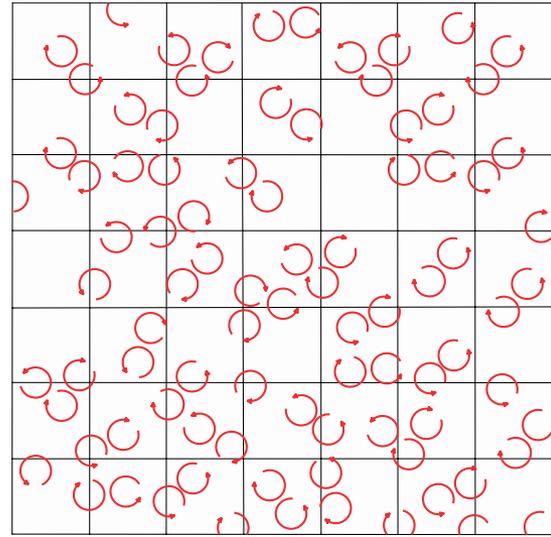
$l/\Delta \gg 1$   
micro-scale



$l/\Delta \approx 1$



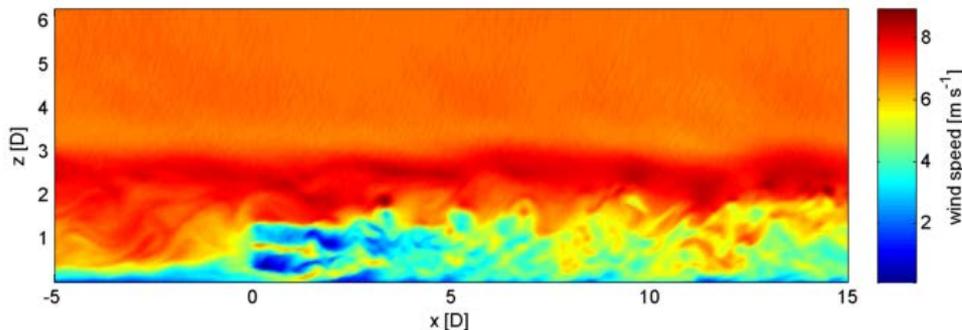
$l/\Delta \ll 1$   
meso-scale



Wyngaard, J., 2004:  
*Toward numerical modeling in the "terra incognita".*  
Journal of the Atmospheric Sciences, 61, 1816-1826.

# Potential Applications for Multi-Scale Modeling

- Wind energy forecasting and turbine siting
- Mountain meteorology
- Urban meteorology
- Dispersion modeling
- Operational forecasting (someday)



Aitken ML, Kosovic B, Mirocha JD, Lundquist JK, 2014: Large-eddy simulation of wind turbine wake dynamics in the stable boundary layer using the Weather Research and Forecasting model, *J. Renewable and Sustainable Energy*, 6

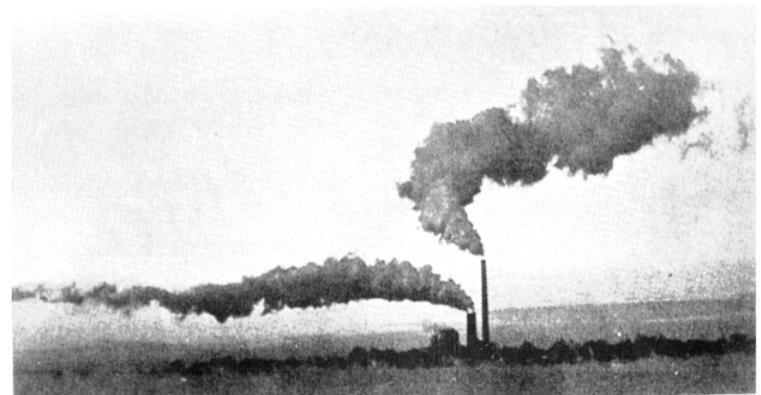
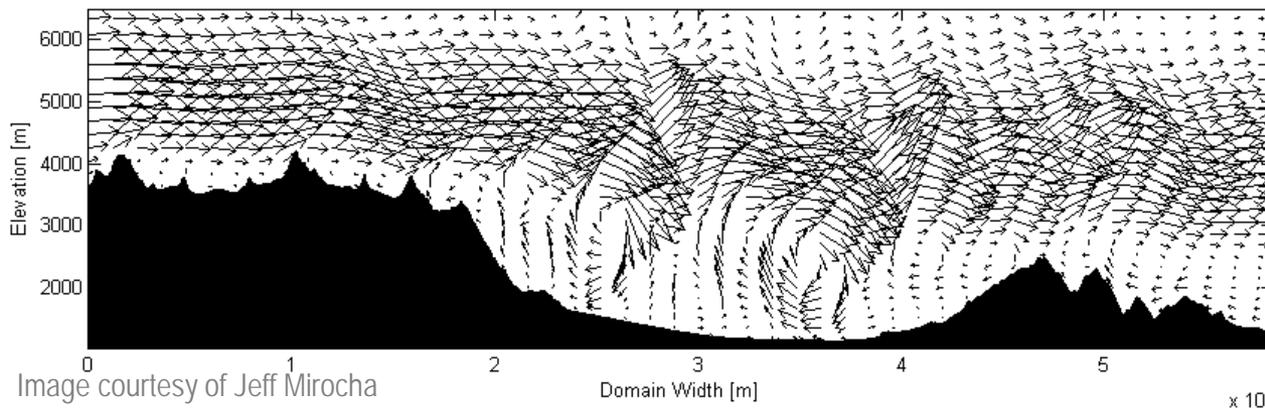
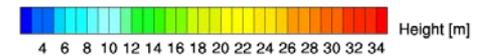
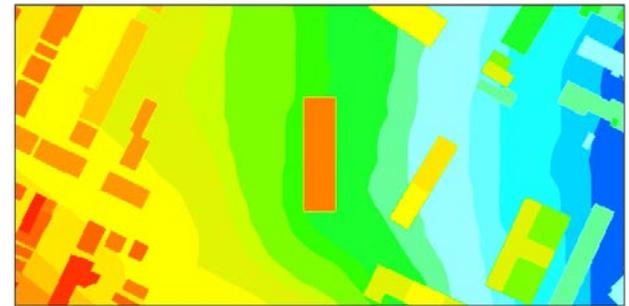


Photo credit: Ralph Turncotte. From Sea Breeze and Local Winds by John E. Simpson.

# What's Needed for Multi-Scale Modeling?

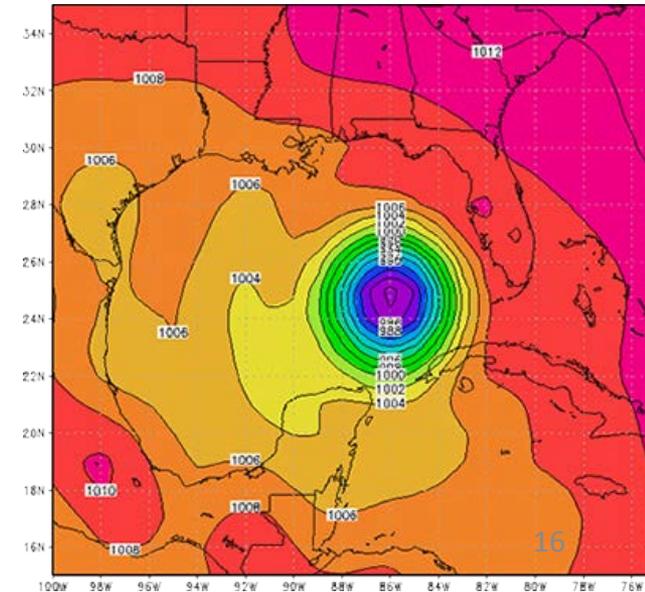
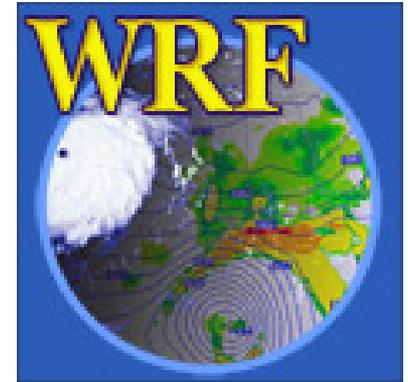
- Meso-scale model
  - Weather Research and Forecasting (WRF) model
- Turbulence modeling at high resolutions
  - Large Eddy Simulation (LES)
- Ability to handle complex terrain
  - Immersed boundary method (WRF-IBM)
- Ability to downscale information
  - Vertical grid nesting in WRF
- Adaptive or scale-dependent parameterizations



Numerical Weather Prediction Model		Horizontal Resolution		Operational
		At Launch	Currently	
NGM	Nested Grid Model	90km		1987-2000
ECMWF	European Center for Medium-Range Weather Forecasting	125km	16km	1987+
RUC	Rapid Update Cycle	60km	13km	1994-2012
	Eta	29km		1995-2006
NAM	North American Meso-scale	12km		2006+
GFS	Global Forecast System	28km	13km	2002+
RAP	Rapid Update Cycle	13km		2012+
HRRR	High-Resolution Rapid Refresh	3km		2013+
FIM9.5	Flow-Following Finite-Volume	15km		2014+

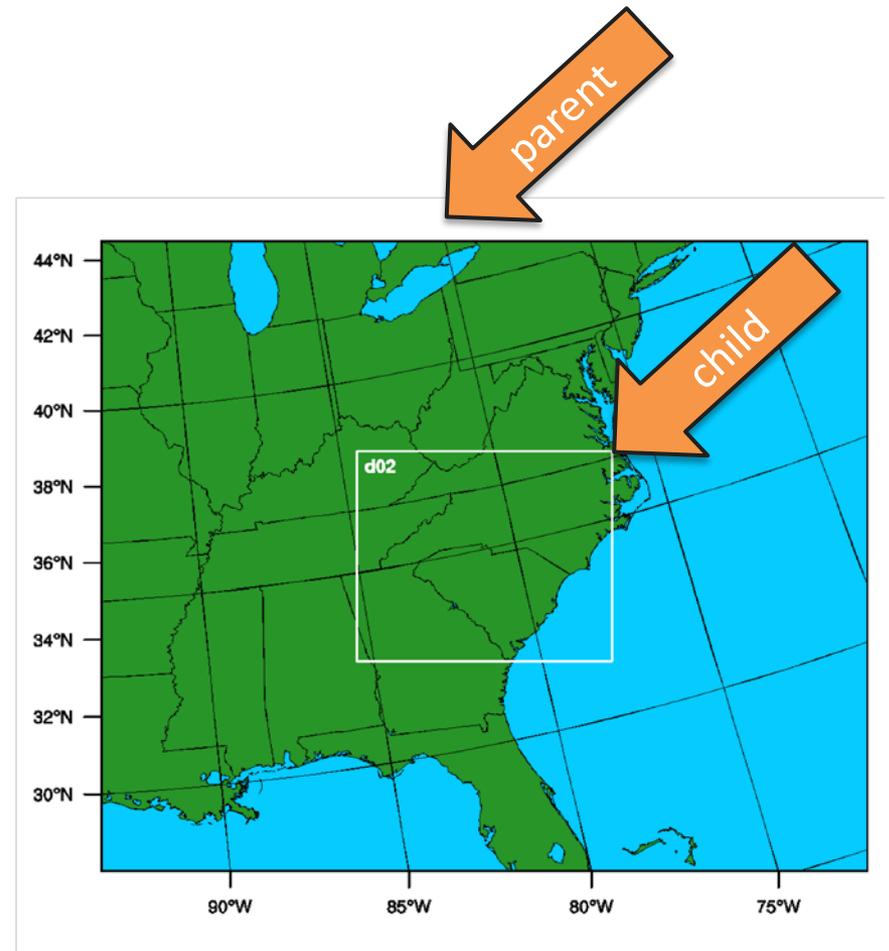
# The Weather Research and Forecasting Model

- Meso-scale, regional, numerical weather prediction (NWP) model
- Open-source, community developed
- Maintained by the National Center for Atmospheric Research
- Fully compressible and nonhydrostatic
- Large eddy simulation capable
- Parameterizations for land surface model physics, long and shortwave radiation, subgrid-scale cumulus development, microphysics, etc...
- Downscaling using grid-nesting



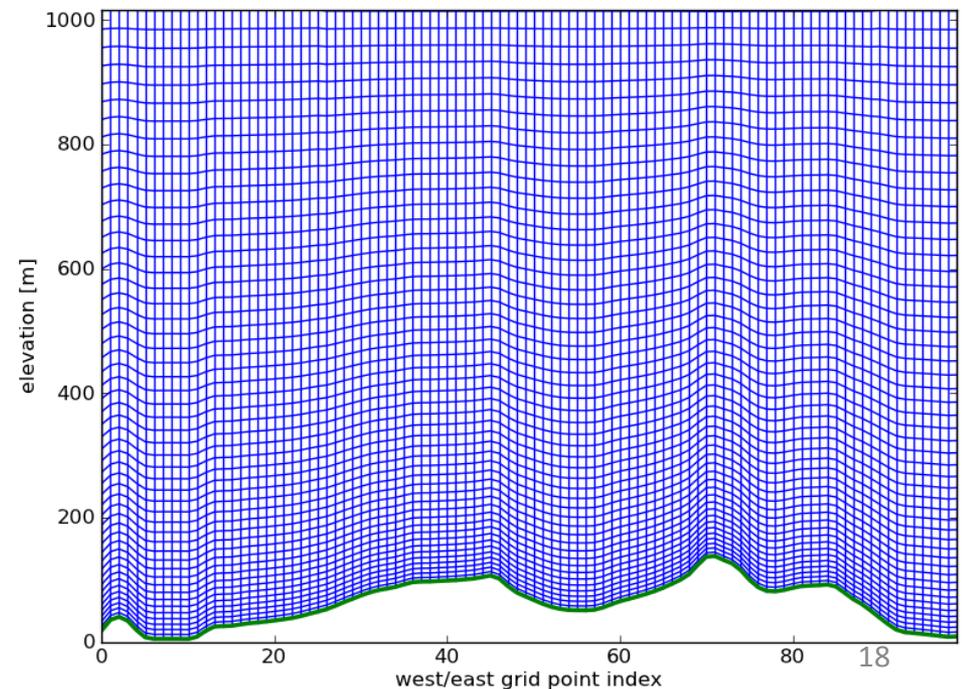
# Downscaling With Grid Nesting

- Coarse-resolution “parent” grid provides data for initialization and boundary conditions of fine-resolution “child” grid.
- Enables large-scale features to influence the child domain.

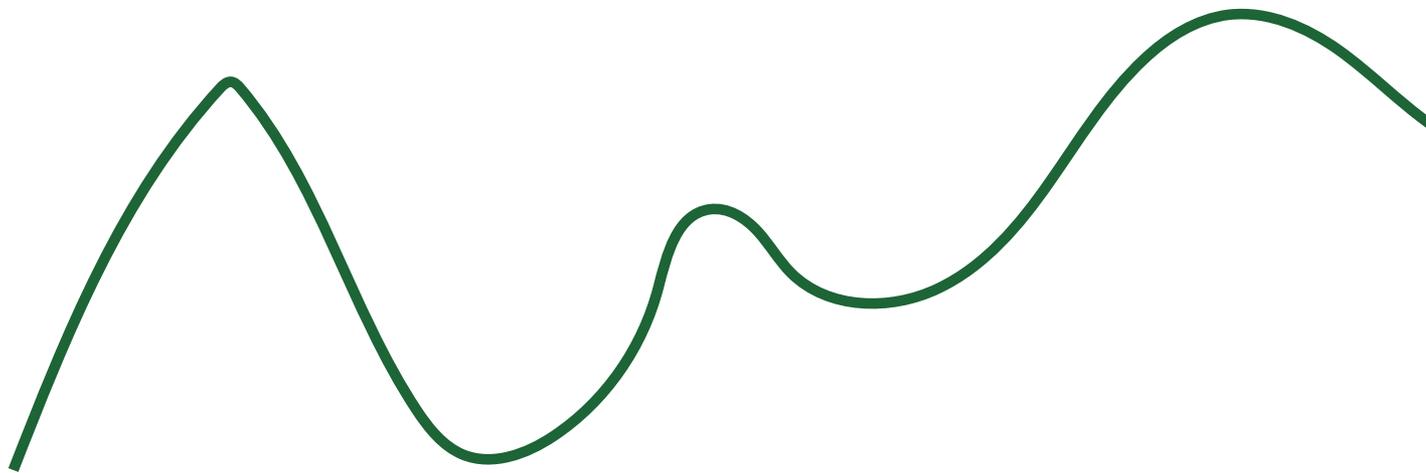


# WRF's Vertical Coordinate

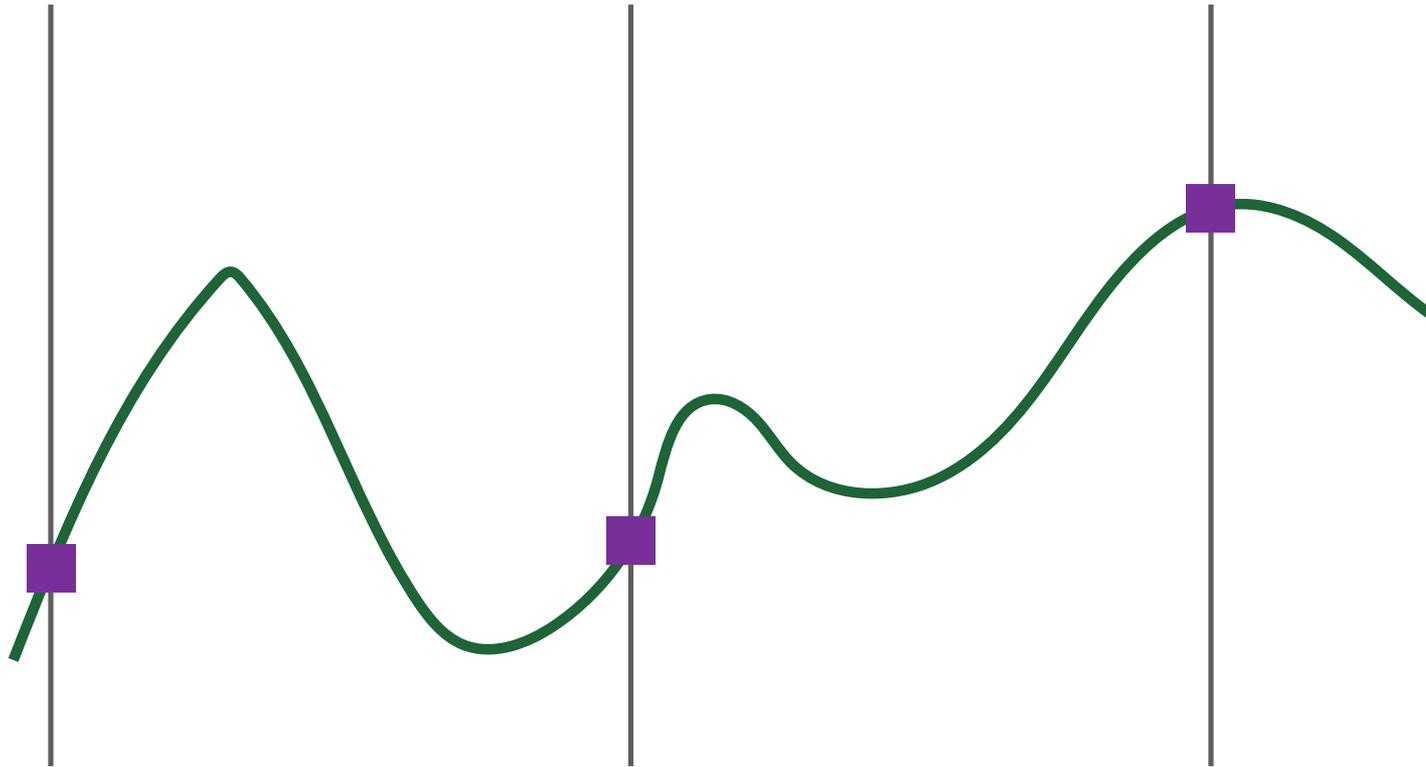
- Terrain-following and pressure-based.
- Grid skewness over steep slopes results in numerical errors and can cause model failure.
- Skewness only becomes an issue when terrain slopes are  $>25\%$ , which only happens while approaching the micro-scale.



