

# Routine LES: LASSO and beyond

## Breakout Organizers

William Gustafson (PNNL), Andrew Vogelmann (BNL), &  
Jim Mather, ARM Technical Director (PNNL)

## Core LASSO Team

PNNL:	William Gustafson (PI), Heng Xiao
BNL:	Andrew Vogelmann (Co-PI), Satoshi Endo, Tami Toto
UCLA:	Zhijin Li
NUDT, China:	Xiaoping Cheng
ORNL:	Bhargavi Krishna

Breakout at the 2018 ARM/ASR PI Meeting, Mar. 2018

- LASSO review: current state & implementation plans (Gustafson)
- Science applications (Heus, Xiao, Oue, & Glenn)
- Discussion & feedback on LASSO implementation (Vogelmann)
- Approaching the LASSO expansion decisions (Mather)
- Guided discussion of candidate expansion scenarios (Gustafson & Vogelmann)
- Open discussion of LASSO expansion (Gustafson & Vogelmann)
- Summarizing action items (Gustafson)

# LASSO is an approach with an associated product



- **Goal:** The LASSO Workflow is designed to complement ARM megasite observations with LES output to support the study of atmospheric processes and the improved parameterization of these processes in atmospheric models
- **Approach:** Provide a **library of cases** and use an **ensemble of LES combined with observations** to simplify data discovery and bridge the gap from point observations to model grid cells—the modeling adds value to ARM’s observations
- **Status:** Completed the pilot phase testing and currently implementing the first iteration to **routinely run the LES for shallow convection days at SGP**, working on expansion options during 2018/2019

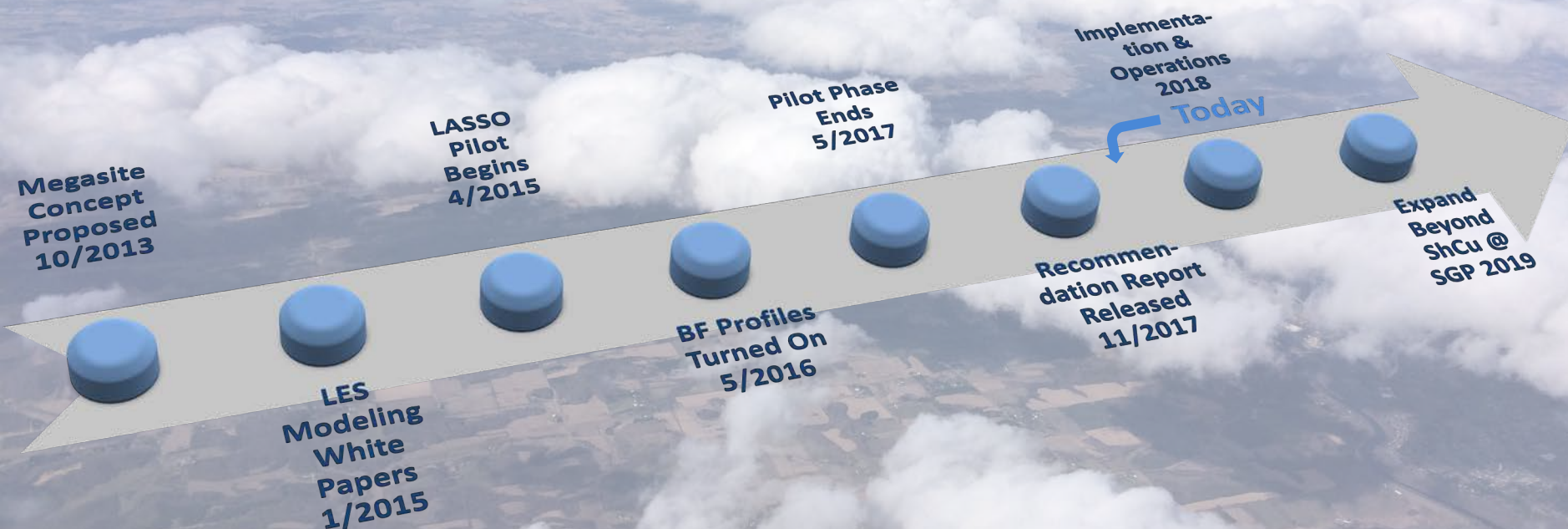
# What makes LASSO special?



