# An Ultra-High Resolution Sailing Forecast System for San Francisco Bay

WRF Users' Workshop

June 25, 2014

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Sailor's Energy
Sail Tactics

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Stanford University

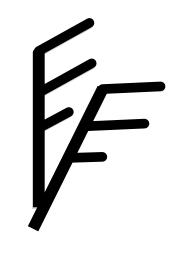


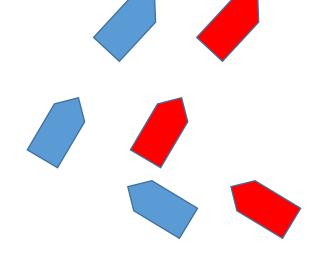


#### Motivation

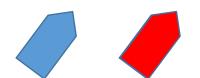
- SF Bay is the best place to sail in the world
- America's Cup 2013
- Sailboat racing
  - Knowing wind speed/direction change
  - Huge advantage
- Crowdsourced field campaign

Advantage: Knowing Wind Shifts

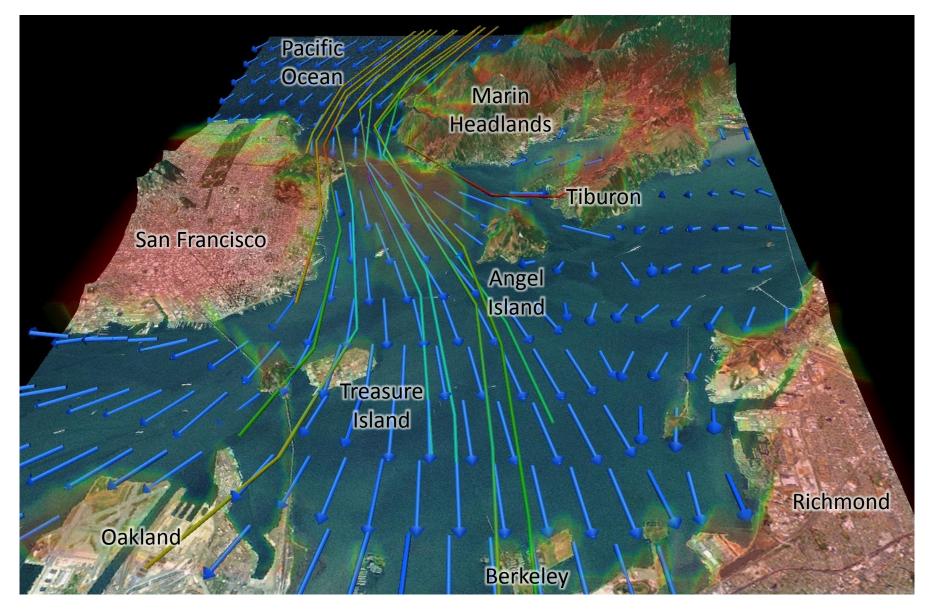




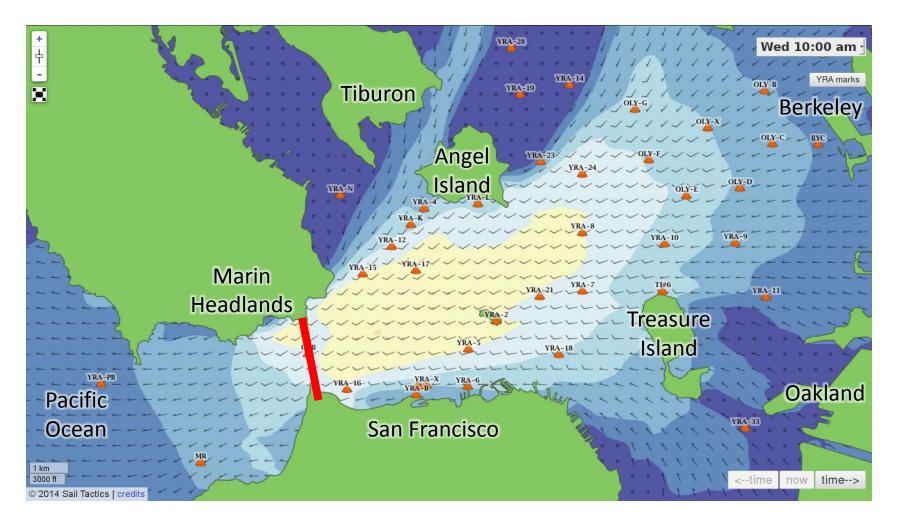
Blue is closer to race mark because they anticipated the wind shift