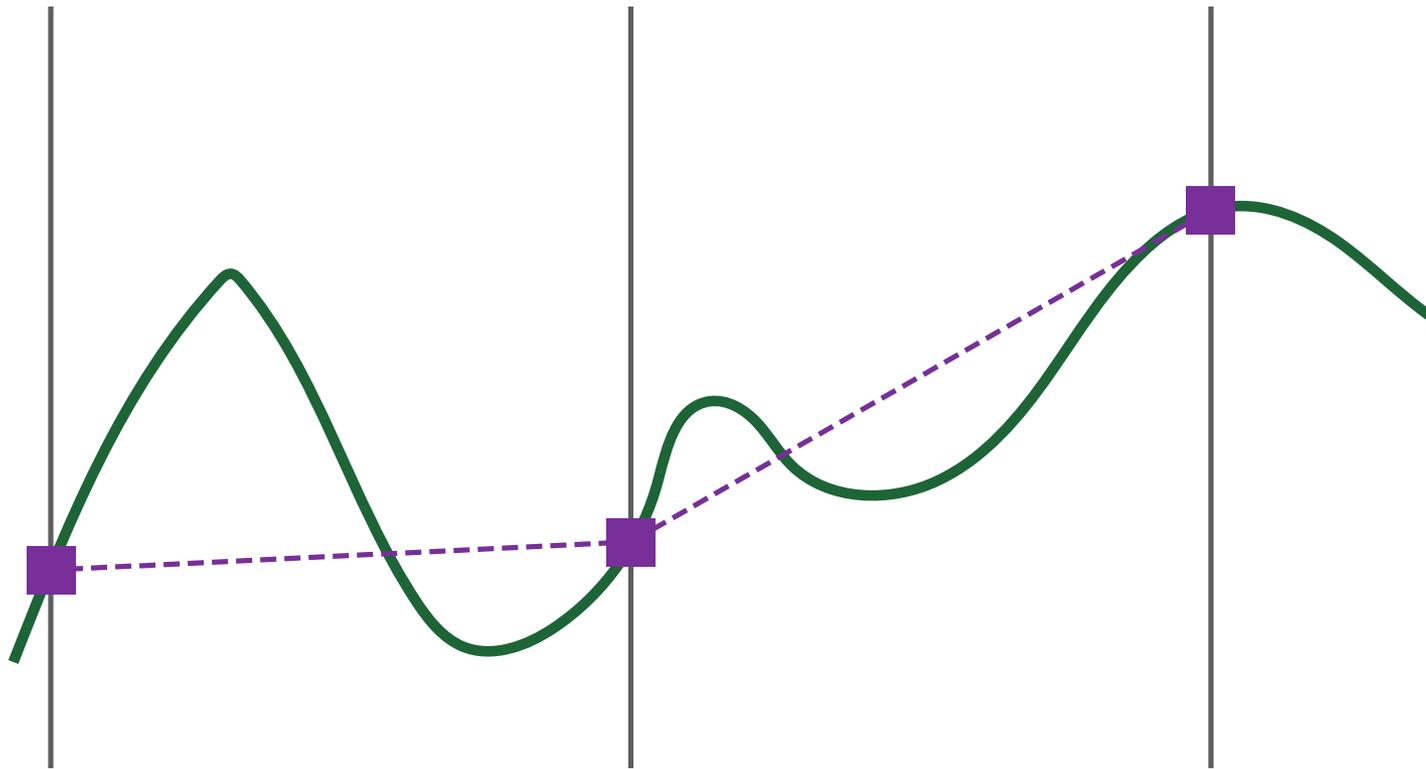
# Resolved Slope & Grid Resolution

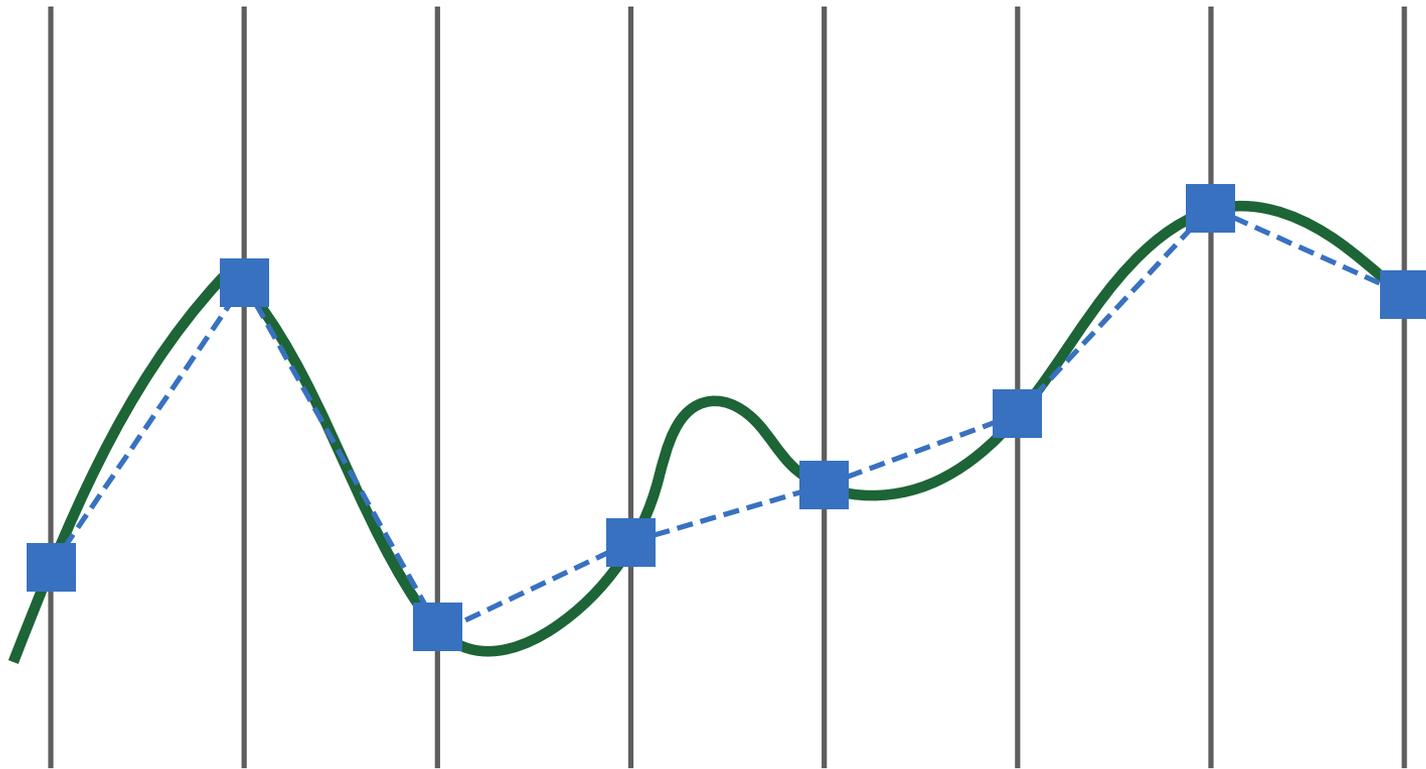


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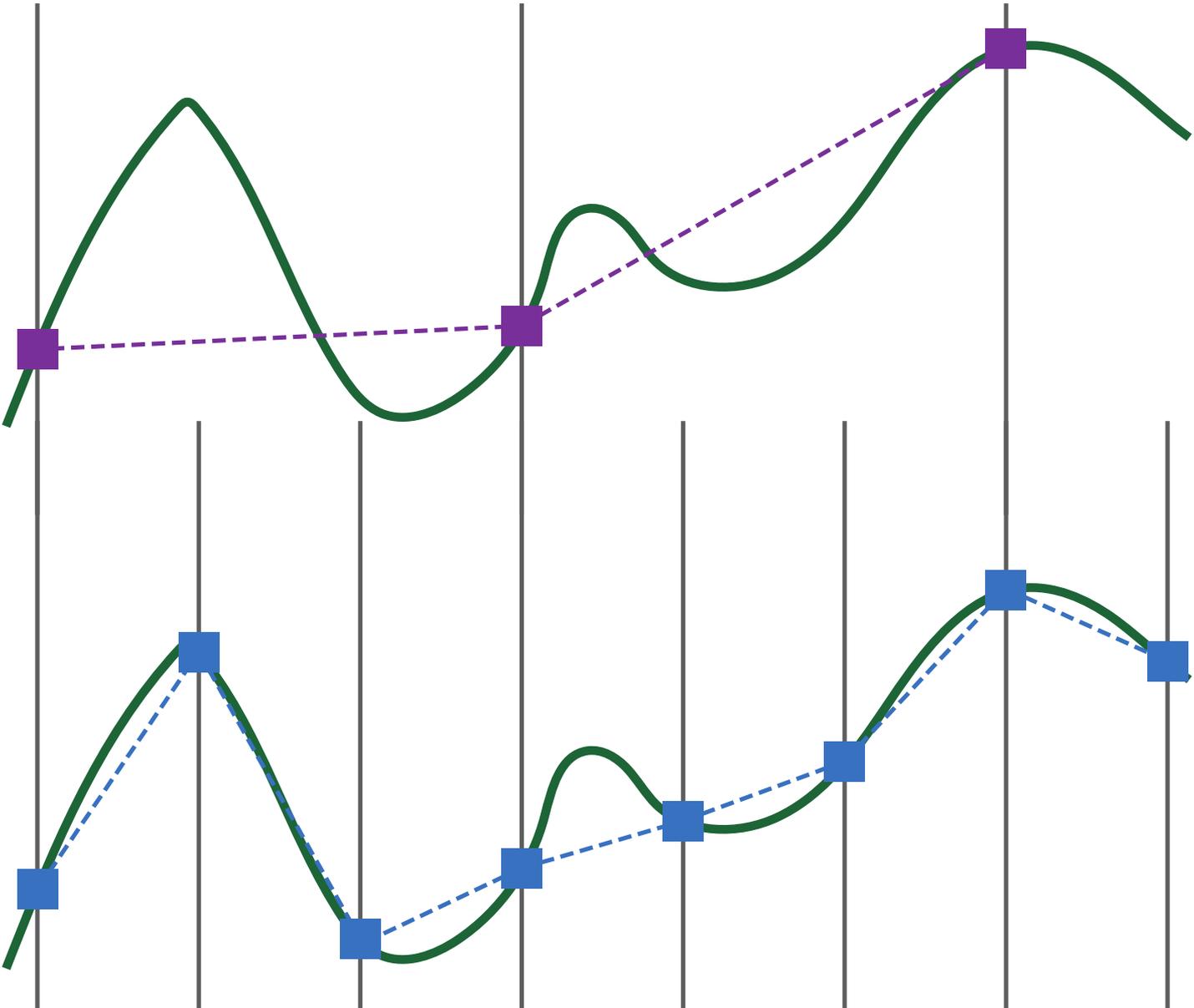


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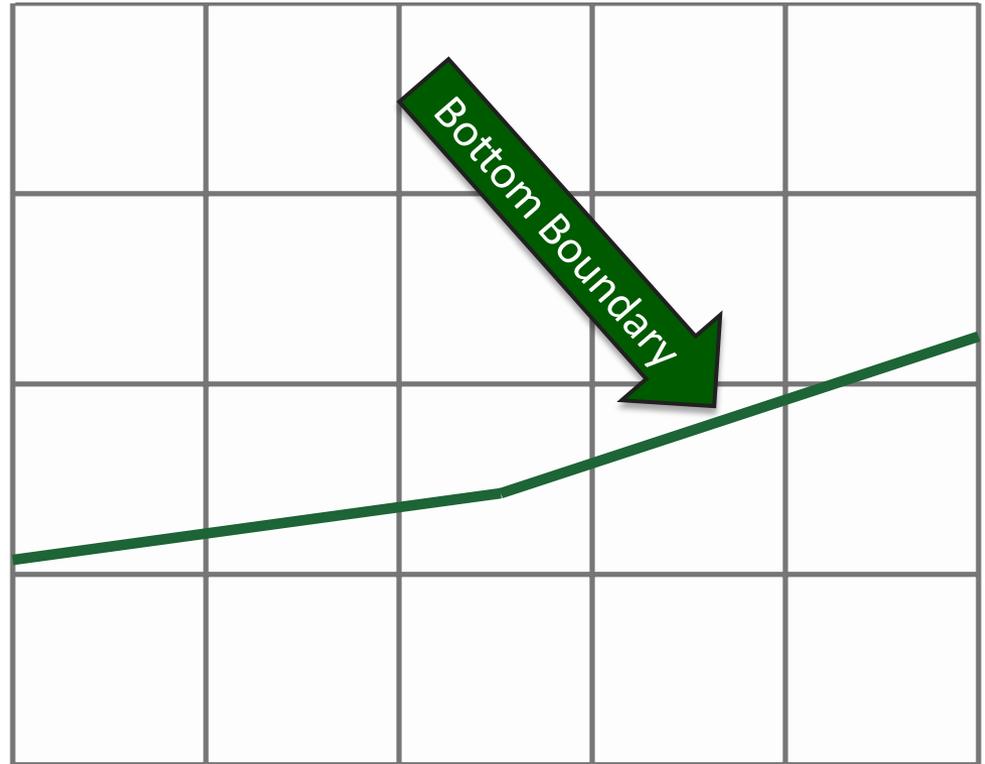




# Resolved Slope & Grid Resolution

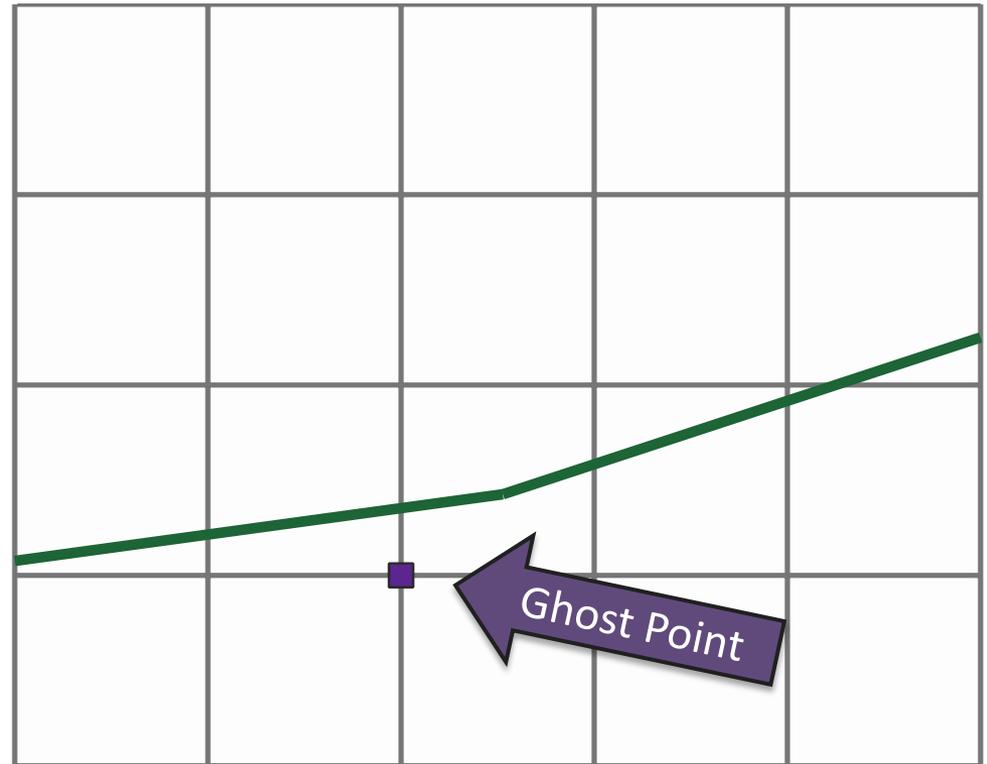


# The Immersed Boundary Method



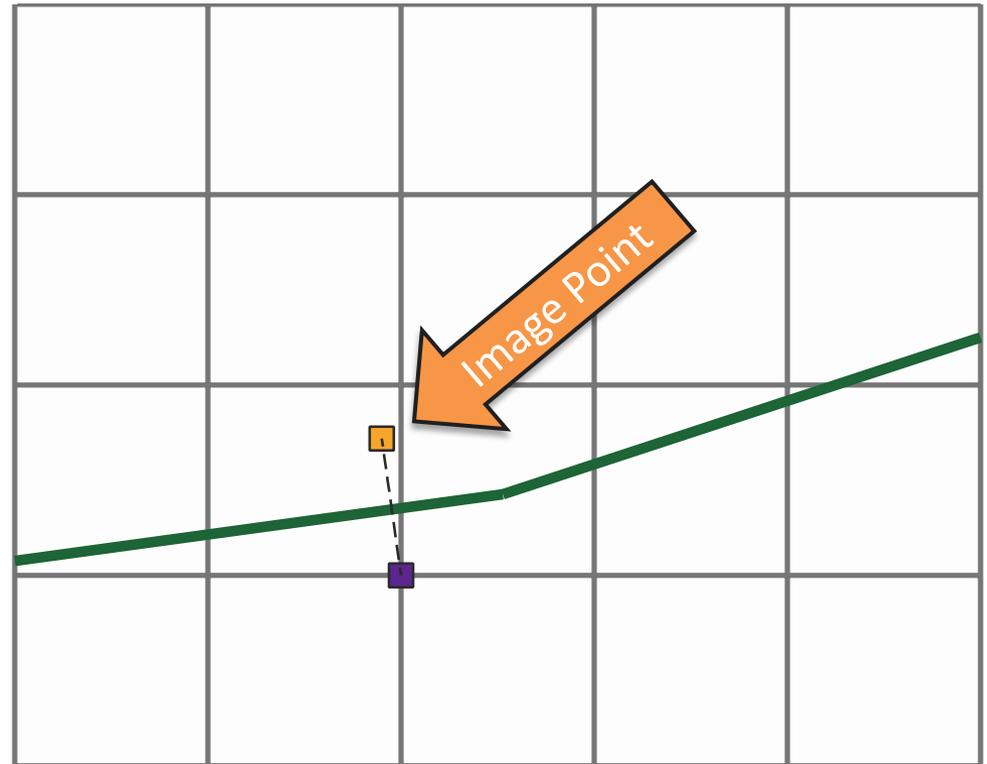
# The Immersed Boundary Method

- To set the value of a ghost point,



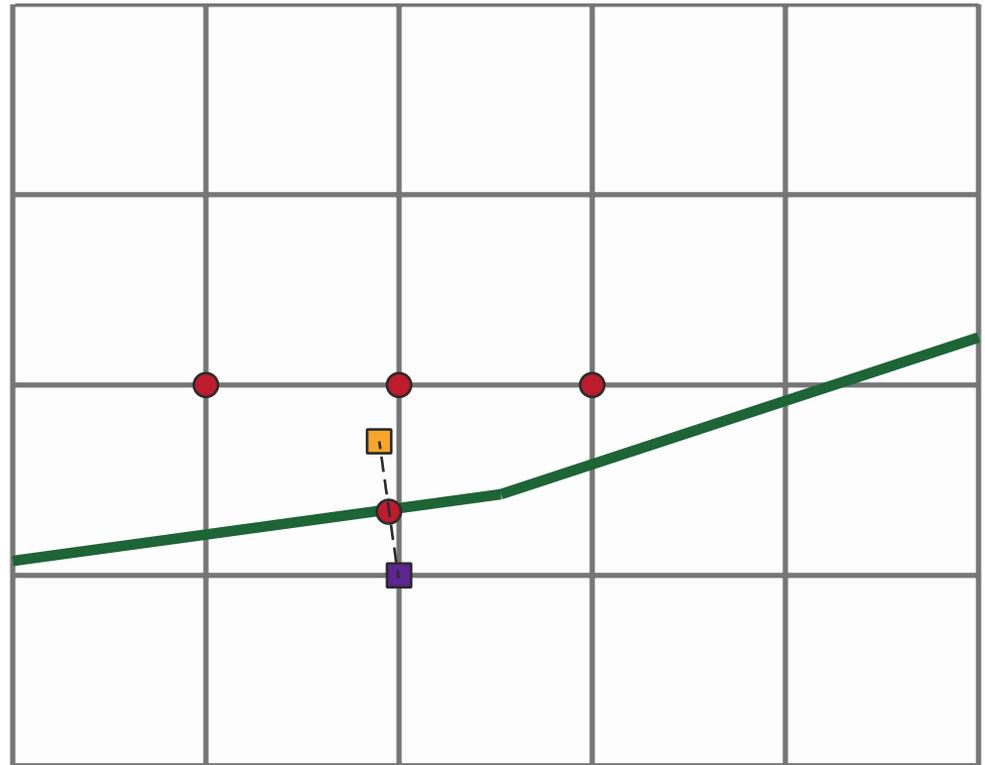
# The Immersed Boundary Method

- To set the value of a ghost point,
- Locate the image point by reflecting the ghost point across the interface



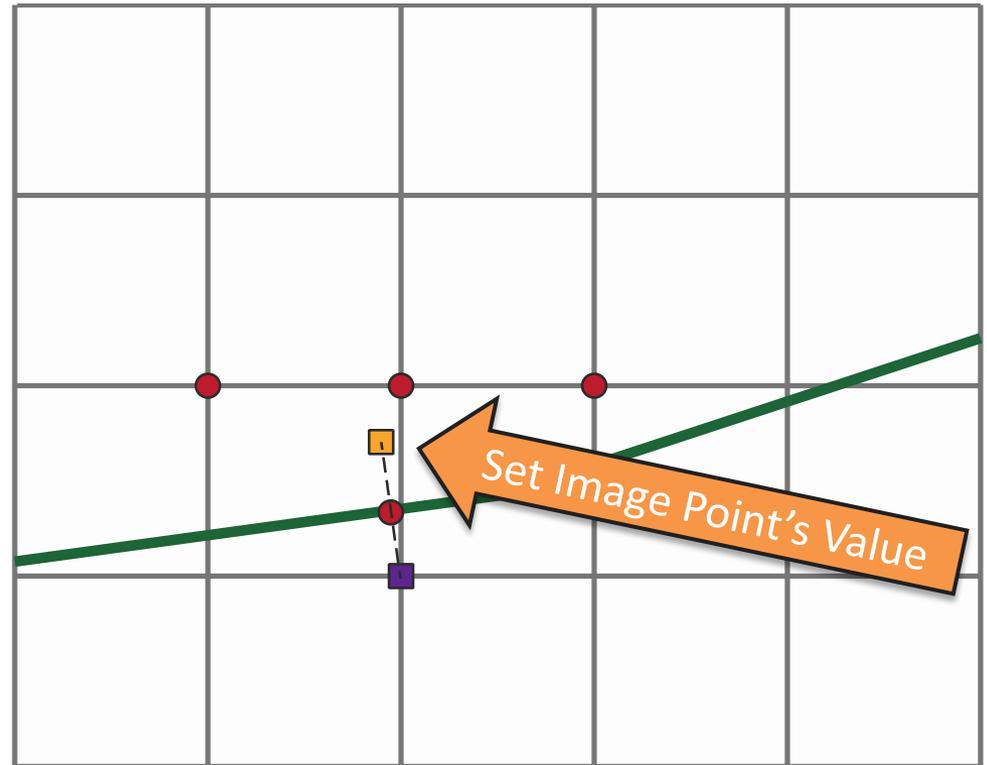
# The Immersed Boundary Method

- To set the value of a ghost point,
- Locate the image point by reflecting the ghost point across the interface
- Determine the nearest computational nodes to the image point