1. Ever-growing library of LES cases to build robust statistical analyses and confidence
2. Focus on blending observations, forcings, and LES into user-friendly data bundles
3. Steps back from the tradition of fine-tuned, idealized forcings by employing an ensemble of plausible forcings constrained by observations
4. Backing of US Department of Energy's Atmospheric Radiation Measurement (ARM) Facility with a commitment to ongoing production and expansion



# The road to LES at SGP

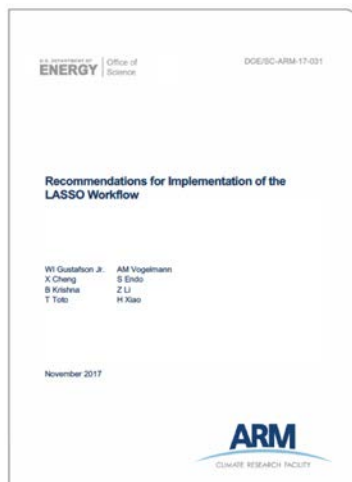


# Important LASSO Reports

## Recommendations for Implementation of LASSO

Gustafson, et al., 2017. Recommendations for Implementation of the LASSO Workflow. doi:10.2172/1406259.

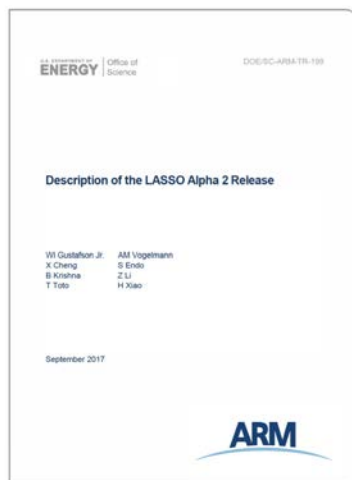
- ▶ Contains recommendations from the LASSO Pilot Phase regarding what should be implemented for operations
- ▶ We are still accepting feedback and have not yet locked down the implementation



## Description of the LASSO Alpha 2 Release

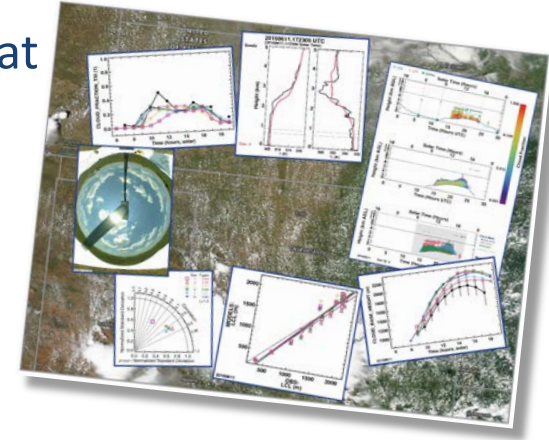
Gustafson, et al., 2017: Description of the LASSO Alpha 2 Release. doi:10.2172/1376727.

- ▶ Contains technical details about the LASSO data bundles, e.g., skill score descriptions, lists of variables



