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# Using Python to Store, Display, and Analyze Pressure Observations from Earthscope's USArray Network

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## What is the US Transportable Array (USArray)?

- EarthScope-funded project of ~400 seismic stations traversing across the CONUS in an effort to catalogue and study seismic activity
- Stations outfitted with microbarometers in 2010 (1 Hz reporting frequency)





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### **Project Objectives**

- Improve access for the atmospheric science community to both real-time and archived pressure observations through displays and other web-based products at varying sample intervals (1-second, 5-minute, etc.)
- Develop and analyze climatologies at each observing site of pressure perturbations and signatures in terms of frequency and amplitude
- Examine pressure perturbations and perturbation gradients in the context of local, mesoscale, and synoptic-scale flows (waves, terrain-flow interactions, thermally-forced systems, etc.)





### Motivation for Use of Python

- USArray pressure dataset provides a unique opportunity to catalogue meteorological events at multiple spatial and temporal scales
  - Semi-regular station spacing (~70 km between locations)
  - 1 Hz temporal resolution
  - Station deployment  $\sim$  1.5-2 years

Python chosen due to its numerous advantages in the following areas...

- Storage and querying of large arrays of data
- Object-oriented nature for fast manipulating
- Time series filtering procedures
- Leveraging of interactive web displays





### Python for USArray Data Storage

- Dataset produces a number of challenges due to its large size, spatial irregularities (non-gridded), and temporal irregularities
- PyTables chosen as mechanism to store observations in two "databases" based on station and time in compressed HDF5 format
- Database #1: Individual station tables of all observations
  - Level-7 Zlib compression
  - New data appended on a daily basis
  - Statistics from 1 Jan 2010 31 Dec 2013
    - Total observations: 46,086,051,637
    - Disk Space Used: 58 GB



~1.26 bytes per observation (time, station, value)



### Python for USArray Data Storage

- Database #2: Daily files of all active USArray Stations
  - Nested tables used to store data in pseudo-gridded format
  - Supplemental metadata schema used to leverage dataset onto maps







### Python for USArray Data Analysis

• Quality Control: the ability of NumPy to efficiently parse large data arrays aided significantly in identifying missing/spurious data periods







#### Python for USArray Data Analysis

Mesoscale/Synoptic Pressure Signature Identification Algorithms

- SciPy Butterworth filtering techniques applied to generate perturbation time series from the original time series data
- Large pressure signatures identified using local min/max functions





### Python for USArray Data Analysis

• Descriptive quantities of the pressure signature fields stored in HDF5 PyTables file for fast querying based on user-defined preferences









 Website (<u>http://mesol.chpc.utah.edu/usarray</u>) uses Python in conjunction with JQuery and Leaflet to generate interactive maps and plots



								Legen	i (units	in nPa)								
- 10.00	-5.00	-4.00	-3.00	-2.00	-1.50	-1.00	-0.75	-0.50	0.50	0.75	1.00	1.50	2.00	3.00	4.00	5.00	10.00	10.00+
~-10.00	-10.00	-5.00	-4.00	-3.00	-2.00	-1.50	-1.00	-0.75	-0.50	0.50	0.75	1.00	1.50	2.00	3.00	4.00	5.00	10.001





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• Real-time displays utilize 5-minute observations courtesy of MesoWest (<a href="http://mesowest.utah.edu">http://mesowest.utah.edu</a>). MesoWest data is also forwarded onto MADIS.







http://mesol.chpc.utah.edu/usarray







#### Z49A: Mesoscale Event Table



\*Data acquired from the Incorporated Research Institutions for Seismology (IRIS) Data Management Center (DMC)

#### Choose different options and click "Change Options"

Begin Time (YYYY/MM/DD): 2010 • 01 • 01 • End Time (YYYY/MM/DD): 2013 • 12 • 31 •

Signature Type: Rises Only · Magnitude Rate >=: 20.0 · hPa/hr

#### Change Settings

2 Mesoscale Events Found!

Begin Time	End Time	Duration (minutes)	Pressure Change (hPa)	Pressure Rate (hPa/hr)	Graphical Links
2012-07-31 09:56	2012-07-31 10:11	15.0	5.40	21.60	Click for Graph
2013-02-10 21:17	2013-02-10 21:27	10.0	3.78	22.68	Click for Graph







#### http://mesol.chpc.utah.edu/usarray



#### Future Tasks

- Continue developing climatologies of pressure perturbations and signatures for all USArray stations using Python storage/analysis techniques
- Explore wavelet analyses of time series using PyWavelets
- Develop algorithms to calculate pressure perturbation gradients
- Develop climatologies of the above pressure perturbation gradients for each USArray station in the database





#### **Acknowledgements and References**

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Additional work on this project can be found in tomorrow's poster session... Jacques, Alexander A. and J. Horel, 2014: Pressure Signatures of Extreme Weather Events Deduced from Earthscope's USArray Network 26<sup>th</sup> Conf. Weather Analysis and Forecasting - Poster #108