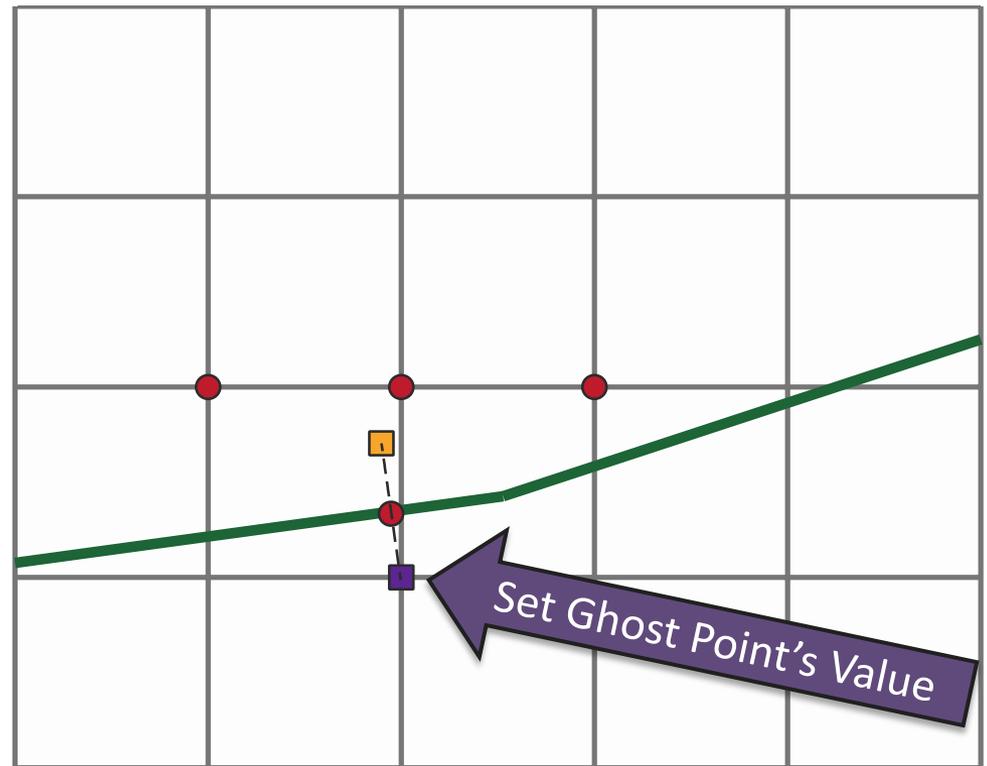
# The Immersed Boundary Method

- To set the value of a ghost point,
- Locate the image point by reflecting the ghost point across the interface
- Determine the nearest computational nodes to the image point
- Set the image point's value by interpolation



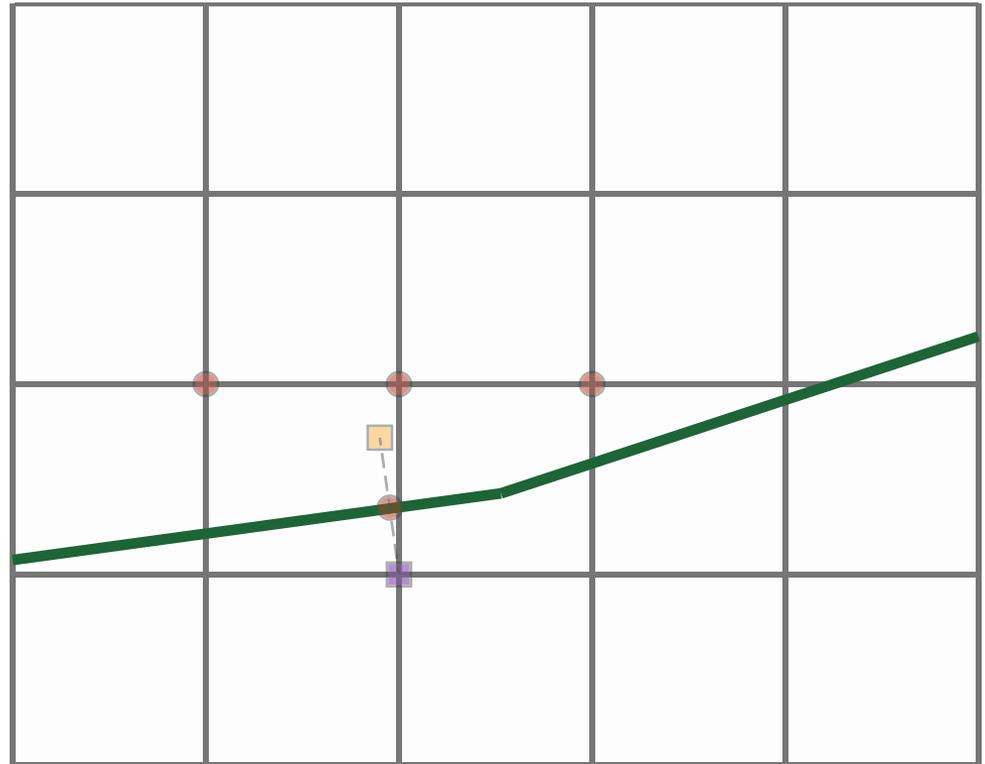
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- To set the value of a ghost point,
- Locate the image point by reflecting the ghost point across the interface
- Determine the nearest computational nodes to the image point
- Set the image point's value by interpolation
- Using image point's value, determine forcing at ghost point to maintain the desired boundary condition



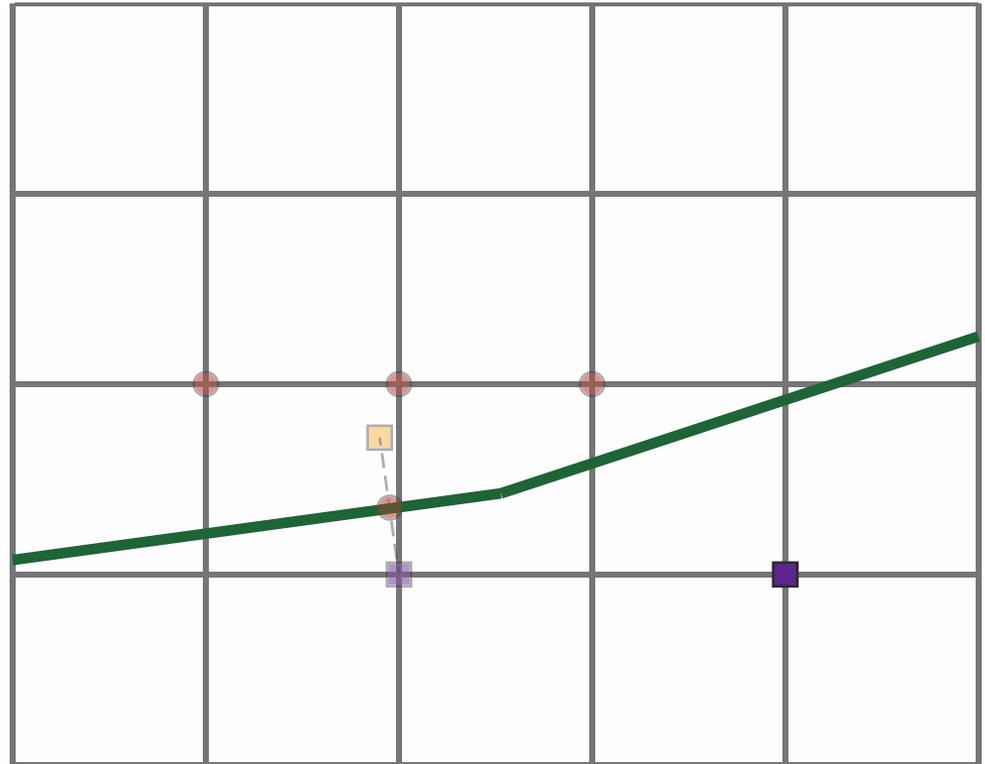
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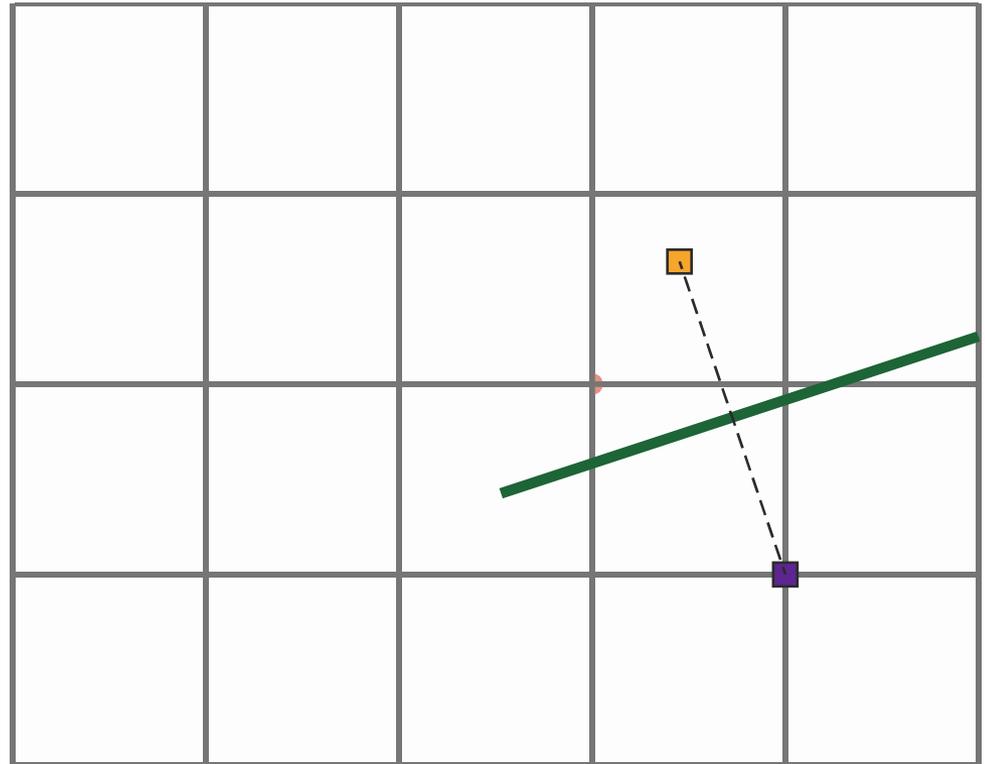
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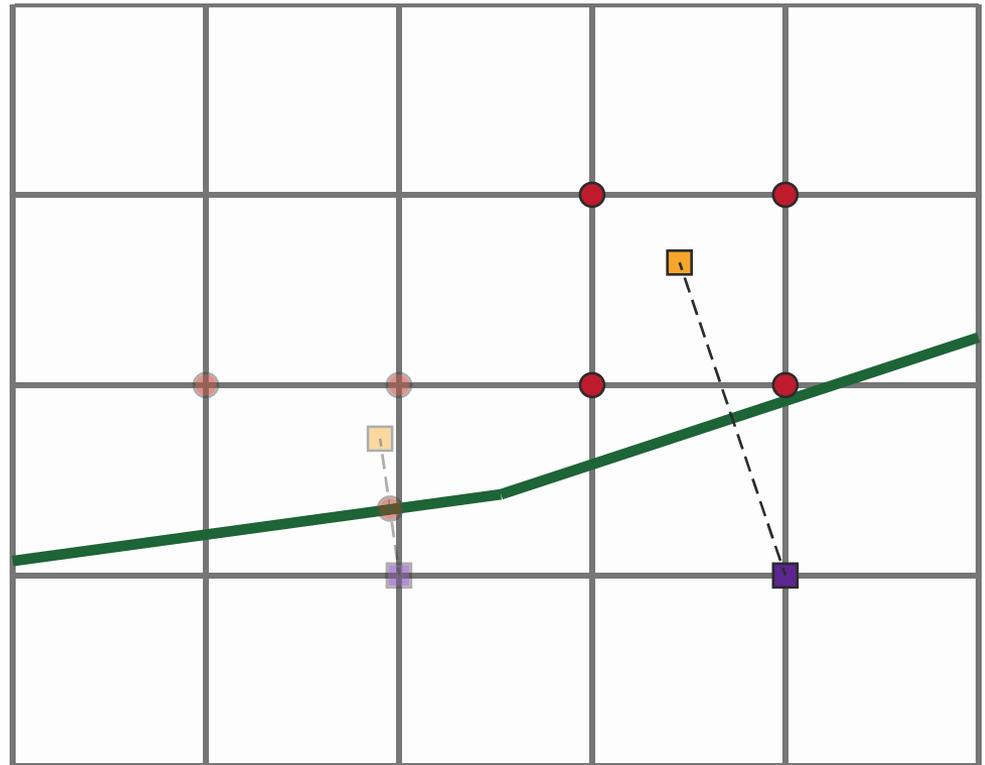
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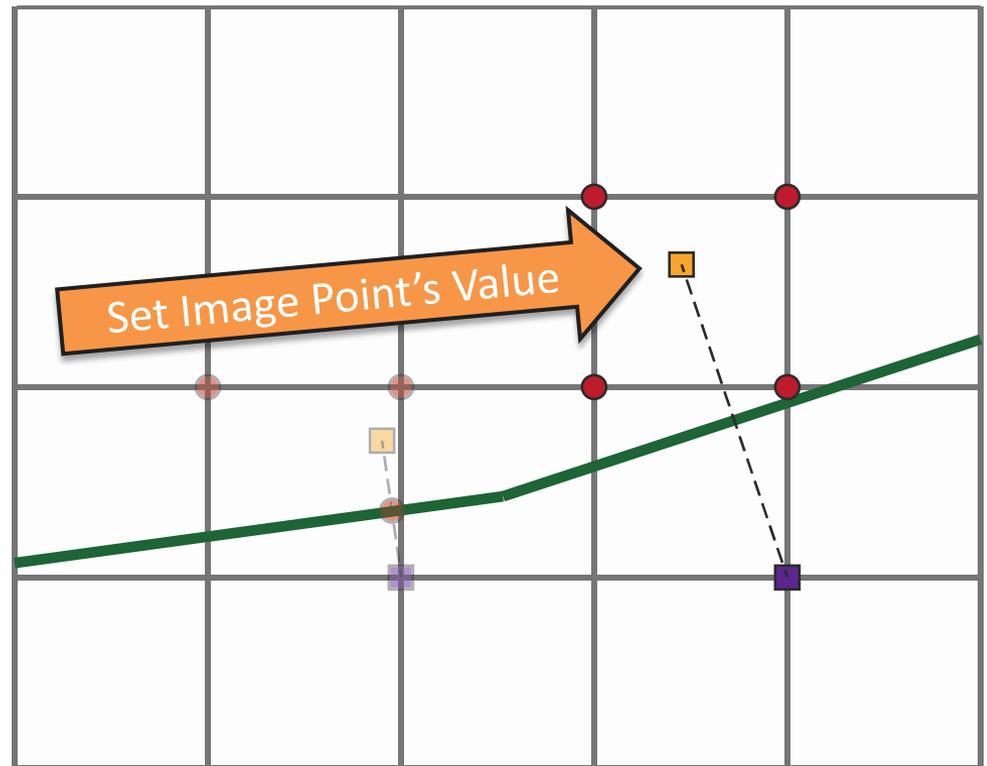
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- To set the value of a ghost point,
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- **Determine the nearest computational nodes to the image point**
- Set the image point's value by interpolation
- Using image point's value, determine forcing at ghost point to maintain the desired boundary condition



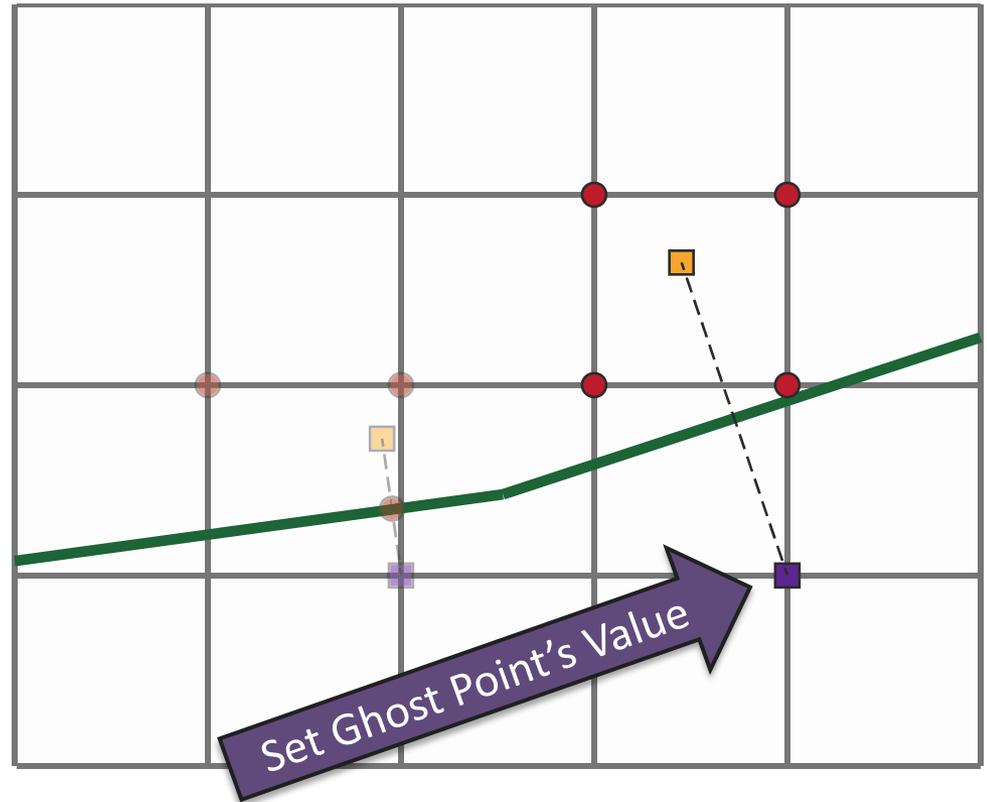
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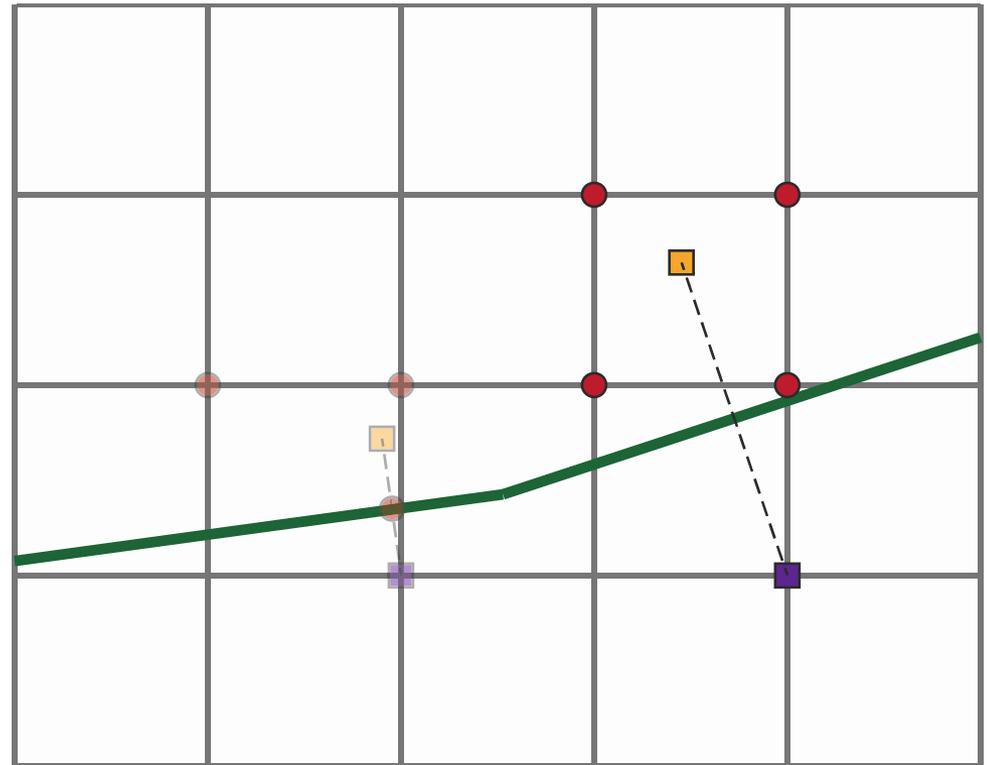
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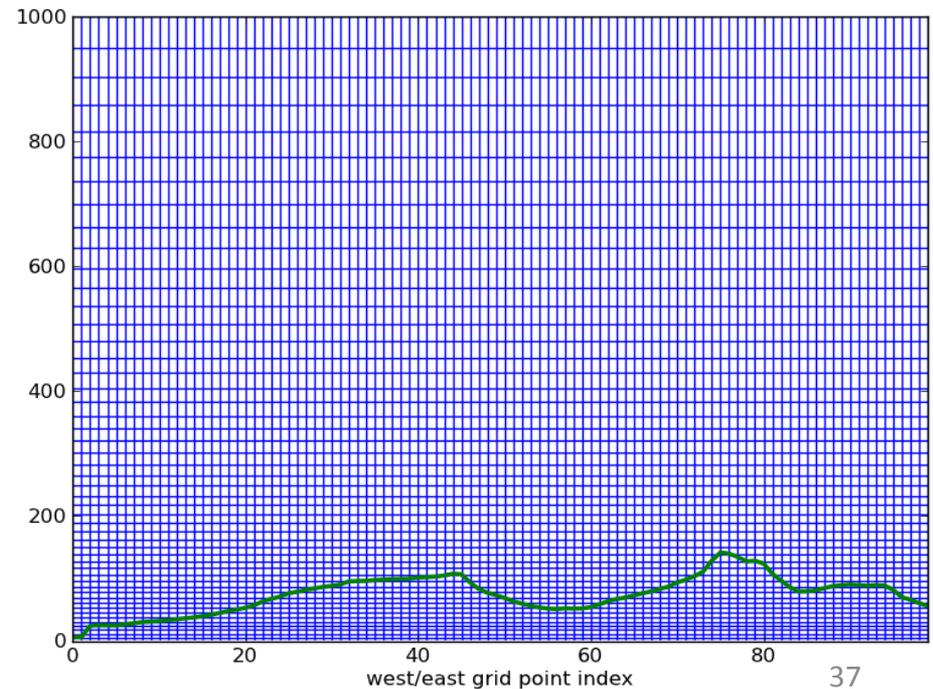
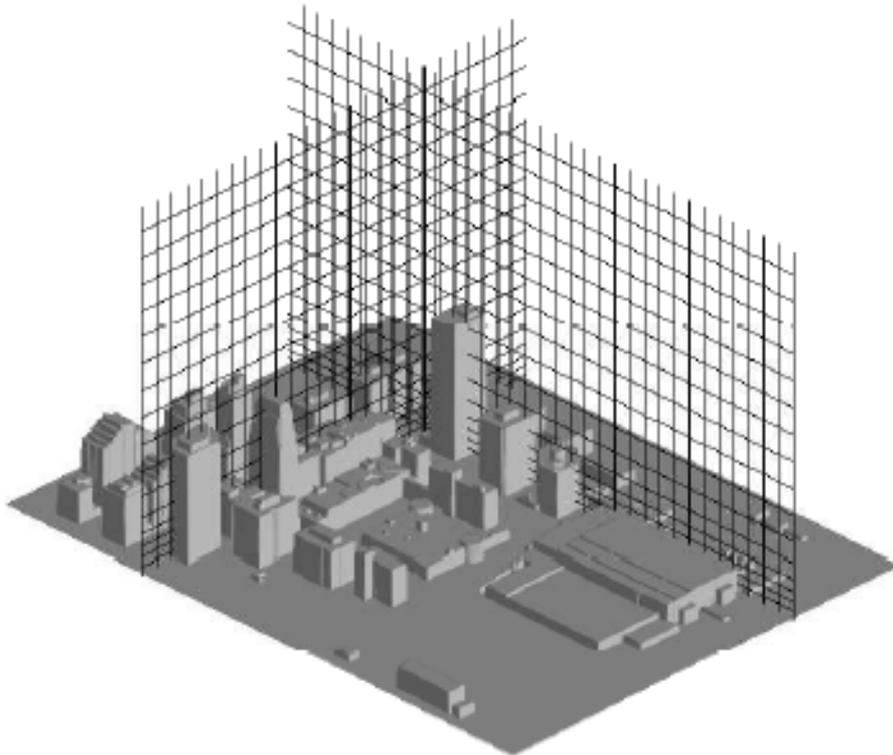
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# WRF-IBM's Vertical Coordinate