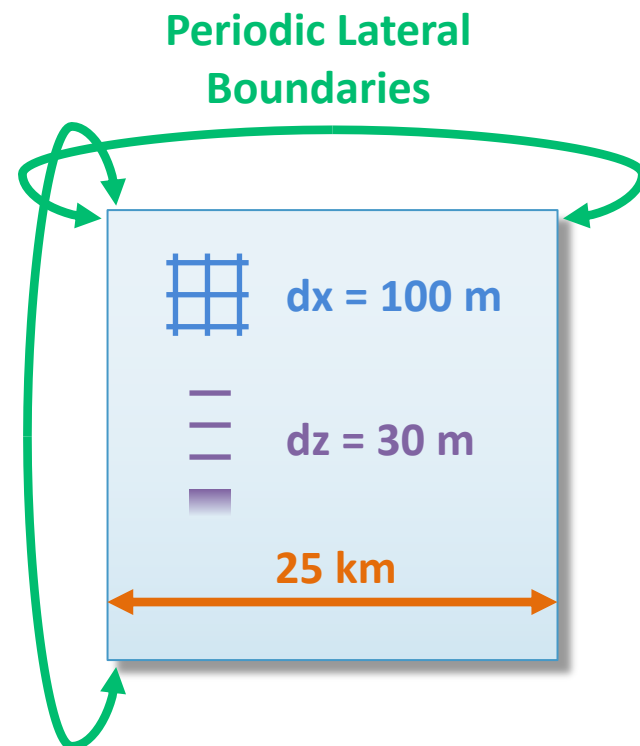
# Core LASSO components

- Library of LES simulations for **shallow convection** cases at ARM's **Southern Great Plains** observatory: currently 18 days and growing
- For each case:
  - ▶ Ensemble of large-scale forcing data sets drives the LES
  - ▶ LES inputs and outputs for the ensemble
  - ▶ Selection of concurrent observations for cloud and boundary layer variables
  - ▶ Skill scores and diagnostics evaluating the simulations
- Bundle Browser interface to find simulations of interest
  - ▶ <http://archive.arm.gov/lassobrowser>



# Large-eddy simulation configuration

- Weather Research and Forecasting (WRF) model with “FASTER” LES package
- Uniform lower boundary with specified surface fluxes based on ARM observations
- Thompson microphysics & RRTMG radiation
- 8-member ensemble for each case based on forcings
  - ▶ VARANAL
  - ▶ 3 spatial scales for MSDA & ECMWF
  - ▶ Static large scale (only init. from sonde)





# Currently available products

<https://www.arm.gov/capabilities/modeling/lasso>



## ■ Alpha 1 Release

- ▶ 5 case days from spring–summer 2015
- ▶ 192 simulations
- ▶ Aimed at getting initial concept to the community for feedback
- ▶ Currently re-running to make consistent with Alpha 2 and to fix some bugs

## ■ Alpha 2 Release

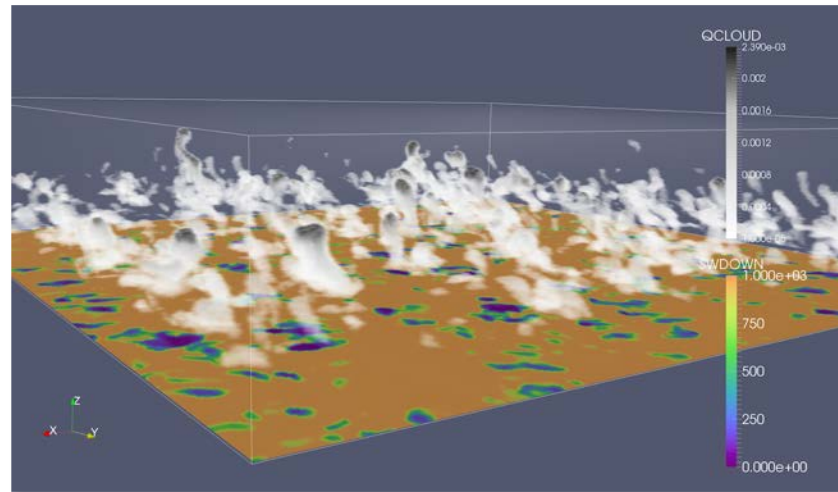
- ▶ 13 case days from spring–summer 2016
- ▶ 544 simulations
- ▶ Systematic comparison of domain size, grid spacing, microphysics, and model choice

## ■ 2017 Cases (to be released later this year)

- ▶ Selected 32 cases for April–November 2017

# Discover LASSO

- Top-level webpage: <https://www.arm.gov/capabilities/modeling>
- Bundle Browser interface: <http://www.archive.arm.gov/lassobrowser>
- E-mail list: <http://eepurl.com/bCS8s5>
- Contacts: William Gustafson and Andrew Vogelmann at [lasso@arm.gov](mailto:lasso@arm.gov)