#### What 200-meter Resolution Gets You



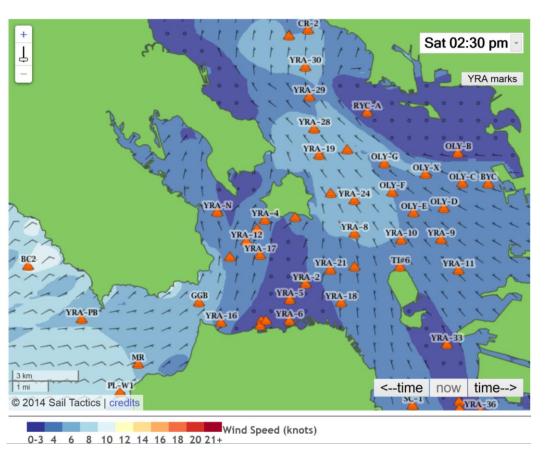
## Typical summer sea breeze conditions





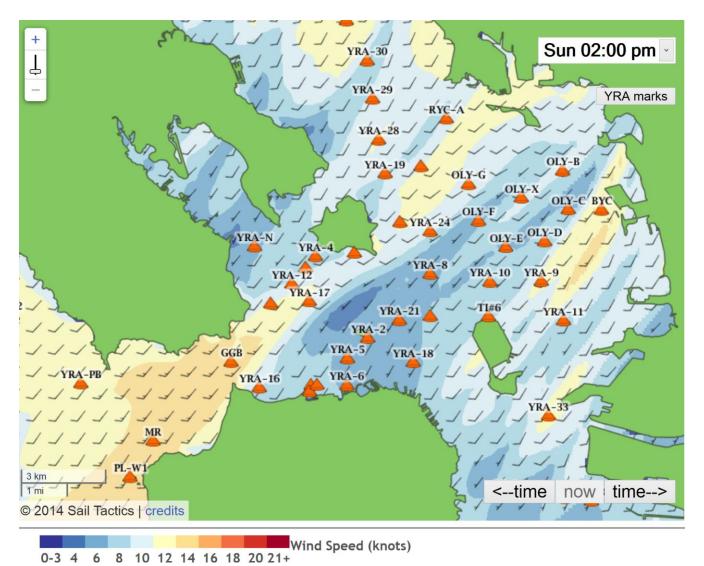


#### Wintertime Offshore Flow

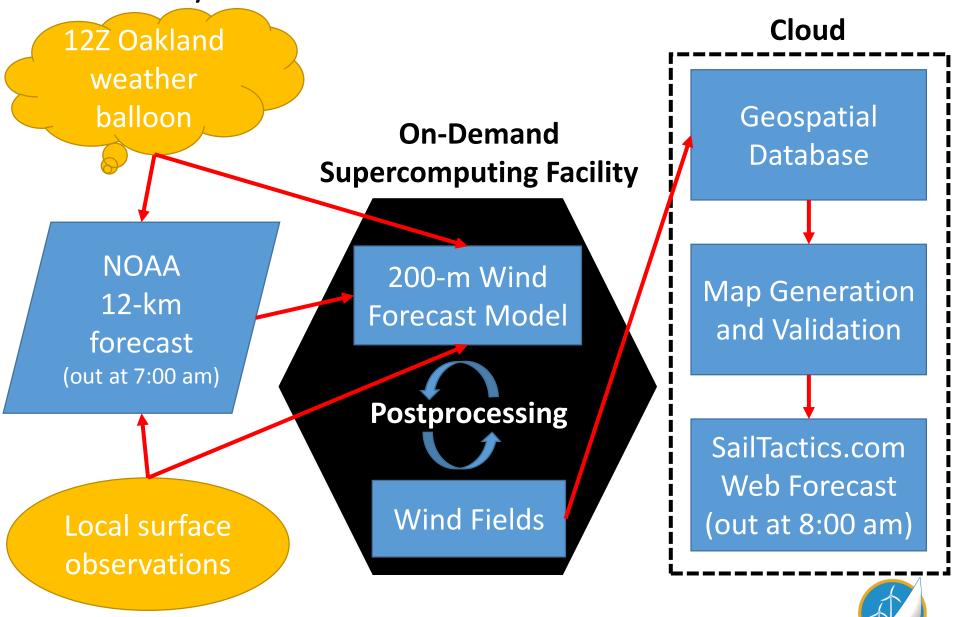


- Light, northerly winds
- Land breeze
  - Cool Central Valley
  - Warm ocean
- Often counteracted by a late arriving sea breeze