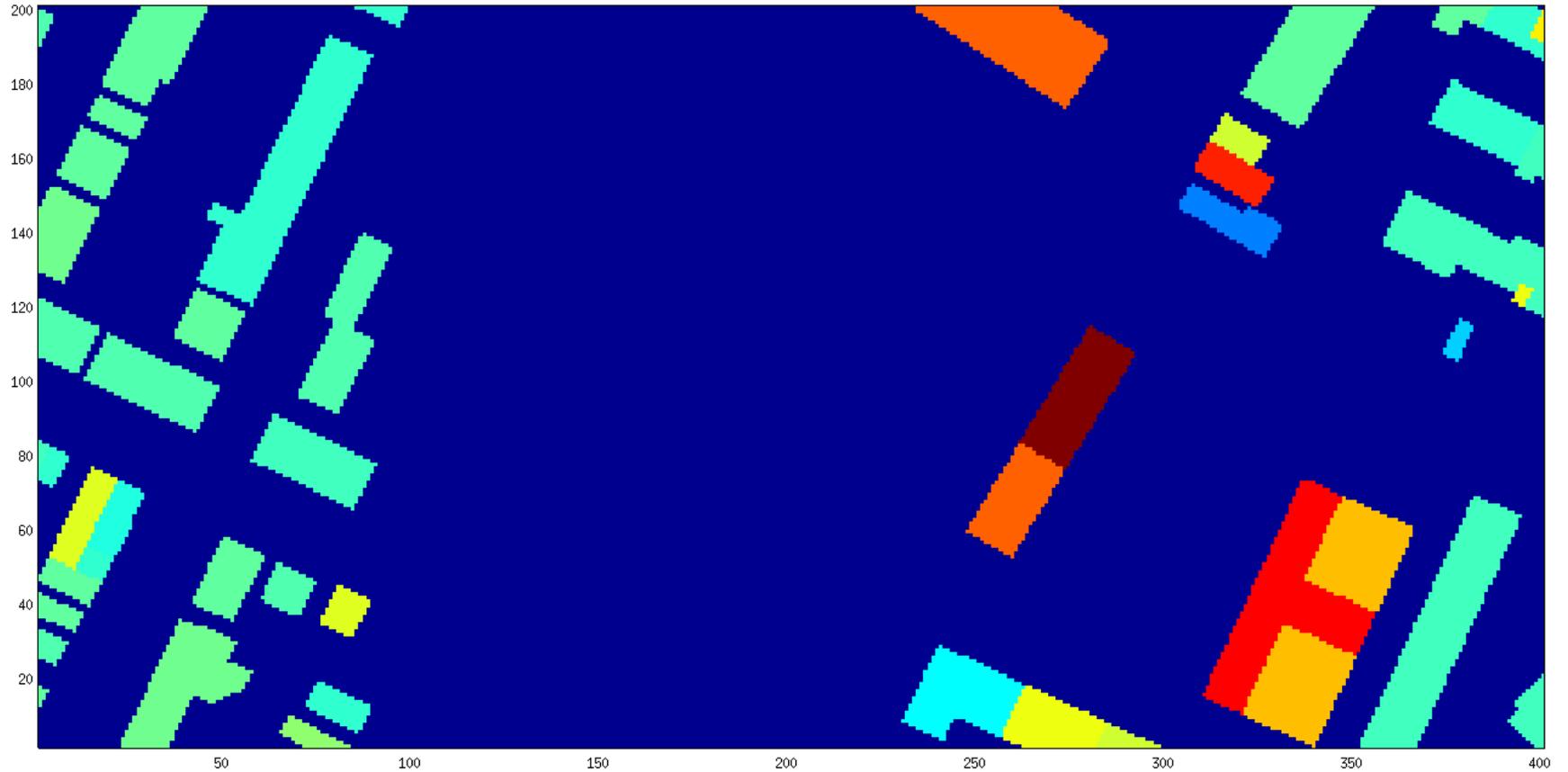
- Pressure-based but not terrain-following.
- No grid skewness due to terrain slopes.



# WRF-IBM Setup

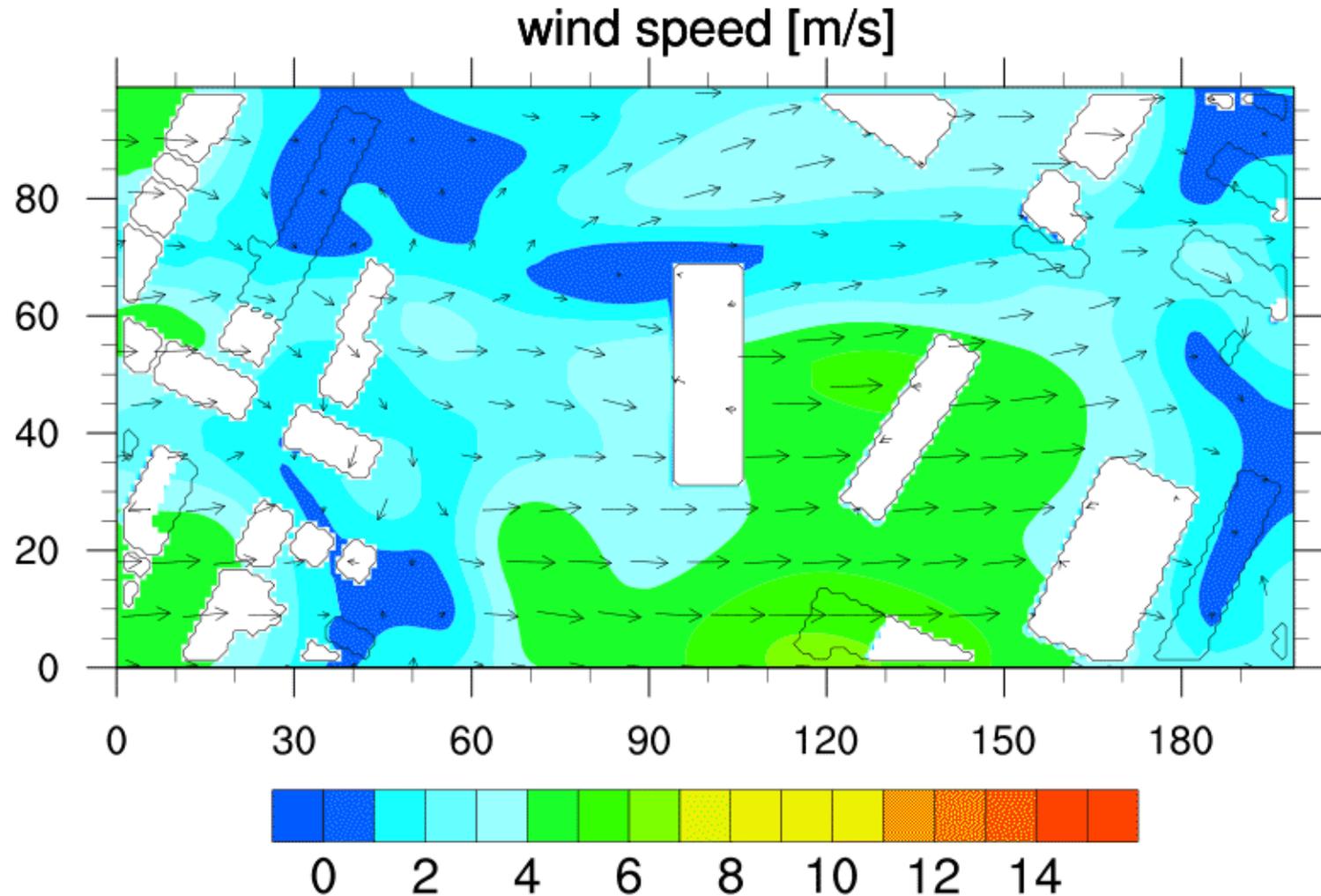
- Inverse Distance Weighting interpolation scheme
- Smagorinsky turbulence closure
- No-slip bottom boundary
- Two nested domains with the parent being flat and the nested domain containing buildings
- Periodic lateral boundary conditions on the parent domain
- Rigid, no-flux, top boundary
- Initialized with an idealized sounding
- Line source of emissions with zero initial concentration everywhere

# Picking the Grid Resolution



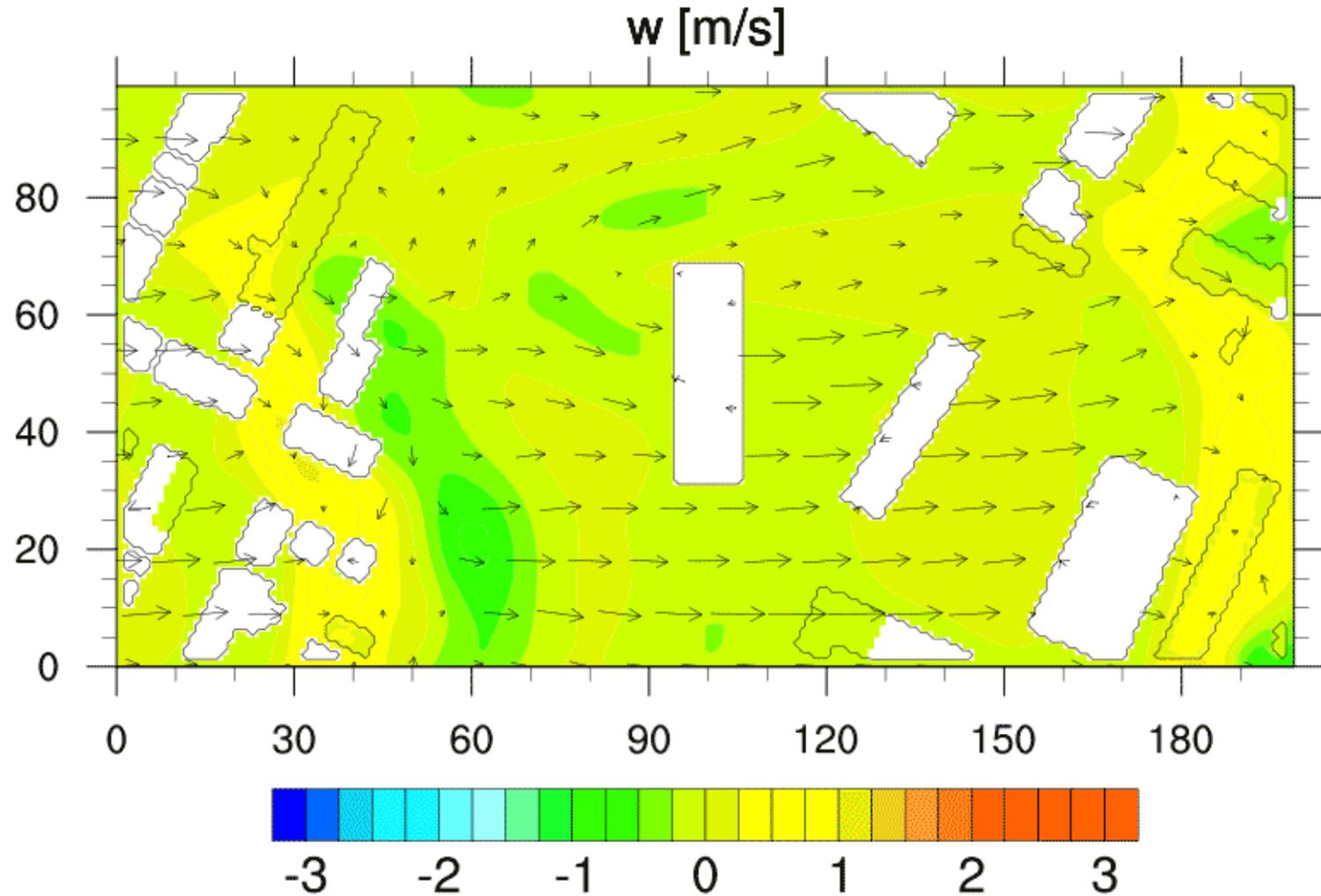
# Wind Speed at 2m AGL

0001-01-01\_02:00:30



# Vertical Velocity at 2m AGL

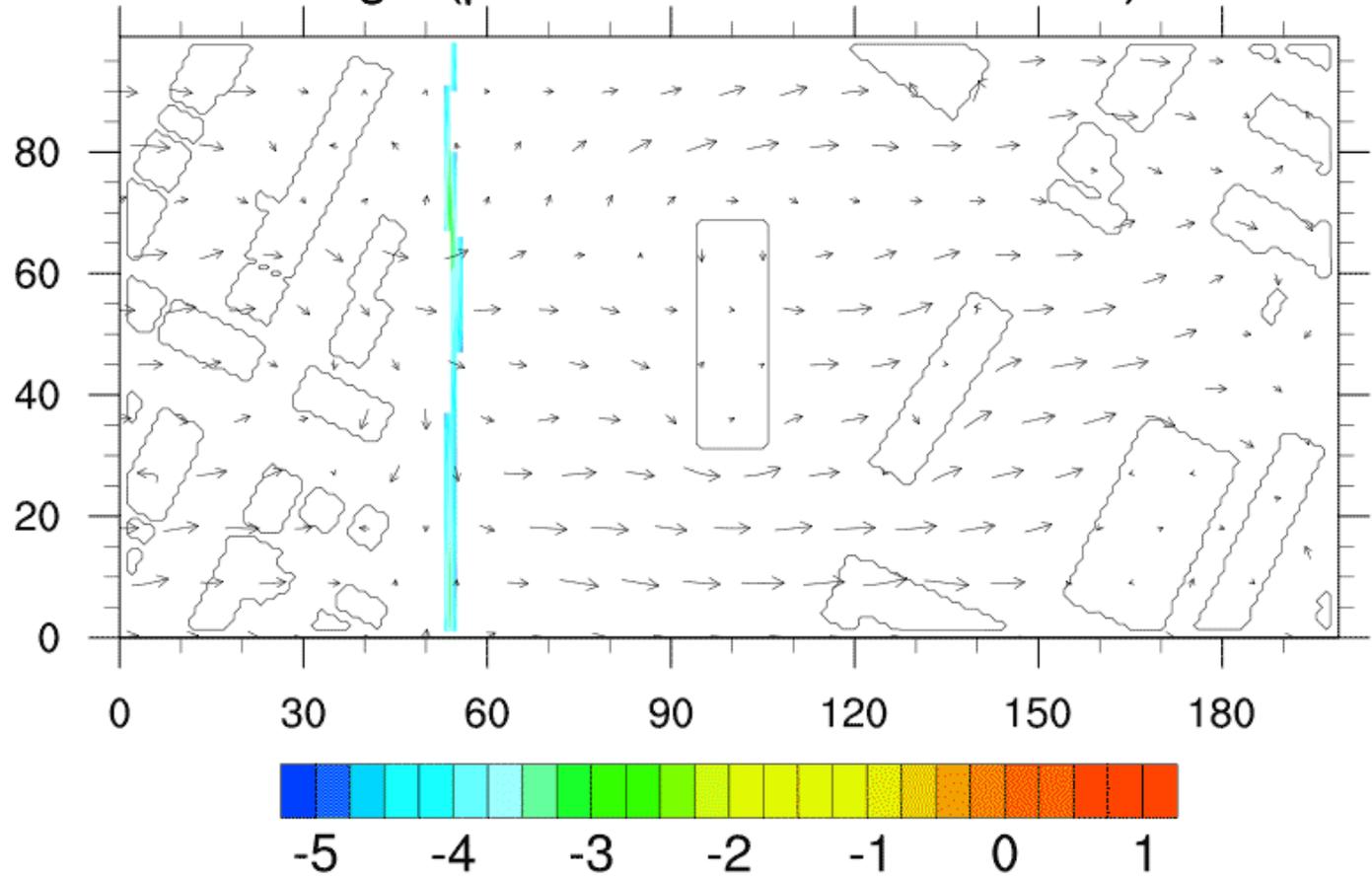
0001-01-01\_02:00:30



# Passive Tracer at 2m AGL

0001-01-01\_02:00:31

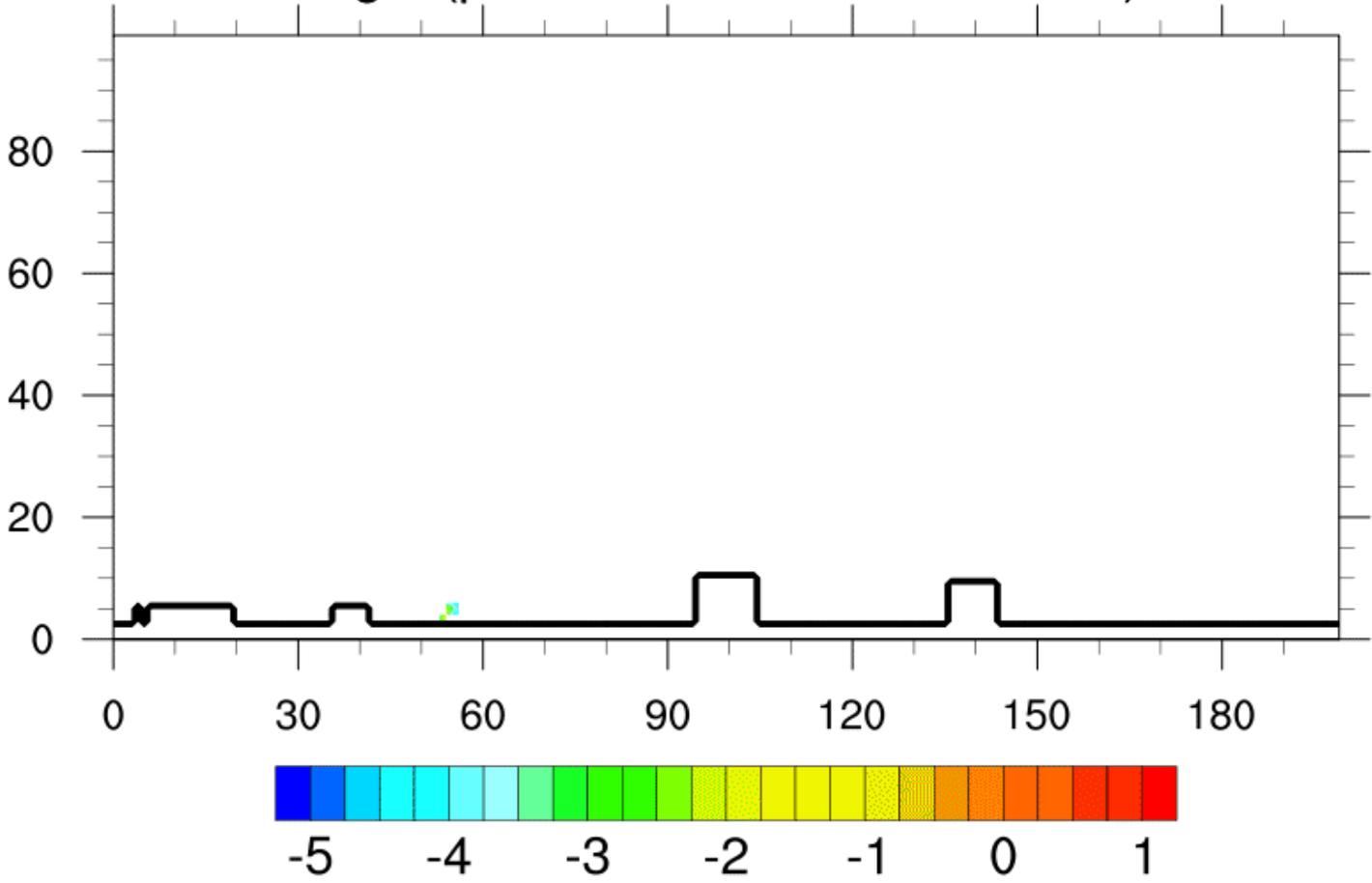
log<sub>10</sub>(passive scalar concentration)



# East-West Slice of Passive Tracer

0001-01-01\_02:00:31

log10(passive scalar concentration)

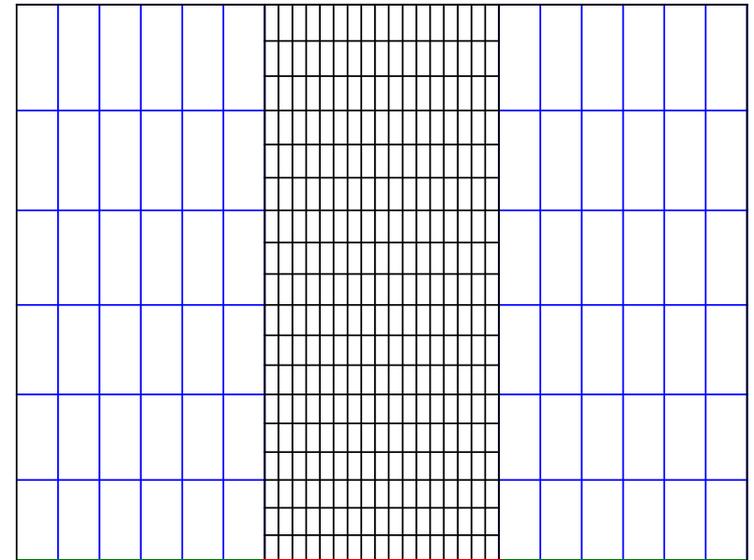
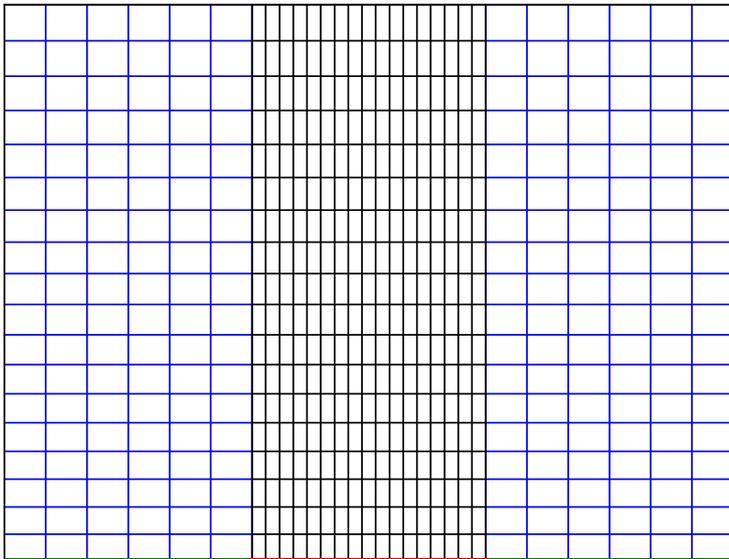


# Vertical Grid Nesting in WRF

- WRF requires all concurrently nested domains to use the same number and placement of vertical grid levels.
- Vertical grid nesting...
  - allows for additional vertical levels in a nested domain.
  - prevents an excessive number of vertical levels on the parent domain.
  - provides control over the grid aspect ratio of each domain
    - Vital if nesting in a LES model.