# Science applications...

## Science Application Playlist (6 min. each)

- Reconciling chord length and cloud area distributions using LASSO data (Thijs Heus, Cleveland State U)
- Comparing LASSO shallow cloud simulations with HI-SCALE in-situ observation (Heng Xiao, PNNL)
- Challenge to evaluate 3D LES using ground-based profiling observations for shallow cumulus (Mariko Oue, Stony Brook U)
- Detectability of aerosol-cloud interactions relative to meteorological variability during LASSO (Ian Glenn, NOAA ESRL/CIRES)

# Discussion, question, and answer time for the current LASSO implementation...



# Approaching the LASSO expansion decisions...

# Guided discussion of candidate expansion scenarios...

# Scenario title



**High-level description**

**Science drivers**

**Model configuration**

**Forcing & boundary condition options**

**Evaluation data/approach**

**Potential sticking points & possible mitigations**

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# Example:

## Shallow Convection at SGP



### High-level description

Statistically representative LES of shallow convection at the SGP site

### Science drivers

NWP and climate models poorly simulate the impact of shallow convection due to their sub-grid scale and tenuous nature. LES of many ShCu cases can provide a statistically robust library to supplement observations for informing process understanding, OSSEs, and parameterization development.

### Model configuration

LES with doubly periodic LBCs;  $dx \sim 100$  m; daytime

### Forcing & boundary condition options

Observed sfc. fluxes, VARANAL, NWP analyses, data assimilation including ARM obs.

### Evaluation data/approach

TSI, ARSCL, MWR, AERlue, Raman lidar, sondes

### Potential sticking points & possible mitigations

Mishandling of cirrus: use a short model top

Regional variability (east-west gradient at SGP): try nested LES instead of periodic BCs

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# Continental Deep Convection at SGP

## High-level description

Simulating deep convection at SGP

## Science drivers

Diurnal cycle, cold pools, cloud organization, sfc temp. biases, population dynamics, non-equilibrium sfc conditions, lateral cloud-side entrainment & detrainment, w PDFs, convective triggering, shallow-to-deep transition, aerosol effects on clouds, precip. MP

## Model configuration

time dependent LBCs, domain size (MCS or smaller?); need  $dx=200$  m for transitions, entrainment needs higher res.; ice MP; multiday/full diurnal cycle

## Forcing & boundary condition options

MSDA w/ ARM data; HRRR; soil model that assimilates ARM soil obs.

## Evaluation data/approach

ARM radar, precip., NEXRAD, RWP, new GOES, lidar for cold pool & updraft, sfc radiation, polarimetry radar (HIDs); thermodynamic profiles at wider radius than BFs

## Potential sticking points & possible mitigations

convection develops upstream of ARM obs, probability of passing by SGP, forcing & convection not independent/population dynamics, precip can complicate many measurements, compromise of res. vs. domain size, competition HRRR

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# Marine Boundary Layer Clouds at ENA

## High-level description

Simulate marine boundary layer clouds

## Science drivers

Drizzle properties & evaporation, aerosol-cloud interactions, StCu evolution & lateral entrainment, population selection between met. regimes (cloud outbreaks, StCu-Cu transitions), island effects (internal gravity waves), contrast to continental ShCu at SGP, diurnal cycle, higher order moments for PBL schemes

## Model configuration

high vertical resolution near cloud top, day & night to get nighttime precip.,

Option 1: heterogeneous sfc with island (time-dependent LBCs)

Option 2: only over ocean (periodic)

Option 3: Lagrangian a couple times a day

Possibly restrict to conducive upstream conditions (island and/or synoptic)

## Forcing & boundary condition options

ECMWF gridded data or DDH (IFS does not see Ascension but have Graciosa); VARANAL is an option with some modifications (will be done for ACE-ENA); satellite or NWP SSTs

## Evaluation data/approach

SST fluxes, Doppler lidar, MWR, XSAPR and other radars, Raman lidar, AOS at site and UAVs

## Potential sticking points & possible mitigations

island effects, wind direction dependence; ARM needs a buoy for SST; desire SST fluxes and spatial variability

# Arctic clouds at [NSA and/or MOSAiC]

## High-level description

Mixed phase clouds & PBL/lower atm evolution; clear sky and cloudy sky for MOSAiC; aerosol-cloud interactions. Changing Arctic climate driver.