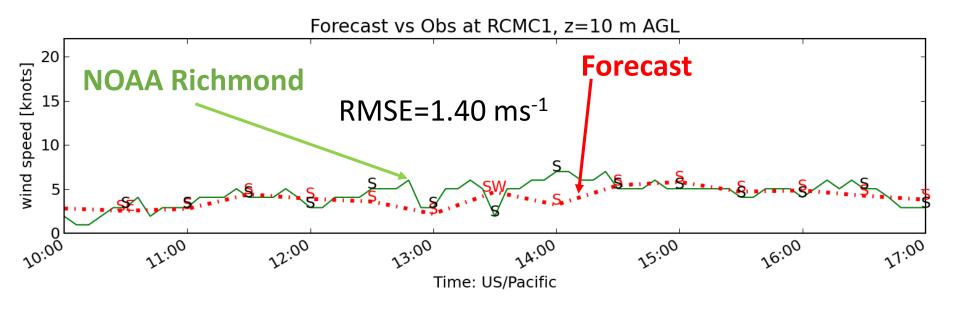
# Stormy Forecast: Sail the Streaks

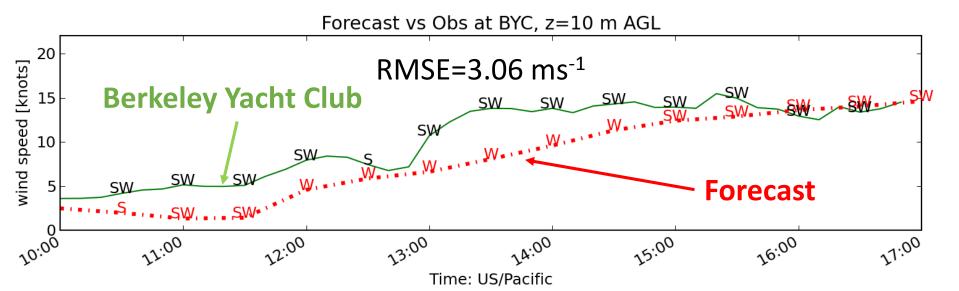


### SF Bay Wind Forecasts – Just in Time

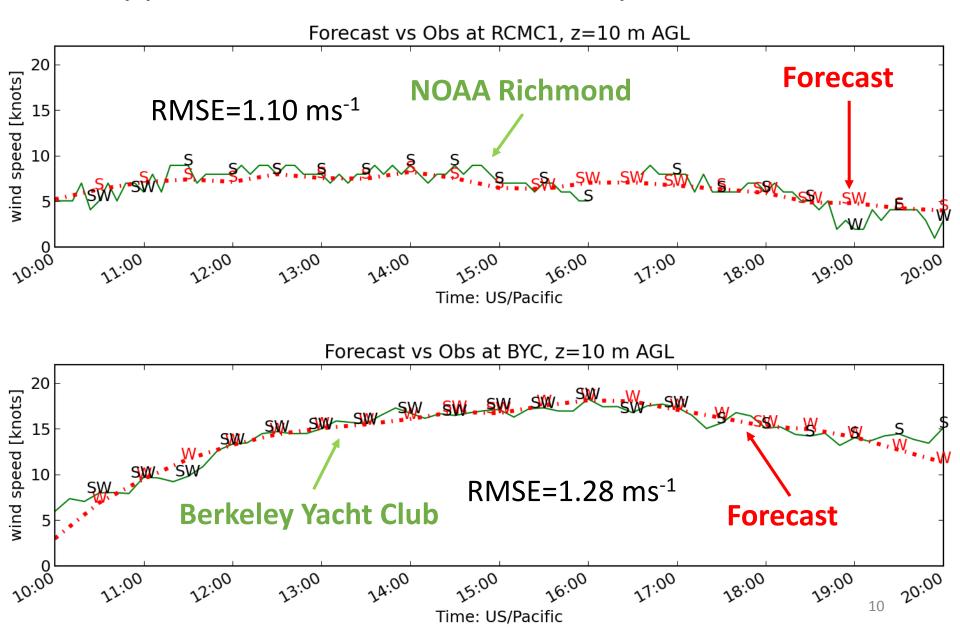


## Typical Forecast Accuracy: 2014-03-23



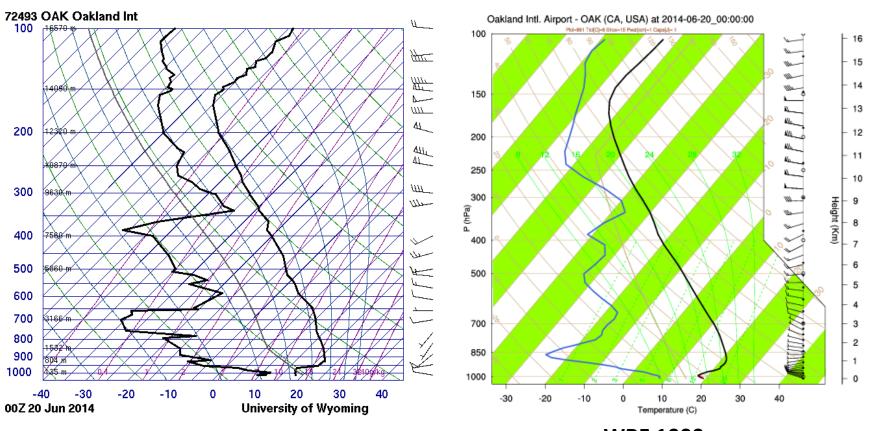


# Atypical Forecast Accuracy: 2014-05-31



# Marine Boundary Layer

WRF 1000-m resolution domain 12 hours after init. (0Z sounding)



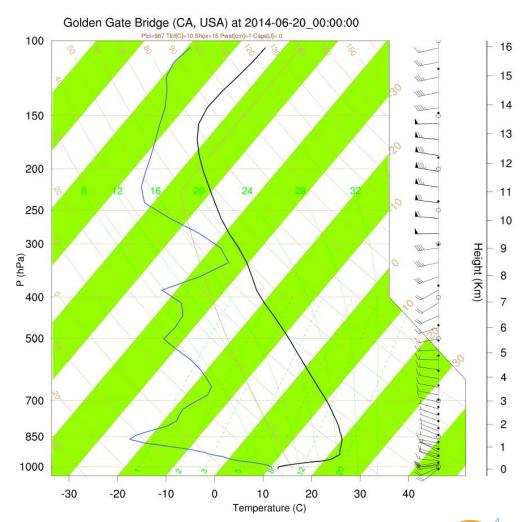
**Observation** 

WRF 1000-m resolution domain



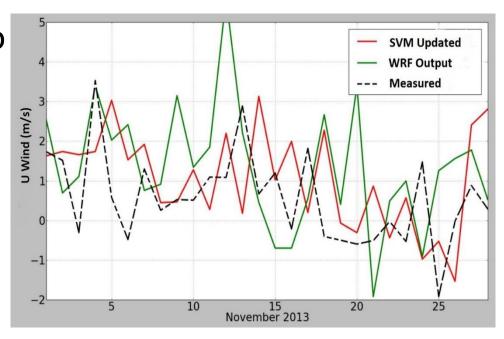
# Golden Gate Bridge Sounding

- WRF 200-m domain from Jun 20, 2014
- Strong 13 K inversion
  - ~250 m height
  - Coastal range
     ~300-500 m
  - Forces flow thru Golden Gate
- Moist, fog forming sea air present



# Machine Learning Forecast Improvement

- Support vector machine to update WRF forecasts
- Sliding window approach
  - 14 days training
  - 15<sup>th</sup> day as target
  - 16<sup>th</sup> day as prediction
- 20% RMSE improvement



SVM updated forecast for 18:00 UTC, Nov 2013

# Future of SF Bay Wind Forecasting

#### Near-term

- On-the-water observations/validation (Sea Star)
- Using RAP and 3DVAR for initialization
- Open source WinDB geospatial database

#### Longer-term

- Using drones/boats to measure at optimal locations (Quiroga, Stanford)
- Tide forecasts overlain with winds
- Wind power forecasting



#### Conclusions

- Created a 200-m res. WRF forecasting system
- Created a responsive website and GIS backend at SailTactics.com
- WRF often shows good skill at 200-m res.
- Sail Tactics racers have won 1<sup>st</sup> place in every major race of 2014 in the San Francisco Bay

## Thanks! Questions?

#### Mike Dvorak

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# Sailor's Energy Sail Tactics







Sea Star finishing a race at the Berkeley Marina

View example forecasts at SailTacitcs.com