# Existing Vertical Grid Nesting in WRF

- Concurrent simulation
  - All domains must have identical vertical levels
- Sequentially run simulations with “ndown” <sup>(1)</sup>
  - Nest boundary conditions update at the frequency of parent grid history
- Uses integer refinement of parent vertical levels



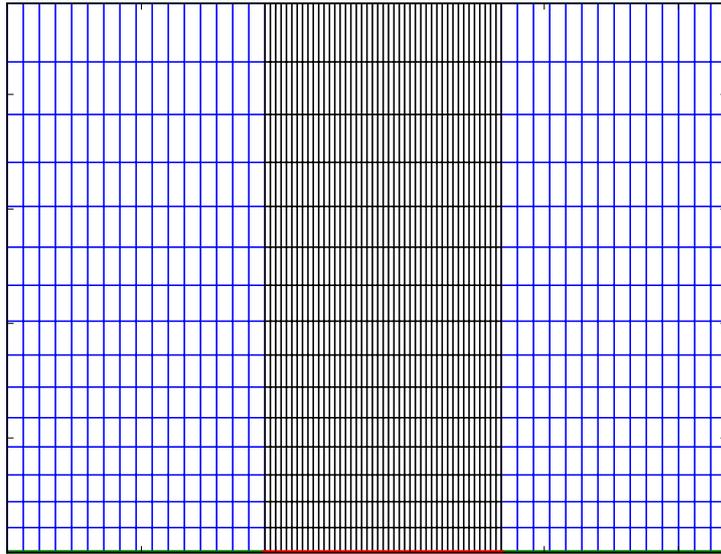
# Concurrent Vertical Grid Nesting

- Utilizes the interpolation scheme from ndown
  - Cubic Hermite interpolation
    - Matches value at known points and first derivative
  - Can use an arbitrary number of vertical levels for nested domain compared to parent domain
- Included in the public release of WRFv3.6.1
  - Still in development and currently undocumented
- Enabled by one new variable in namelist.input

# Validation of Vertical Grid Nesting

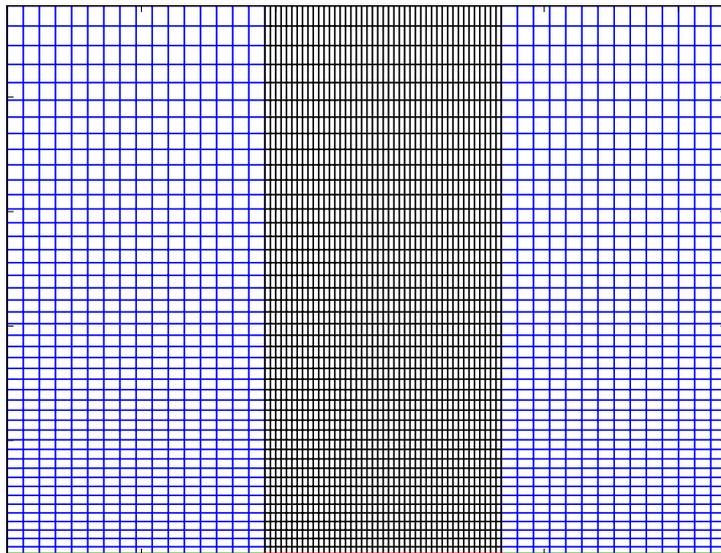
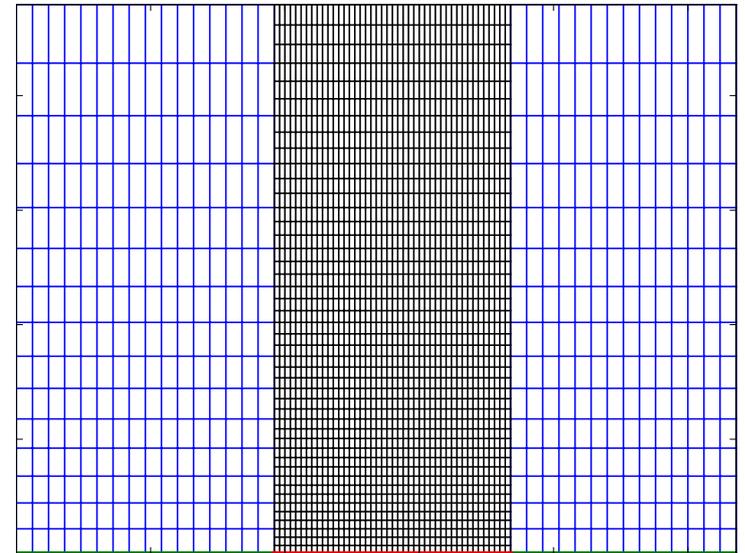
- Flat plate
- Periodic lateral boundary conditions
- No atmospheric physics
- Initialized with idealized sounding
  - 10 m s<sup>-1</sup> wind speed at all heights
  - Dry and neutral temperature profile
- Forced by maintaining initial conditions in top 3000 meters of domain

# With & Without Vertical Grid Nesting



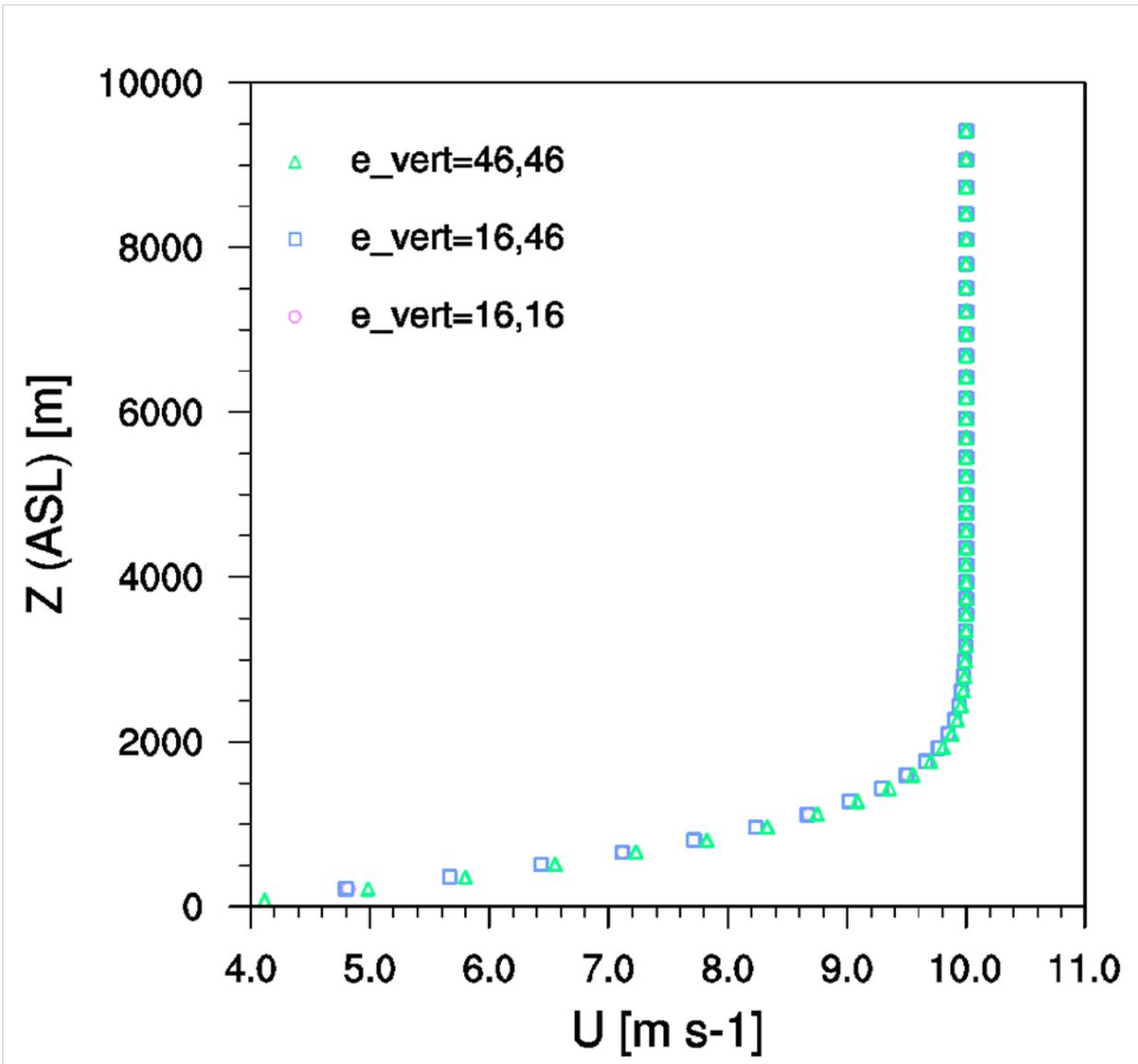
← 16 to 16

16 to 46



← 46 to 46

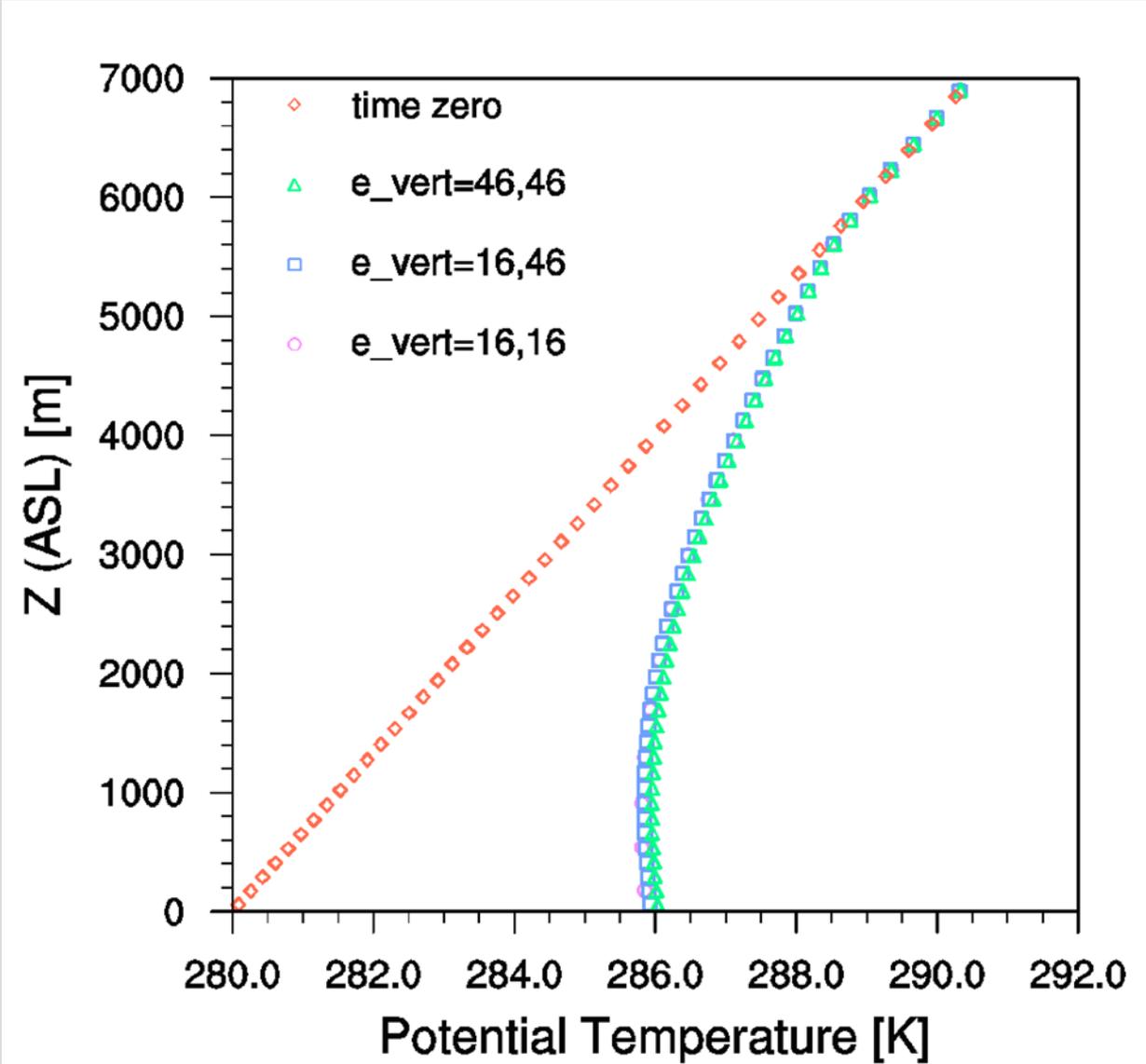
# Flow Over A Flat Plate



# Vertical Nesting with Atmospheric Physics

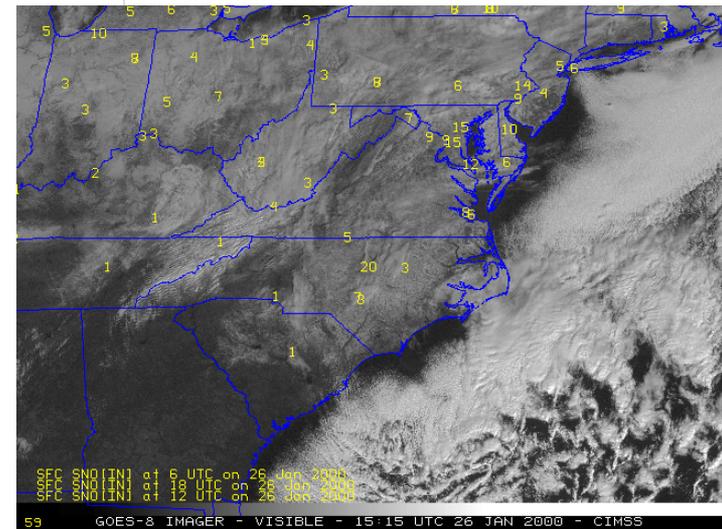
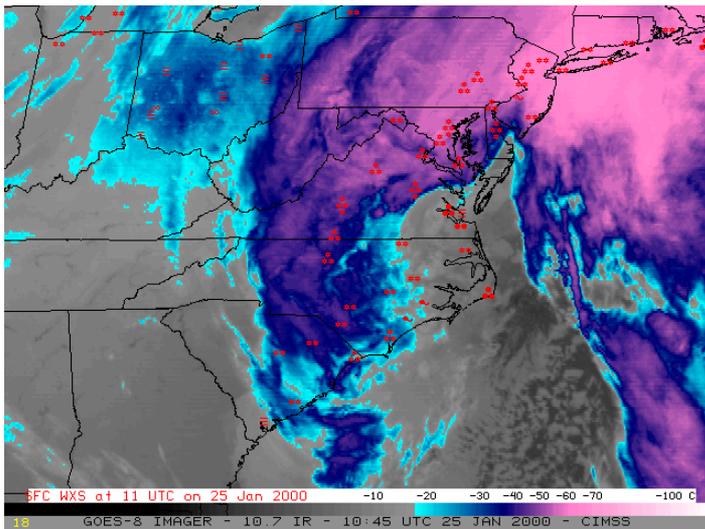
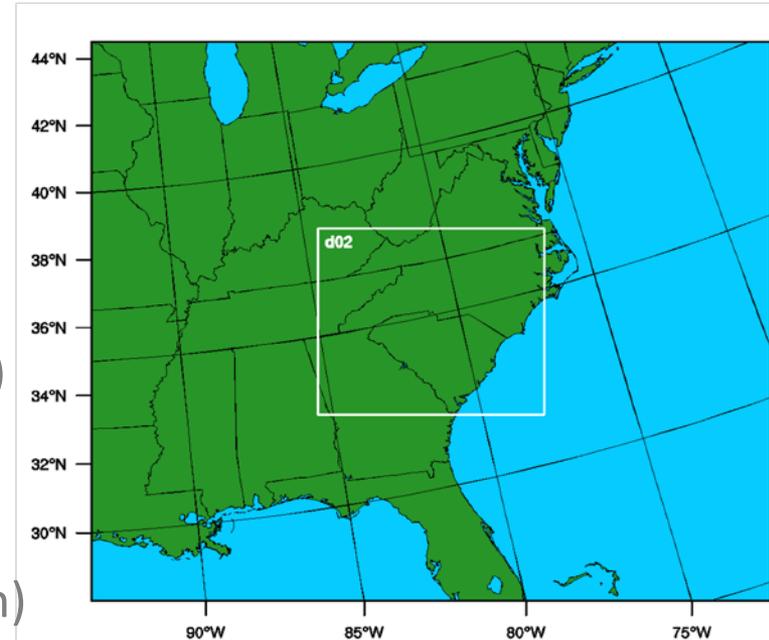
- Flat plate with uniform land surface and soil properties
- Initialized with a stable, dry, quiescent idealized sounding
- Periodic lateral boundary conditions
- Parameterizations and sub-models:
  - Longwave radiation (RRTM)
  - Shortwave radiation (Dudhia)
  - Land surface model (Noah)
  - Surface layer (Monin-Obukhov)
- Difficulties with radiation schemes
  - We are currently evaluating which schemes are working properly with our modifications and enabling the use of several popular schemes with vertical nesting

# Heating of a Flat Plate



# WRF Meso-Scale Test Case

- Parameterizations and sub-models:
  - Microphysics (WSM 3-class)
  - Longwave radiation (RRTM)
  - Shortwave radiation (Dudhia)
  - Land surface model (Thermal diffusion)
  - Surface layer (Monin-Obukhov)
  - Planetary Boundary Layer (YSU)
  - Cumulus Parameterization (Kain-Fritsch)