## Science drivers

transition of cloud state, understanding cloud & aerosol layering, St/sensitivity to higher cloud forcing with LW forcing. Campaign planning [advance sims]

## Model configuration

need to look into appropriate dz and SGS, variation of sfc albedo and roughness, interactive sea ice? MOSAiC stepping stone → NSA (easier than Barrow).

## Forcing & boundary condition options

more reliant on sondes and in situ measurements due to less reliable reanalyses

## Evaluation data/approach

Needs ARM VAP on MP phase/speciation, MWR phase VAP no longer avail but could be restarted; retrievals of snowfall from cloud soon to be available. More in-cloud micro obs. Sensitivity of microphysics parameters. Can we “toggle” the config between clear/cloud settings?

## Potential sticking points & possible mitigations

land-ocean-ice contrast (NSA); risk of MOSAiC having good data; obs of mixed phase clouds are difficult to interpret; LES of mixed phase clouds are more problematic than warm clouds (but could be a driver)—maybe do initial phased approach & survey community of existing Arctic modelers; very stable conditions not necessarily compatible with SGS models; initiation of model and long cloud memory

# Dry Convection / Stable BL at SGP

High-level description

Science drivers

Model configuration

Forcing & boundary condition options

Evaluation data/approach

Potential sticking points & possible mitigations

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# Scenario title

## High-level description

Multiple convection types/regimes at SGP (e.g. tied to field campaigns)  
LASSO IOP with AMF deployments  
Interactive surface for land/sea ice—gradients for land-ocean-sea—add value to NWP that way  
Tropical deep convection, e.g., GoAmazon, TWP  
MARCUS in Southern Ocean  
GPCI / MAGIC region  
Katabatic winds over Greenland/Iceland/AWARE and impact on net snowfall

## Science drivers

## Model configuration

## Forcing & boundary condition options

## Evaluation data/approach

## Potential sticking points & possible mitigations

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# Scenario title



**High-level description**

**Science drivers**

**Model configuration**

**Forcing & boundary condition options**

**Evaluation data/approach**

**Potential sticking points & possible mitigations**

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# Session summary & action items

**Extra slides...**

# Observations recommended for data bundles

		Readiness at Locations				
Physical Process Category	Hourly Observation	CF	IF	BF	EF	Meso
<b>Boundary layer state</b>	Surface temperature	1	3	3	3	3
	Surface water vapor mixing ratio	1	3	3	3	3
	Surface relative humidity	1	3	3	3	3
	Radiosonde soundings (4x daily)	1				
	Mid-boundary layer temperature	2			3	
	Mid-boundary layer mixing ratio	2			3	
	Mid-boundary layer relative humidity	2			3	
	Full boundary layer thermodynamic profile	3				
	Lifting condensation level	1	1	1	1	1
	Planetary boundary layer height	3	3			
	Boundary layer vertical velocity	3			3	
	Inversion strength	3				
	Inversion wind shear	3			3	
<b>Cloud characteristics</b>	Low-cloud fraction from ARSCL	1				
	Time-height cloud frequency from ARSCL	1				
	Cloud fraction from TSI	1				
	Regional cloud fraction from Doppler lidar	3			3	
	Liquid water path	2			2	
	Cloud-base height	2			2	
<b>Meteorological forcing</b>	ARM Variational Analysis with sensible and latent heat fluxes	1	Spatial scales: 300 km			
	ECMWF forcing for multiple spatial scales	1	16, 114, 413 km			
	MSDA forcing for multiple spatial scales	2&3	75, 150, 300 km			

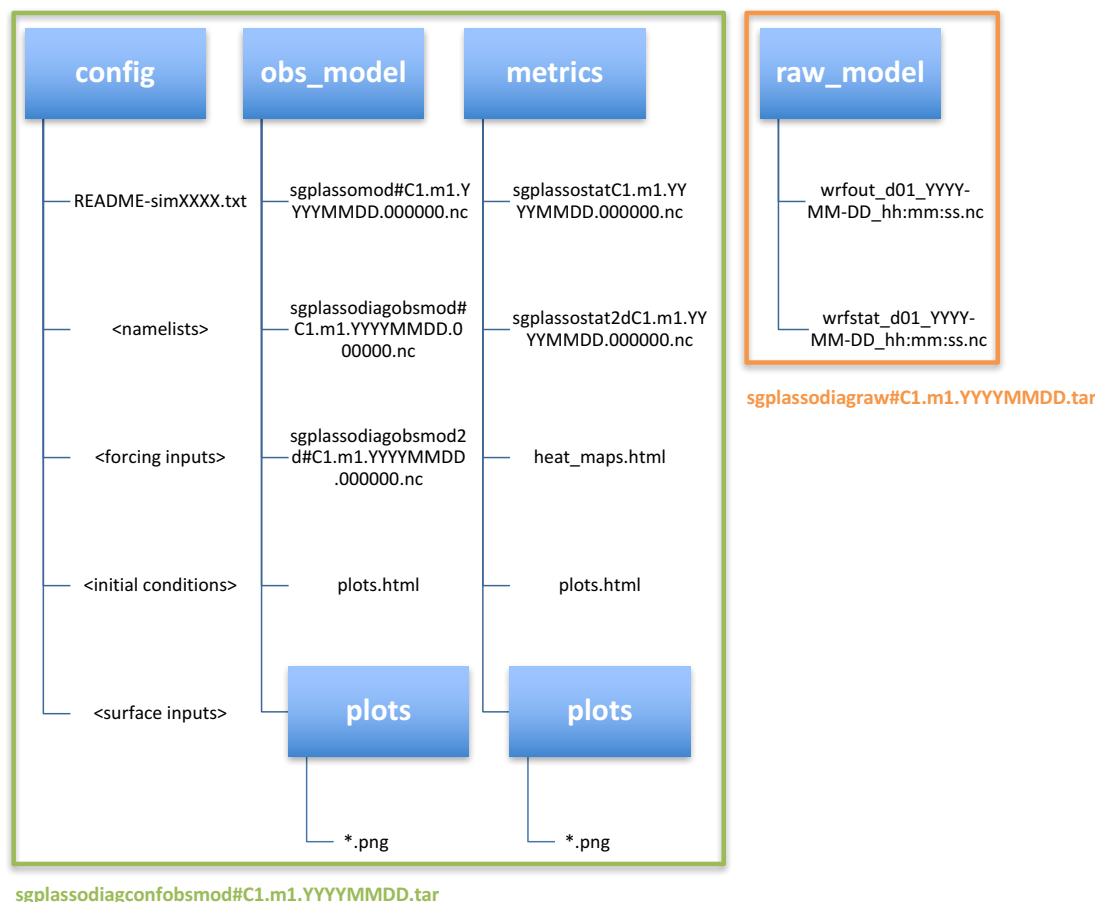
## Readiness Levels

**1** = Available observations implemented in the data bundles

**2** = Partially implemented observations

**3** = Implies aspirational observations

# Data bundles for easing data digestion



## Configuration-observation-model tarball

- ▶ Model config. & inputs
- ▶ Hourly observations & concurrent, subsetted model output
- ▶ Diagnostic plots & skill scores

## Raw model output tarball

- ▶ 10 min. output frequency
- ▶ Instantaneous domain snapshots
- ▶ Time and domain-averaged statistics, e.g.  $w'w'$
- ▶ Time-averaged column statistics

# http://archive.arm.gov/lassobrowser



## DATA DISCOVERY

LESSO BUNDLE BROWSER - VISUALIZATION & ACCESS

DATA DISCOVERY // LESSO HOME // ARM ARCHIVE // HELP // FEEDBACK

### Introduction

Welcome to the LESSO Bundle Browser that is designed to assist users with identifying LESSO large-eddy simulations (LES) of interest for their research. The plots and associated data table update dynamically based on user search criteria, and links within the table enable direct access to order the data bundles of the displayed simulations. More information on LESSO and the data bundles can be found at the [LESSO home page](#) and on the [Alpha 1 Release web page](#). Note that this is an initial evaluation version of the browser that specifically queries and displays observed and simulated cloud properties for the five days worth of simulations released in the LESSO Alpha 1 release. There are 192 simulations between the five days that differ in terms of the LES model, forcing dataset, domain size, and model physics.