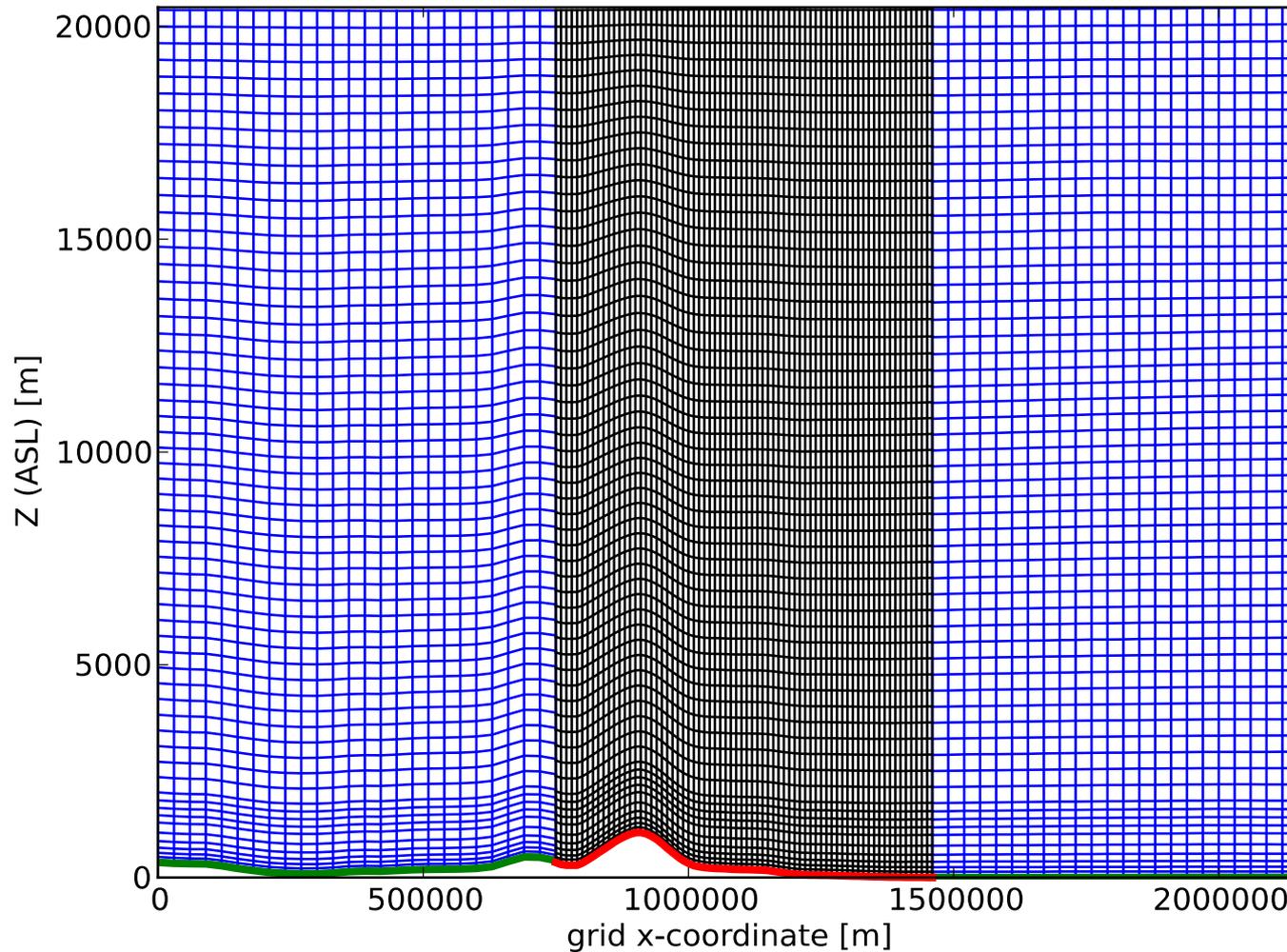


# Without Vertical Grid Nesting

Vertical Levels

Parent: 60

Nest: 60

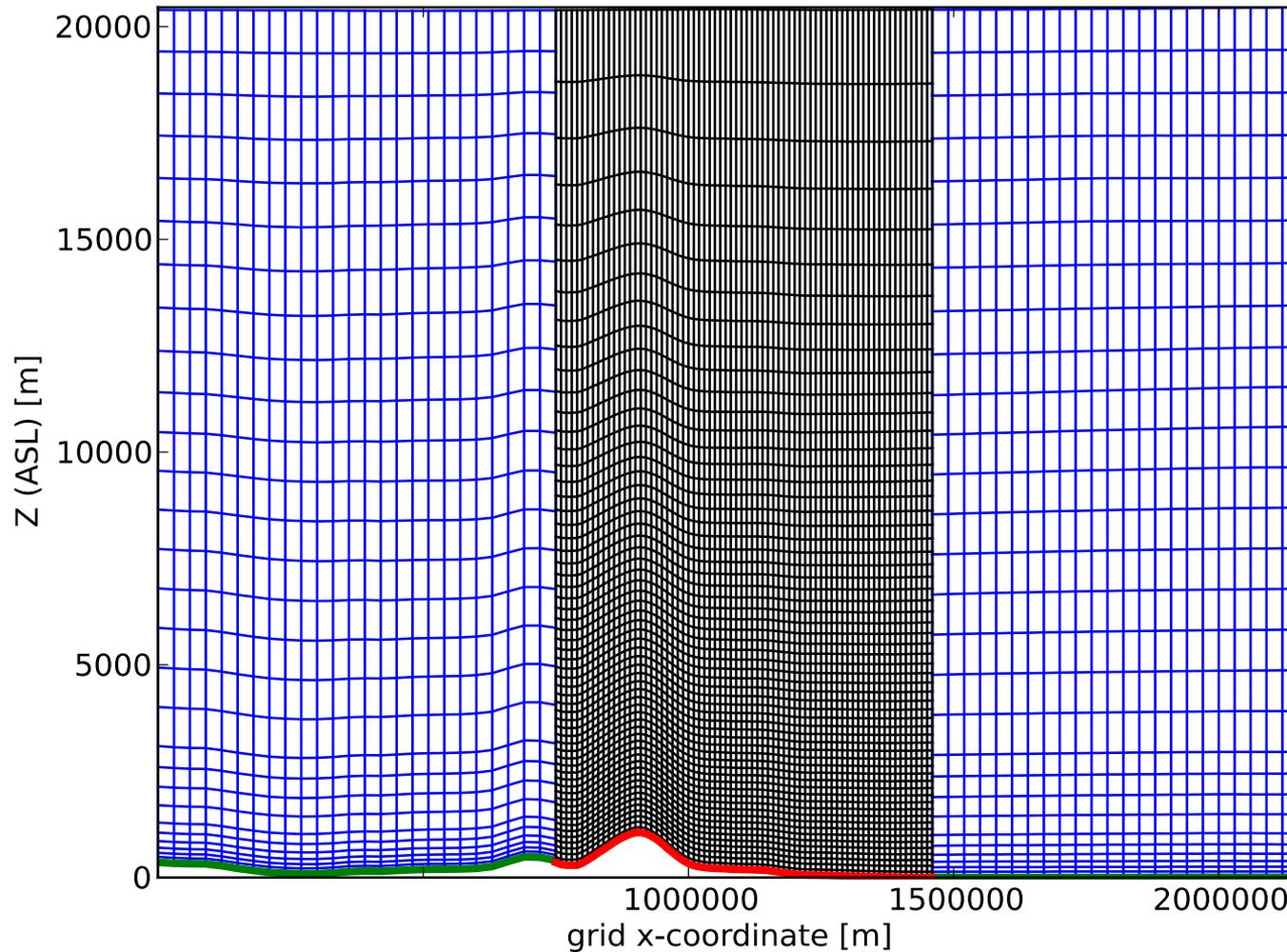


# With Vertical Grid Nesting

Vertical Levels

Parent: 30

Nest: 60



# With and Without Vertical Grid Nesting

Vertical Levels

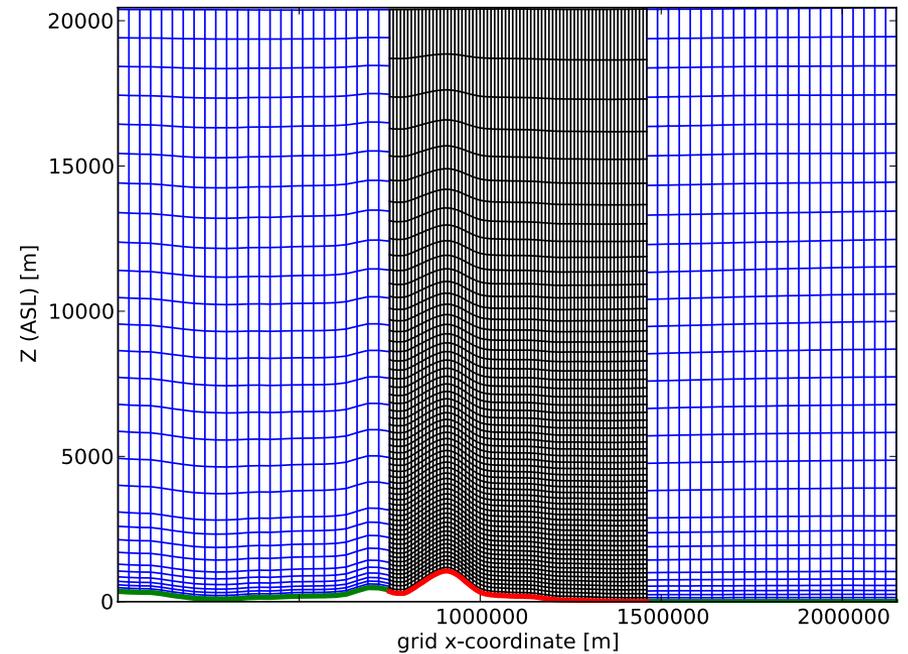
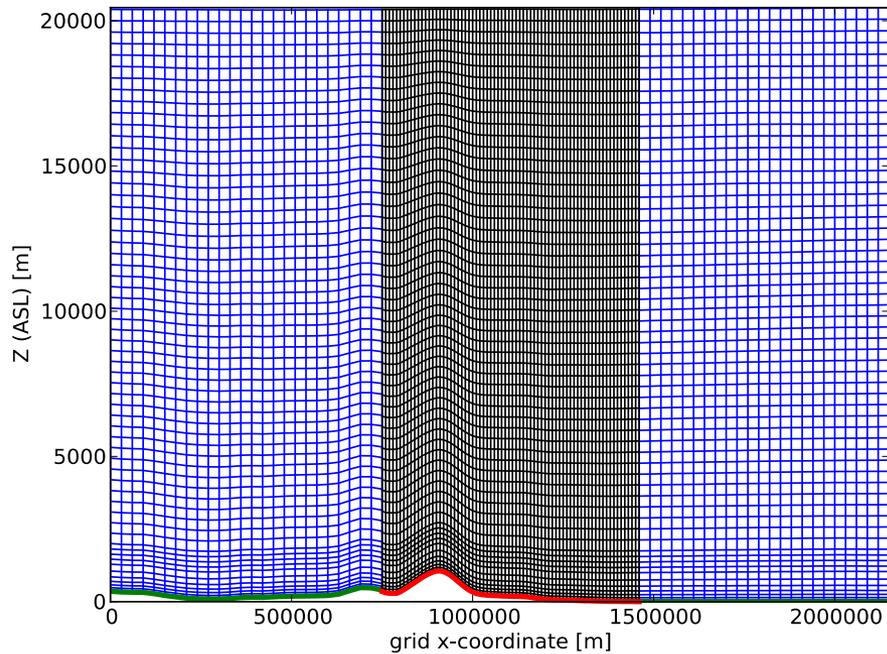
Parent: 60

Nest: 60

Vertical Levels

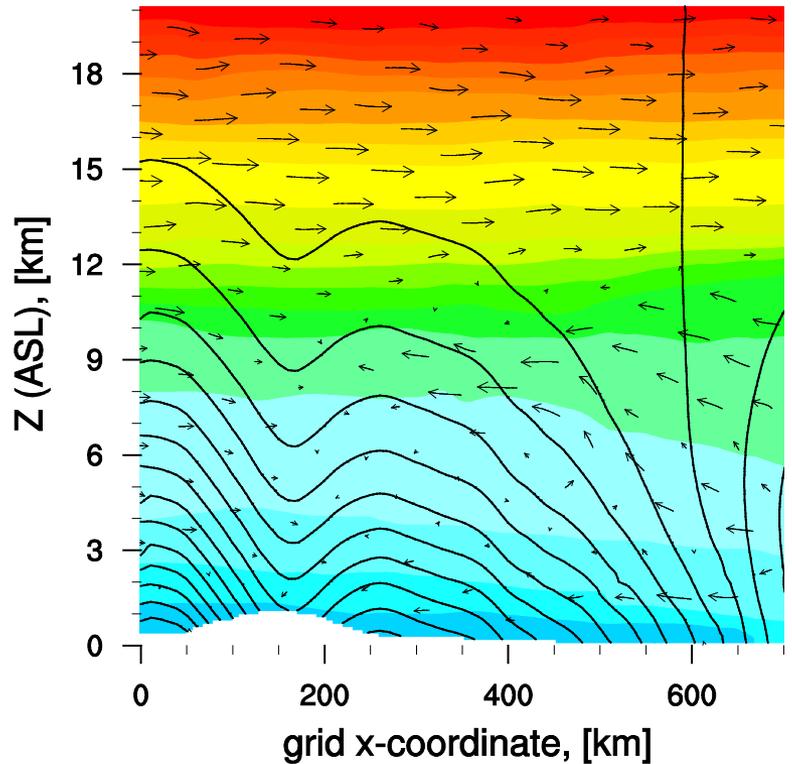
Parent: 30

Nest: 60

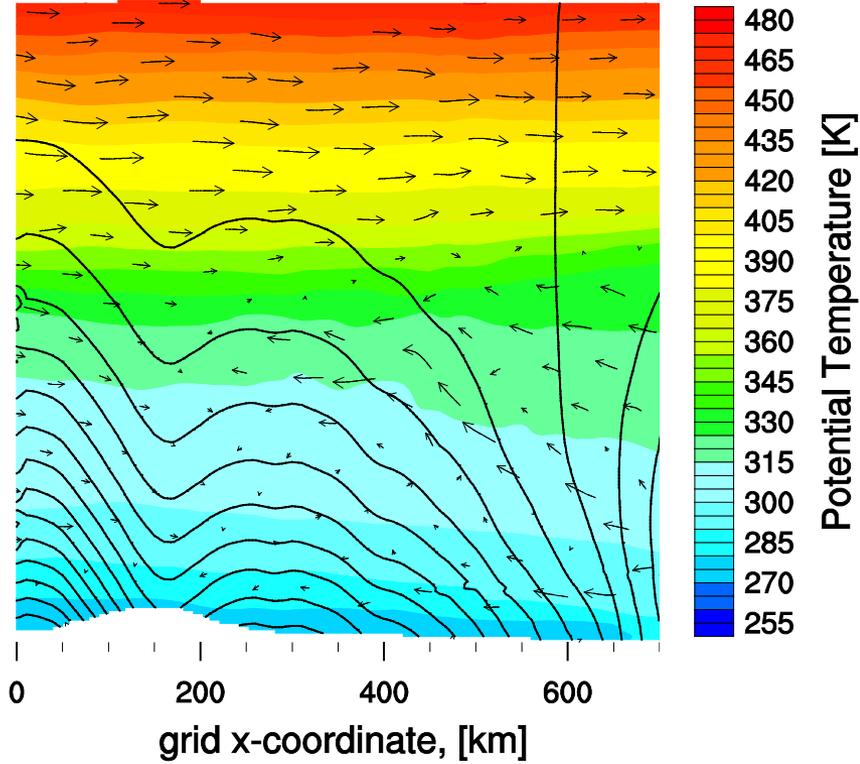


# East-West Slice of Potential Temperature (from the nested domain)

Vertical Levels  
Parent: 60  
Nest: 60



Vertical Levels  
Parent: 30  
Nest: 60



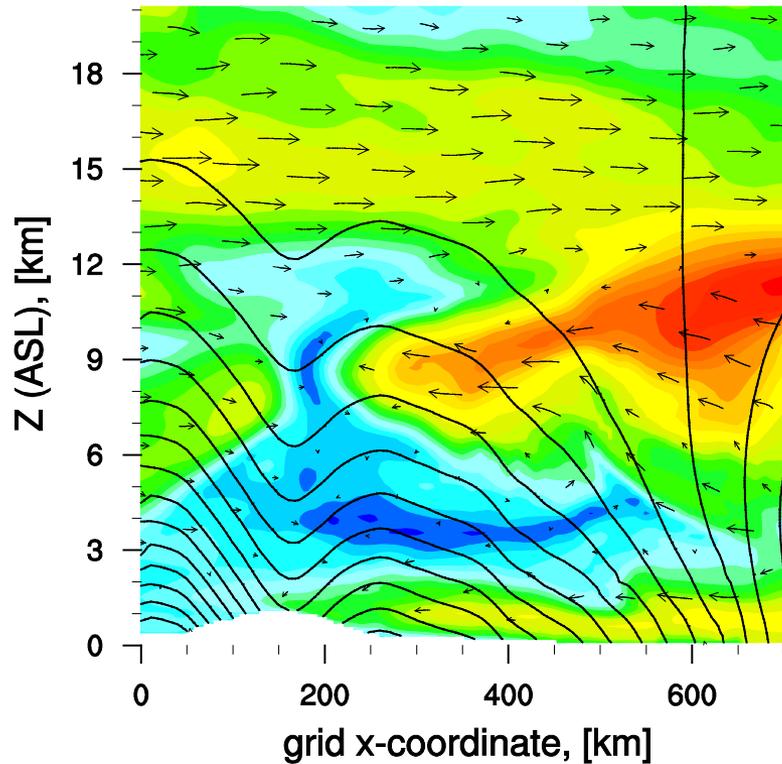
# East-West Slice of Wind Speed [ $\text{m s}^{-1}$ ]

(from the nested domain)

Vertical Levels

Parent: 60

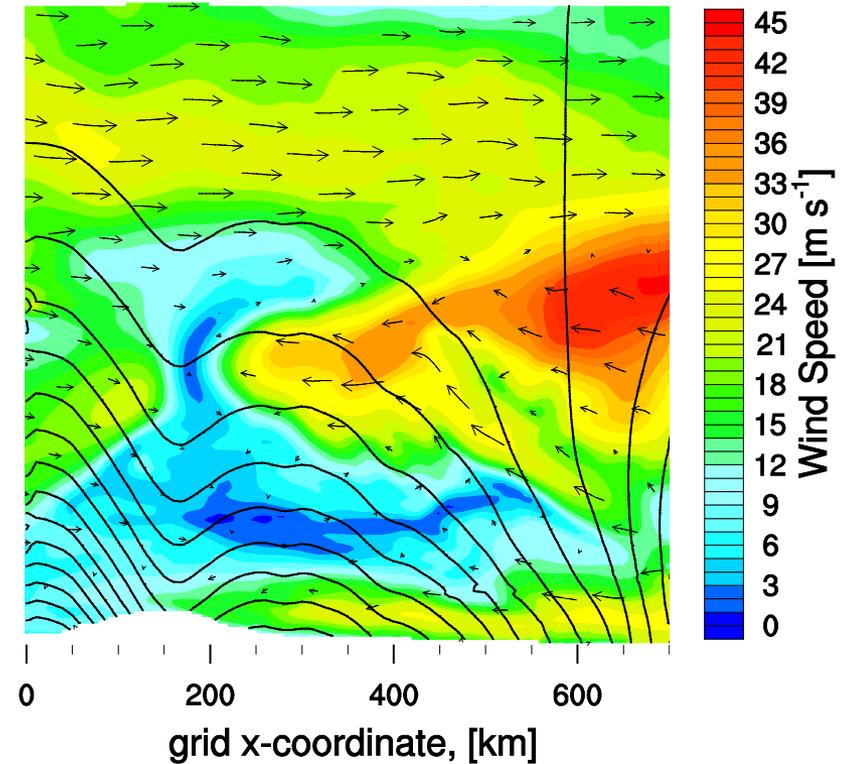
Nest: 60



Vertical Levels

Parent: 30

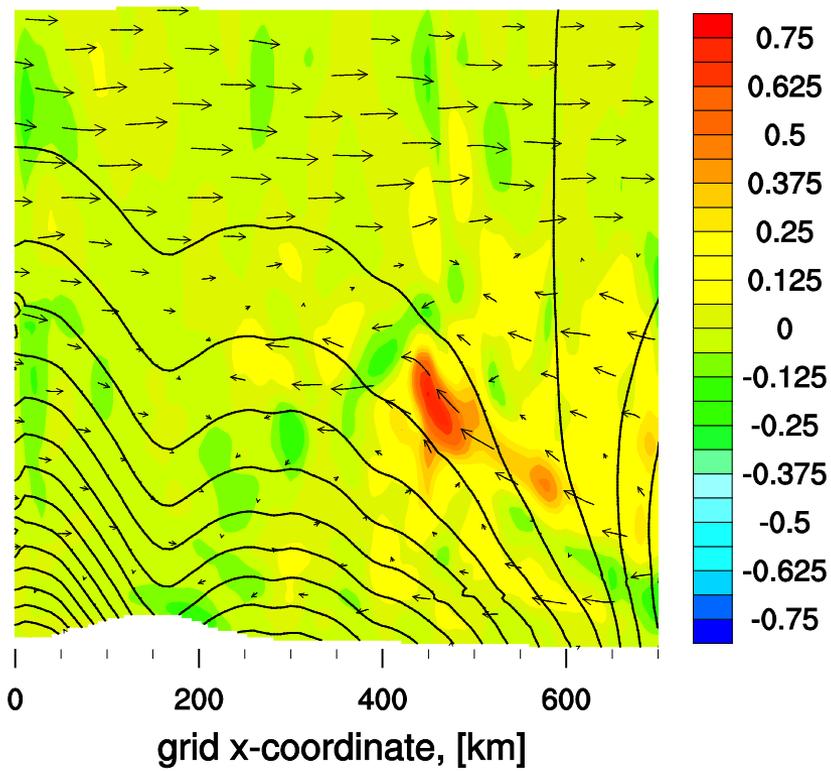
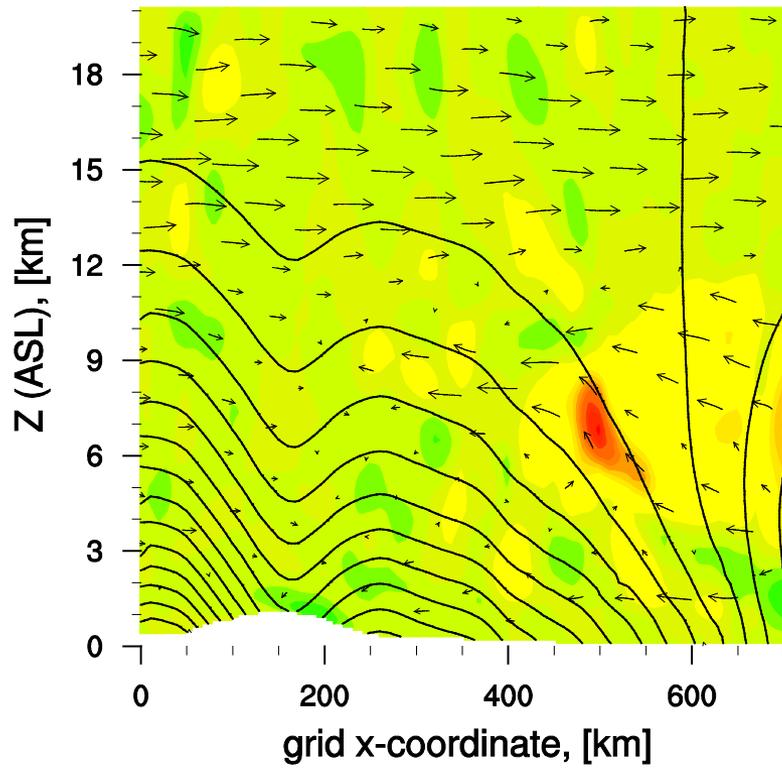
Nest: 60