Select All

- Date
- Measurements
- Model Type
- Output Domain Size
- Number of Levels
- Large Scale Forcing
- Large Scale Forcing Scale
- Initial Condition
- Surface Treatment
- Microphysics

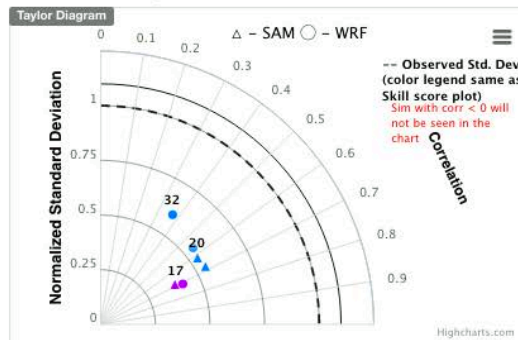
Submit

### Overview Plots

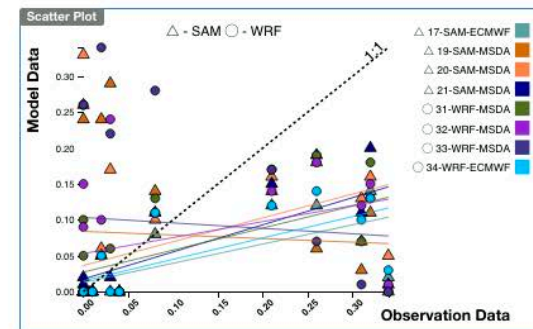
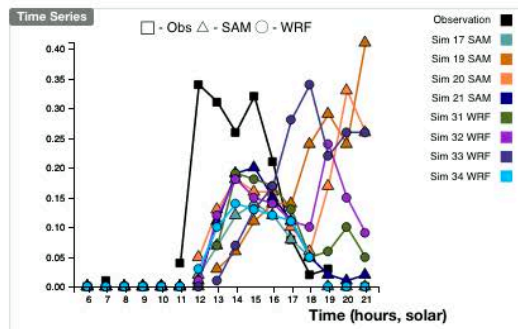
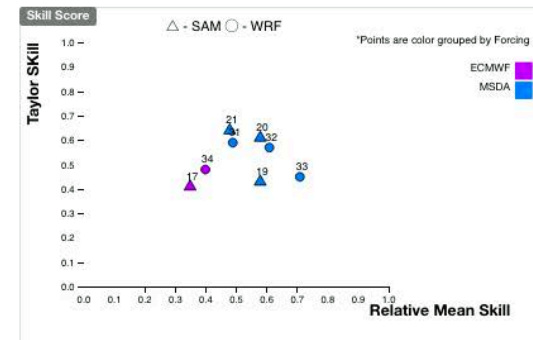
Heat Maps

Metrics

Date: June 9, 2015



Measurement: Cloud Fraction TSI



### Skill Scores on June 9, 2015

Measurement Skill



1D Cloud Skill



Copy CSV Print PDF

Search:

Simulation ID	Measurement Skill (Cloud Fraction TSI)	1D Cloud Skill	2D Cloud Mask Skill	Total Cloud Skill
17 (Diagnostics) (Data)	0.38	0.5	0.23	0.34
19 (Diagnostics) (Data)	0.5	0.47	0.26	0.35
20 (Diagnostics) (Data)	0.6	0.67	0.28	0.43



# LASSO employs an ensemble of forcings to capture the range of possible conditions

Large-scale forcing datasets generated from 3 sources

- Variational Analysis: ARM product, 300 km spatial scale
- ECMWF IFS model: ~16, 115, & 413 km spatial scales
- Multiscale Data Assimilation (MSDA): 75, 150, & 300 km scales; can directly incorporate ARM observations into the analysis
  - ▶ Hybrid AERI + Raman Lidar temperature profiles
  - ▶ Raman Lidar water vapor profiles
  - ▶ RWP wind profiles
  - ▶ Surface meteorology