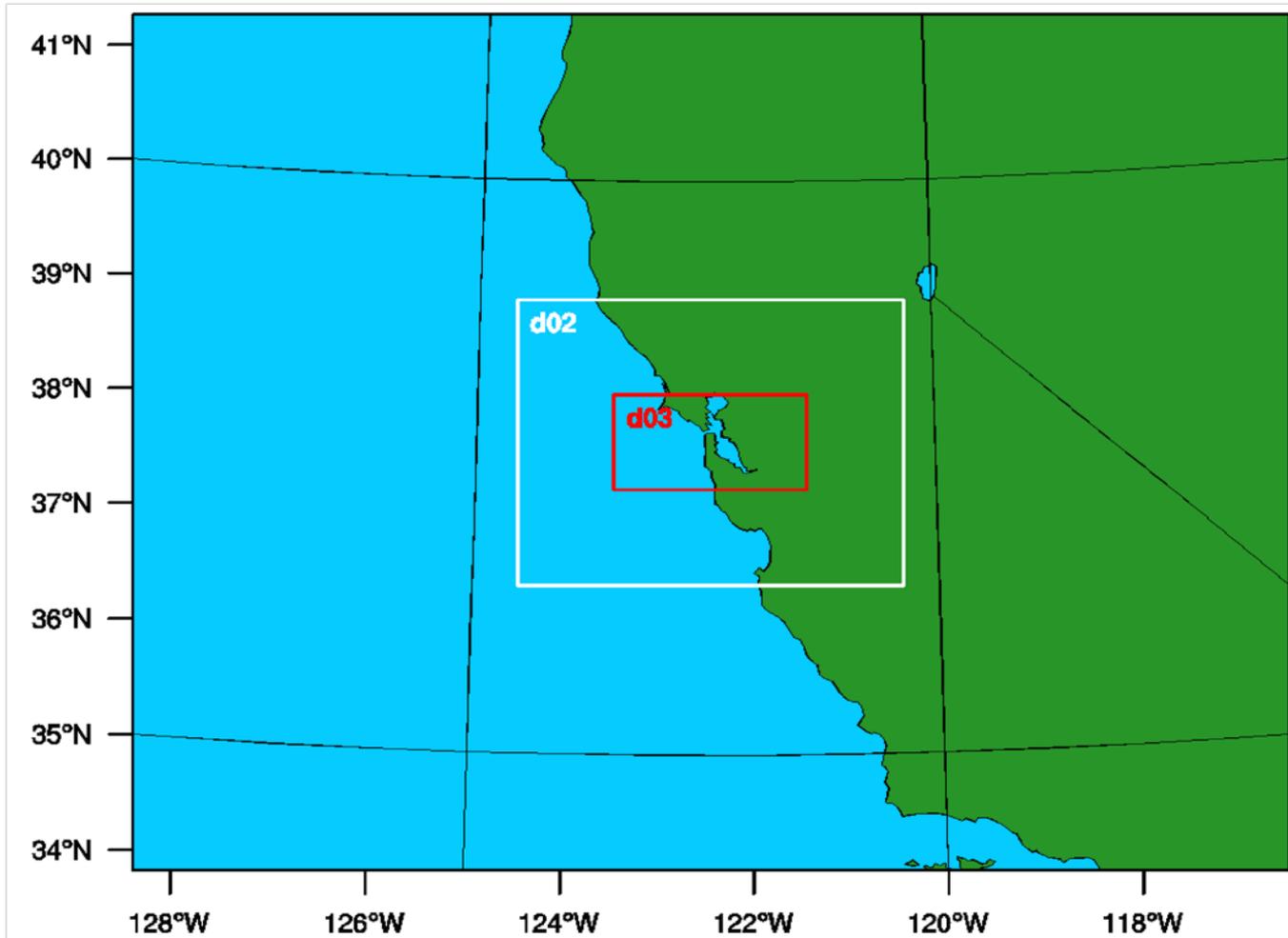
# East-West Slice of Vertical Velocity [m s<sup>-1</sup>] (from the nested domain)

Vertical Levels  
Parent: 60  
Nest: 60

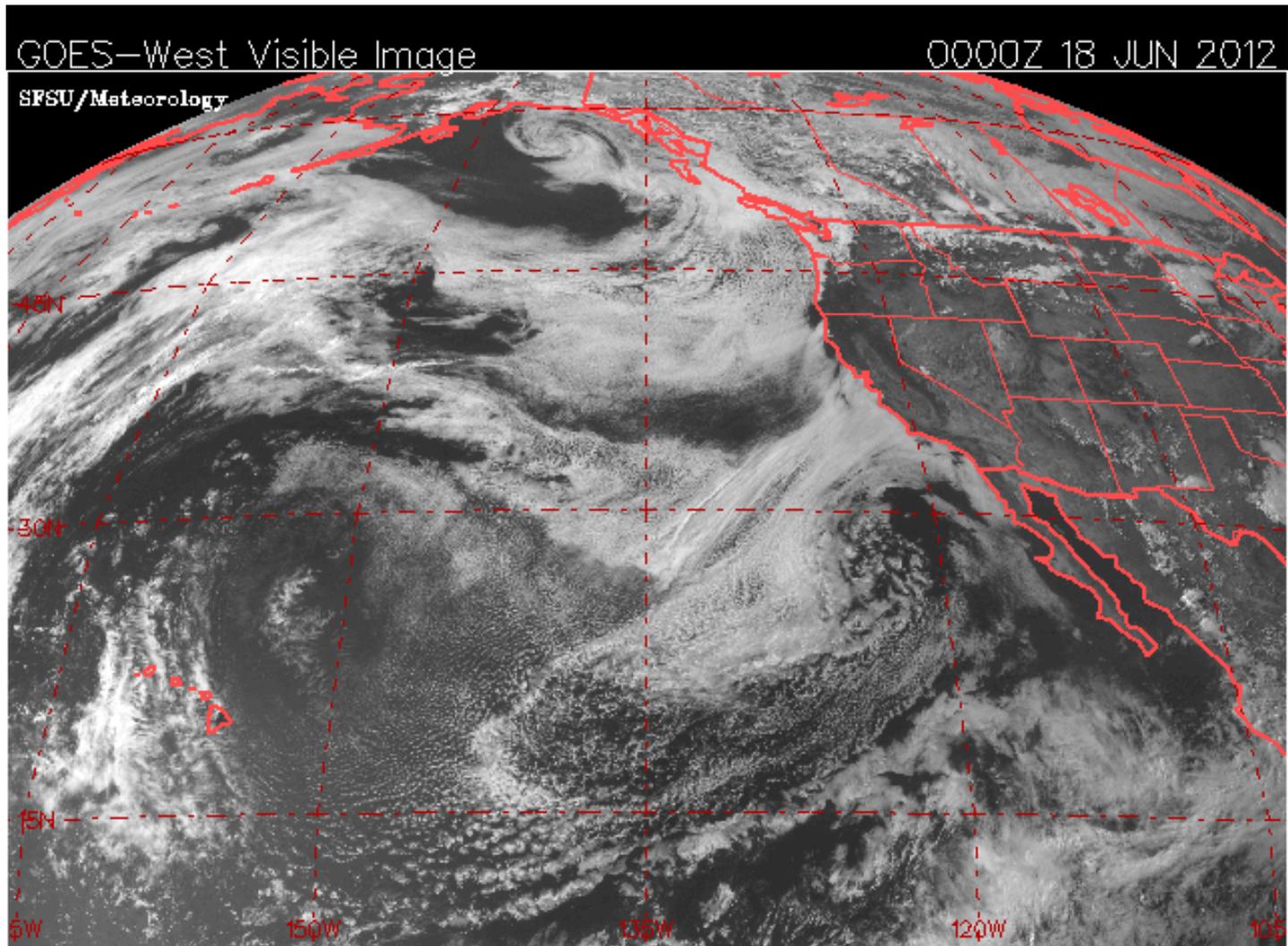
Vertical Levels  
Parent: 30  
Nest: 60



# Modeling the Bay Area With Vertical Grid Nesting

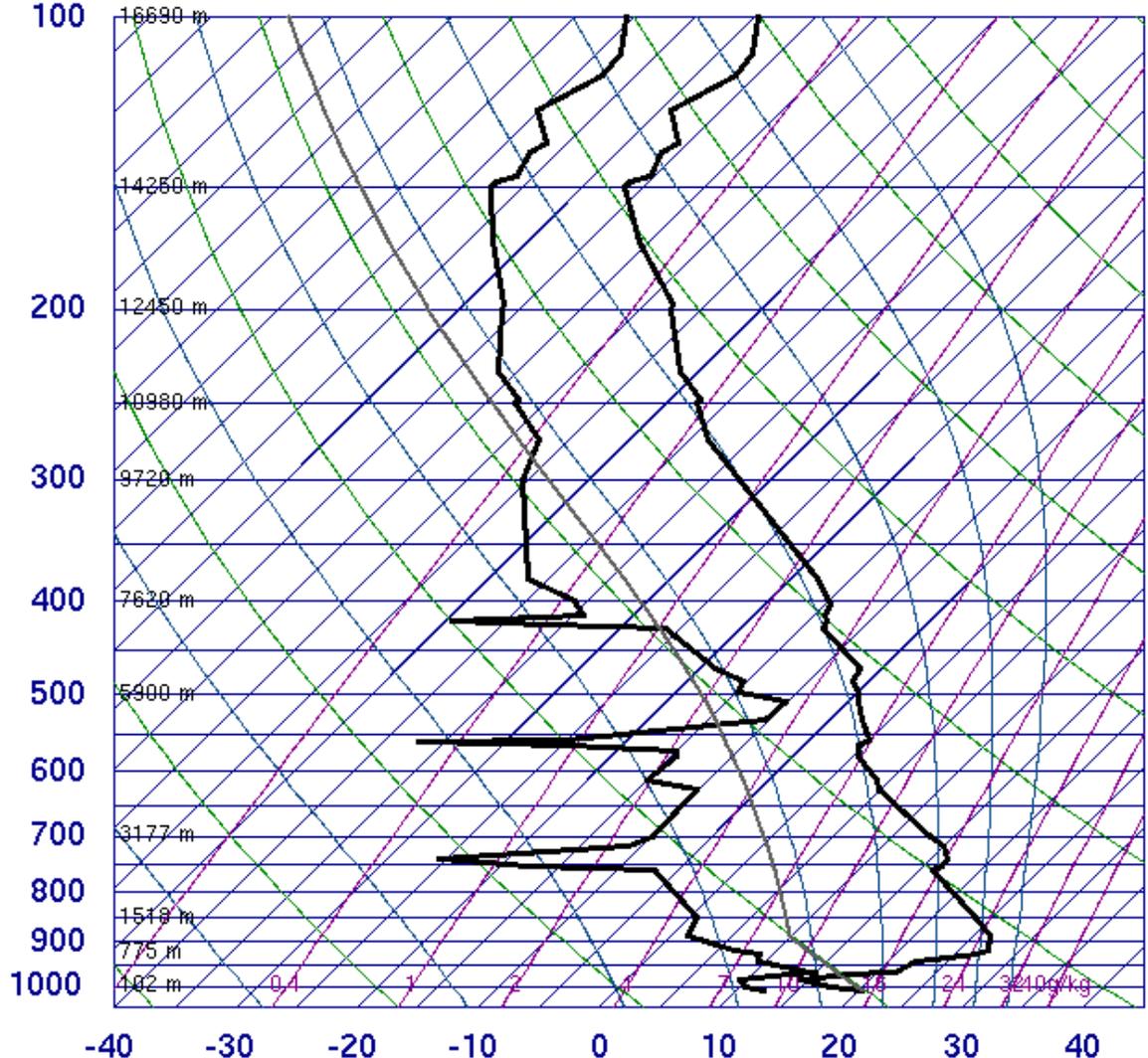


# Western US, June 18<sup>th</sup> 2012



# Oakland Radiosonde

72493 OAK Oakland Int

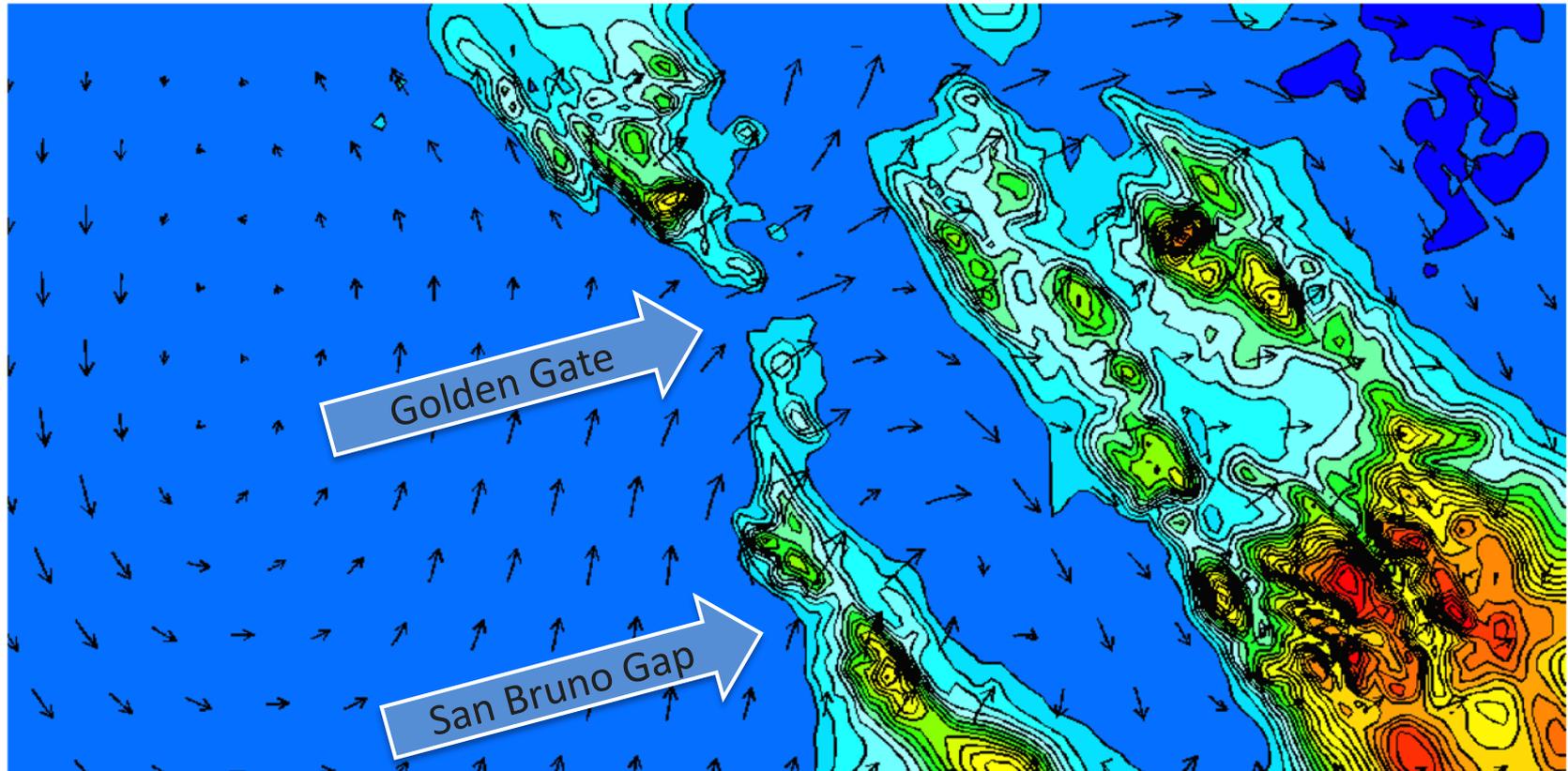


	SLAT	37.73
	SLON	-122.21
	SELV	3.00
	SHOW	8.63
	LIFT	12.98
	LFTV	13.12
	SWET	37.21
	KINX	5.90
	CTOT	5.30
	VTOT	28.30
	TOTL	33.60
	CAPE	0.00
	CAPV	0.00
	CINS	0.00
	CINV	0.00
	EQLV	-9999
	EQTV	-9999
	LFCT	-9999
	LFCV	-9999
	BRCH	0.00
	BRCV	0.00
	LCLT	283.1
	LCLP	890.2
	MLTH	292.7
	MLMR	8.78
	THCK	5798.
	PWAT	23.06

00Z 18 Jun 2012

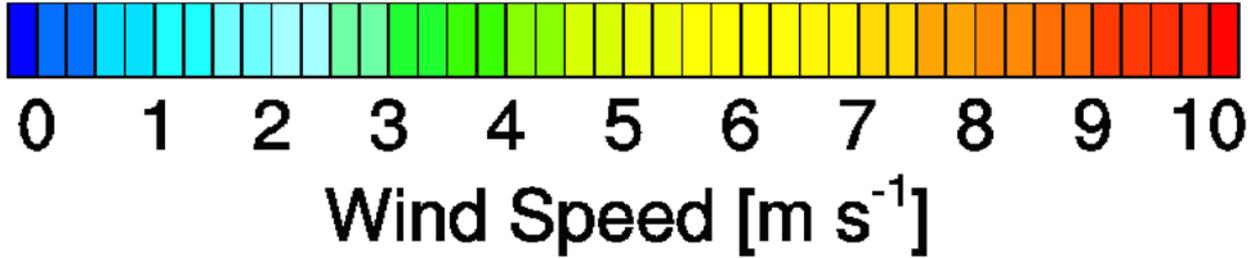
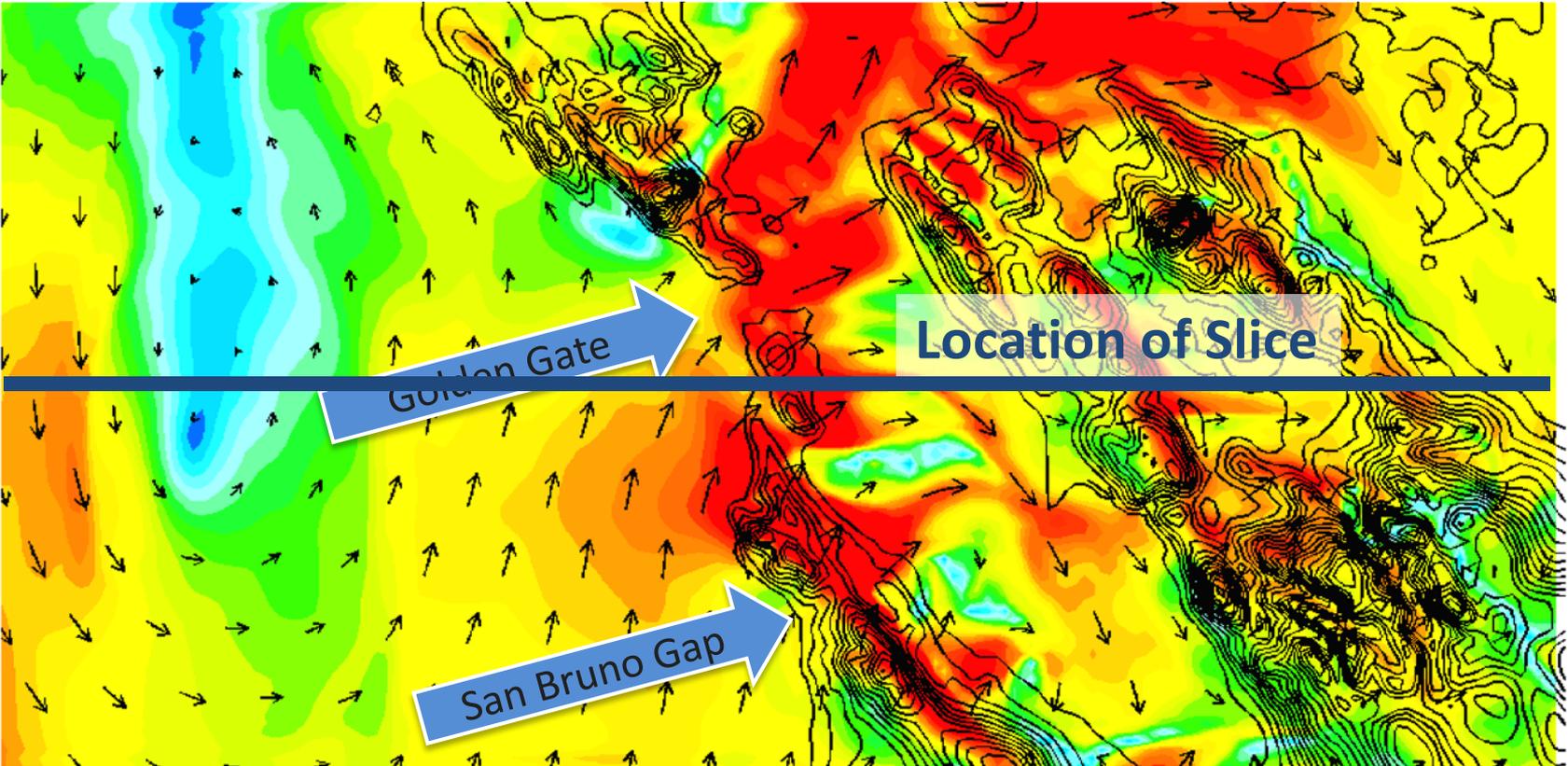
University of Wyoming

# Terrain Height & Wind Vectors from Lowest Model Level

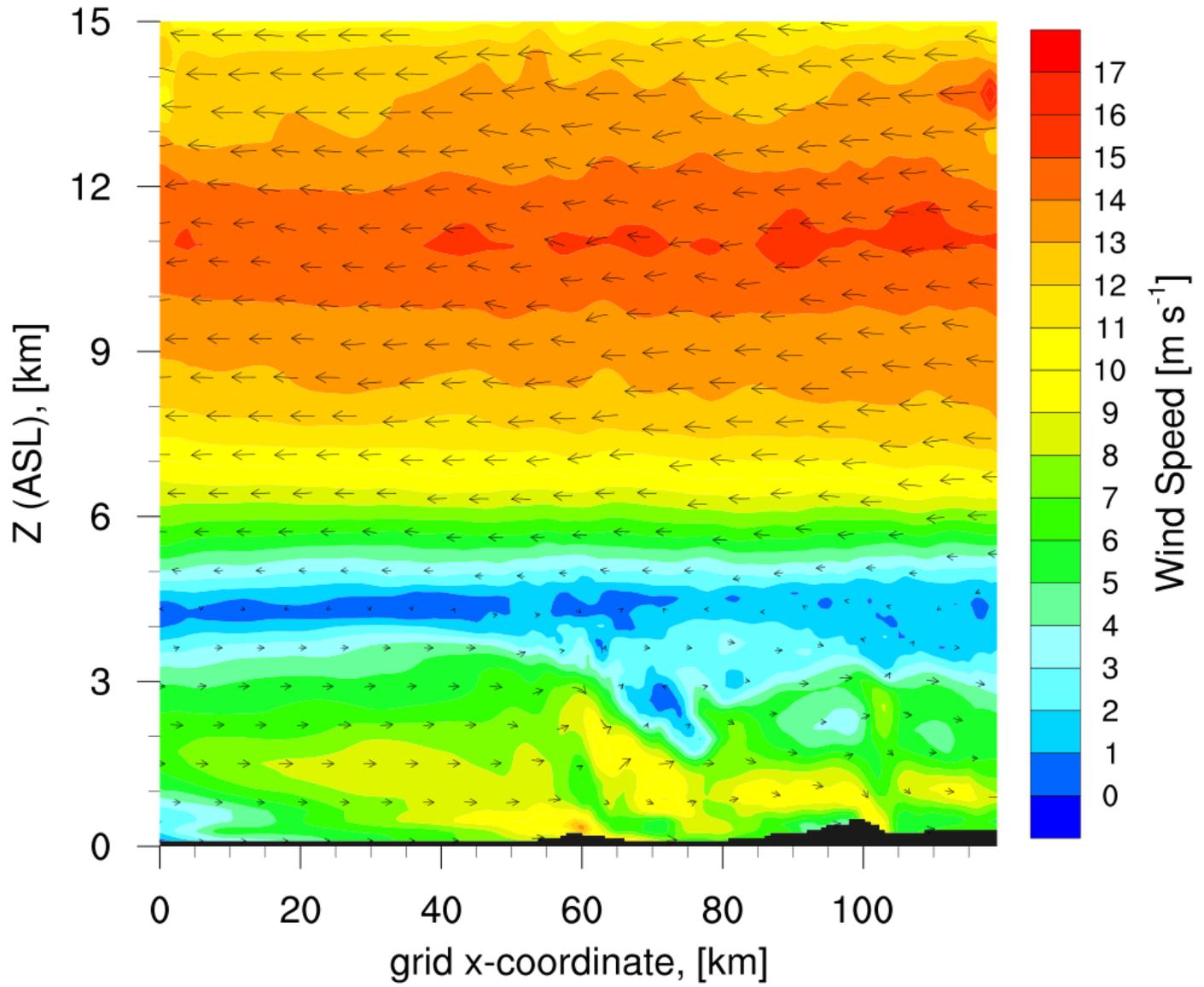


0 150 300 450 600 750 900  
Terrain Height [m]

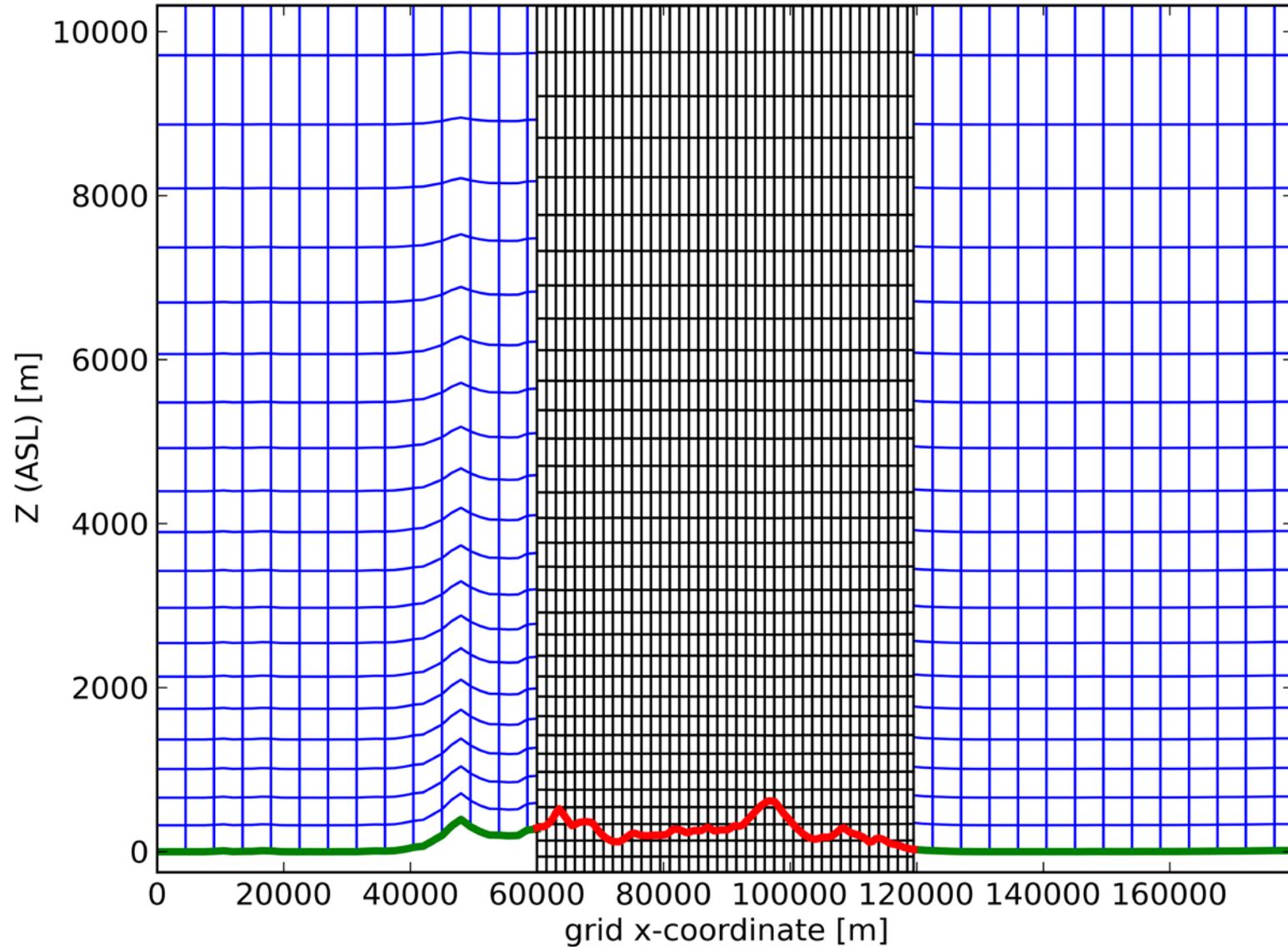
# Wind Speed at Lowest Model Level



# East-West Slice of Wind Speed



# Current Work: WRF to WRF-IBM Nesting



# Current Work: WRF to WRF-IBM Nesting

- Vertical grid nesting is necessary to force a WRF-IBM child domain that is nested within a WRF parent domain.
- WRF's solver is passed variables that are “coupled” with the dry air mass in the column.
- The parent and nest have different values for the dry air mass in the column because the domains have different bottoms.

# Current Work: WRF to WRF-IBM Nesting

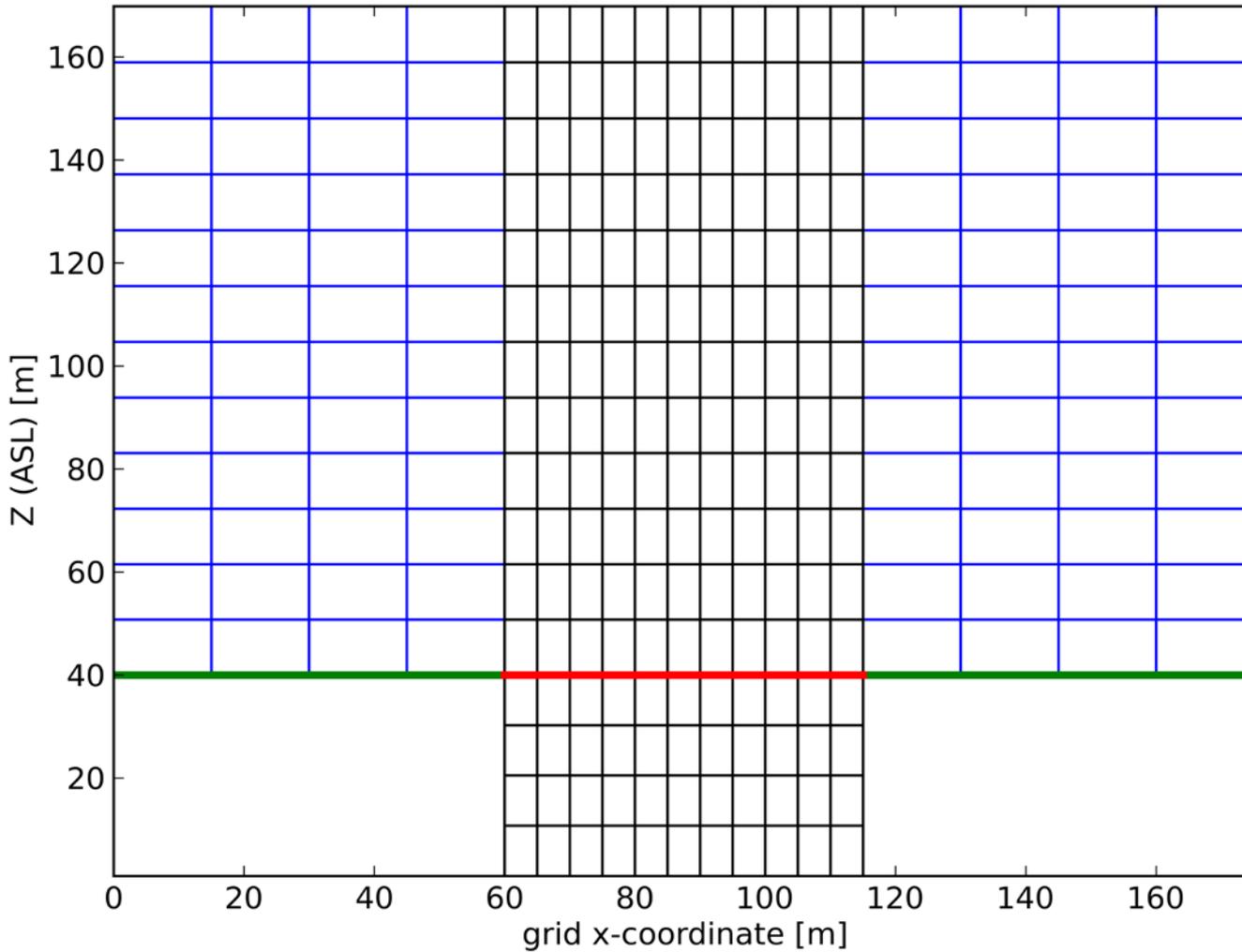
## WRF to WRF nesting

- Couple parent domain with  $\mu_{\text{parent}}$
- Couple nested domain with  $\mu_{\text{nest}}$
- Vertically interpolate coupled parent on to the nest
- Horizontally interpolate results on to the nest
- Save results to nested domain
- Uncouple parent domain with  $\mu_{\text{parent}}$
- Uncouple nested domain with  $\mu_{\text{nest}}$

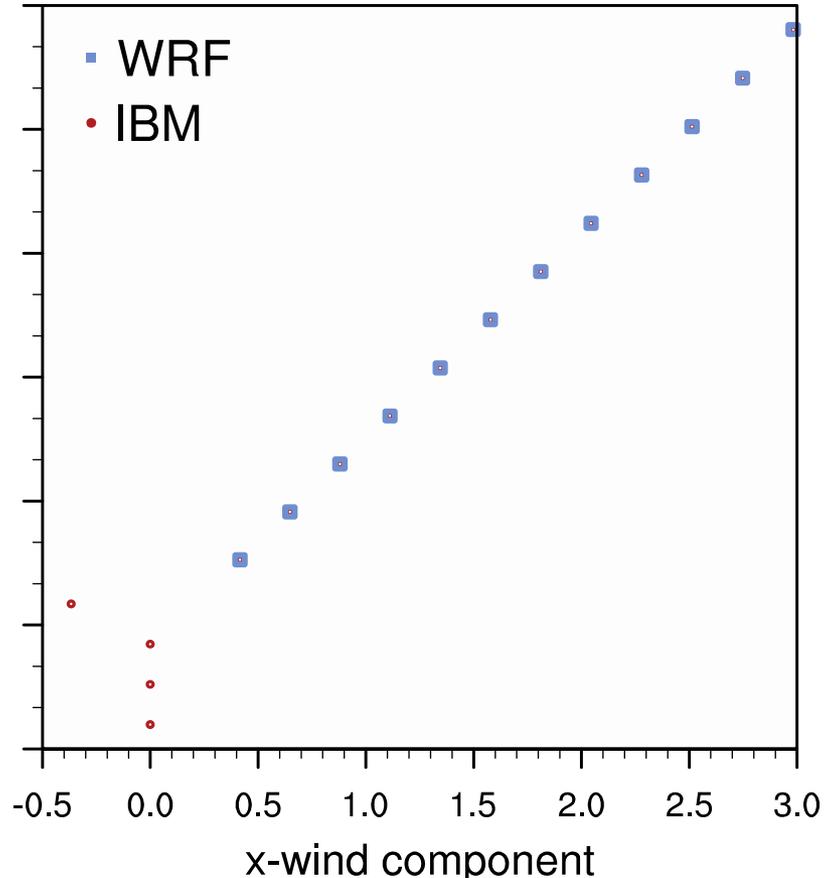
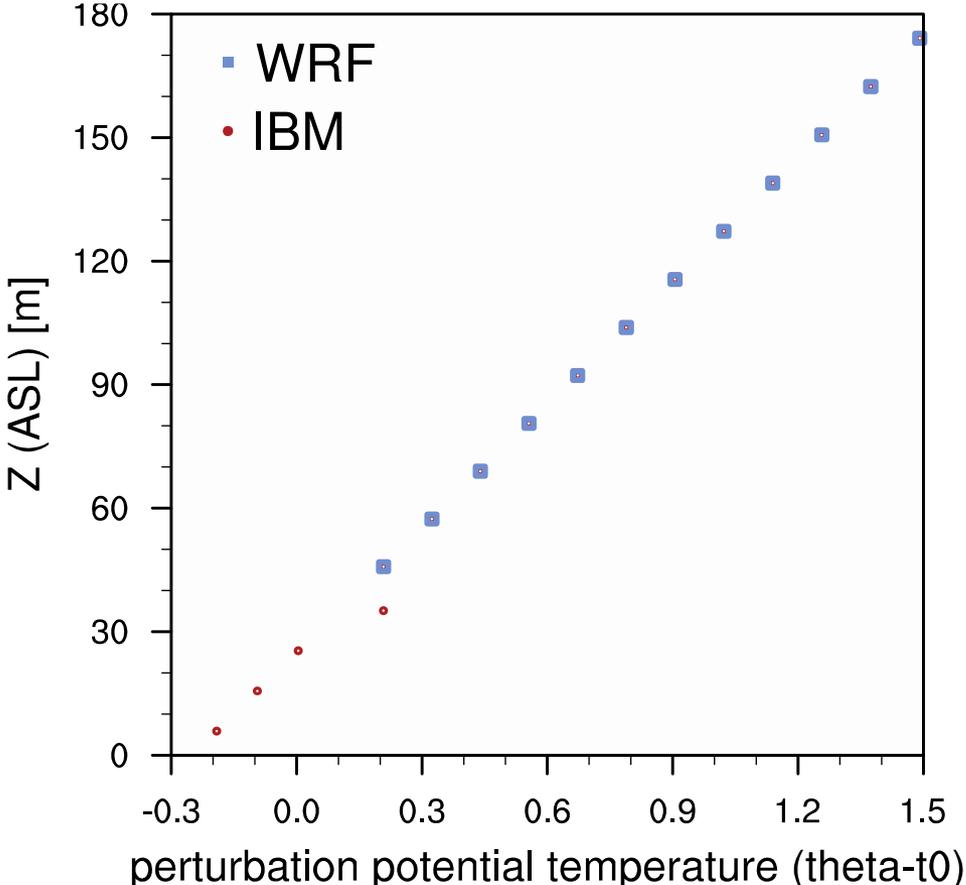
## WRF to WRF-IBM nesting

- Vertically interpolate parent on to the nest
- Horizontally interpolate results on to the nest
- Couple results with  $\mu_{\text{nest}}$
- Save results to nested domain

# Current Work: WRF to WRF-IBM Nesting



# Current Work: WRF to WRF-IBM Nesting

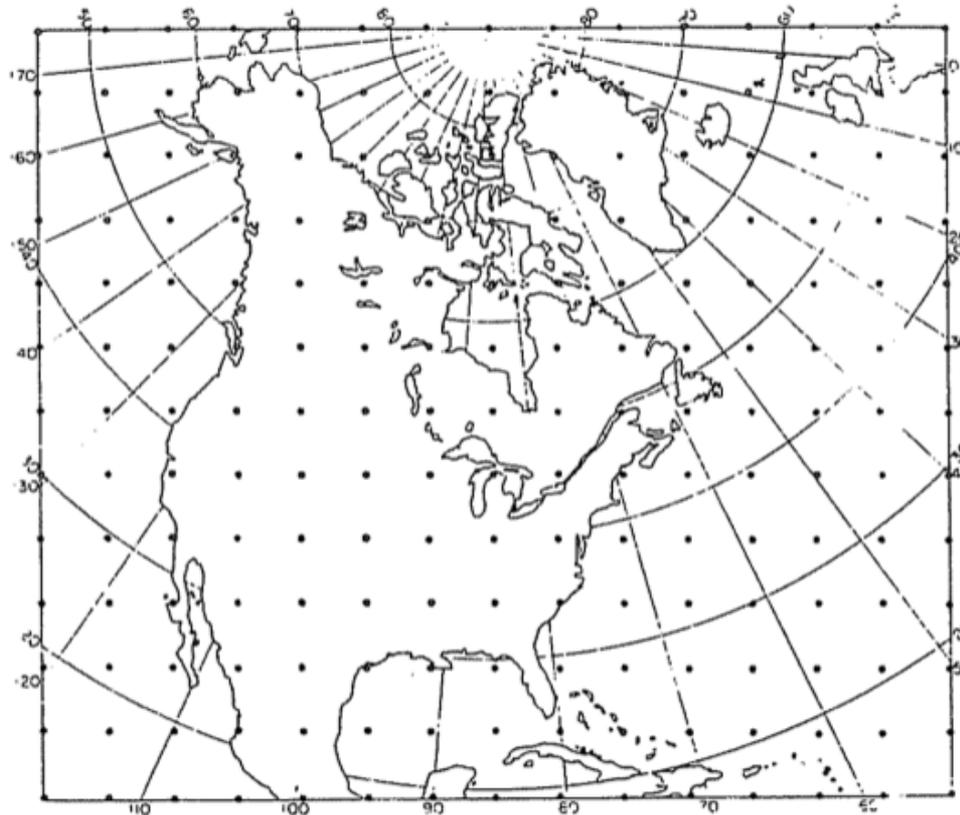


# Thank you for your attention

- Neighborhood-scale air quality modeling
- Introduction to multi-scale modeling
- Weather Research and Forecasting (WRF) model
- The immersed boundary method and WRF
- Vertical grid nesting in WRF
- WRF to WRF-IBM grid nesting (in development)
- Thank you to Lawrence Livermore National Laboratory, Jeff Mirocha, Megan Daniels, and EFMH at UC Berkeley

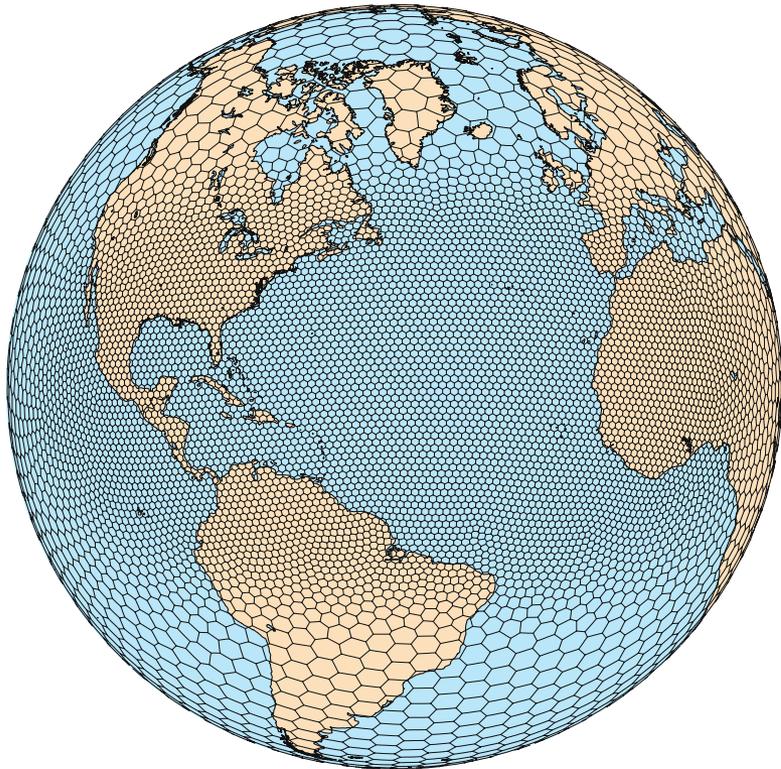
# Johnny von Neumann's Simulations

- J. G. Charney, R. Fjörtoft, J. von Neumann, 1950: Numerical Integration of the Barotropic Vorticity Equation. *Tellus*, Volume-2 Issue-4, 237-254, doi: [10.1111/j.2153-3490.1950.tb00336.x](https://doi.org/10.1111/j.2153-3490.1950.tb00336.x)



# Approaches to Downscaling

- Adaptive Mesh Refinement (AMR), used in the Model for Prediction Across Scales (MPAS).



- Increase resolution near regions of interest.
- Saves computational resources by minimizing overall number of cells.