

# The Data Assimilation Research Testbed: A Community Facility for Ensemble Data Assimilation

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# Overview of Data Assimilation

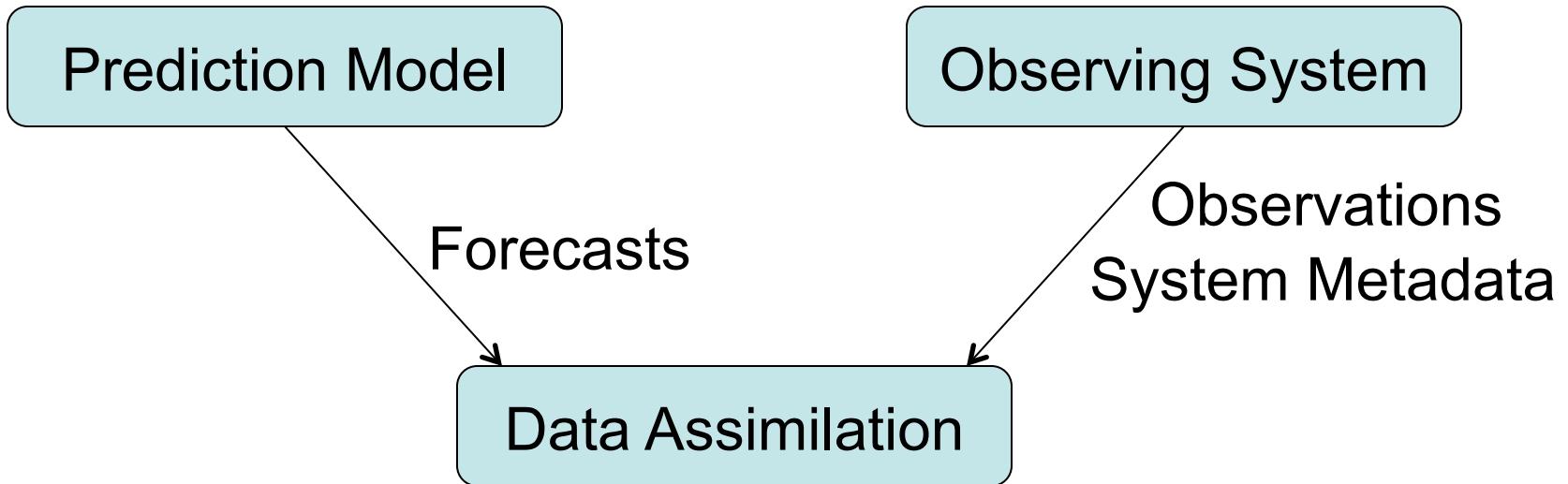
Prediction Model

# Overview of Data Assimilation

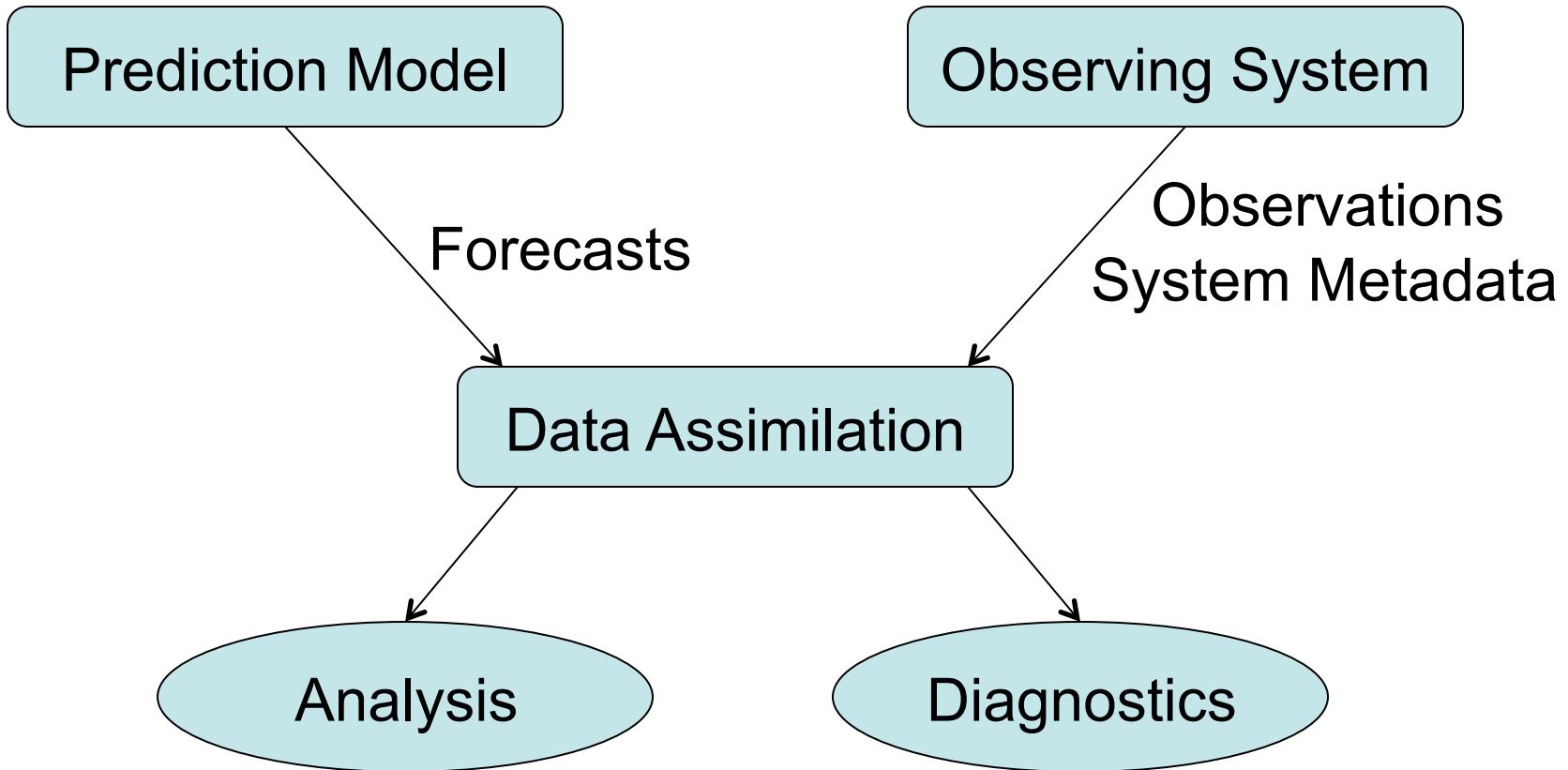
Prediction Model

Observing System

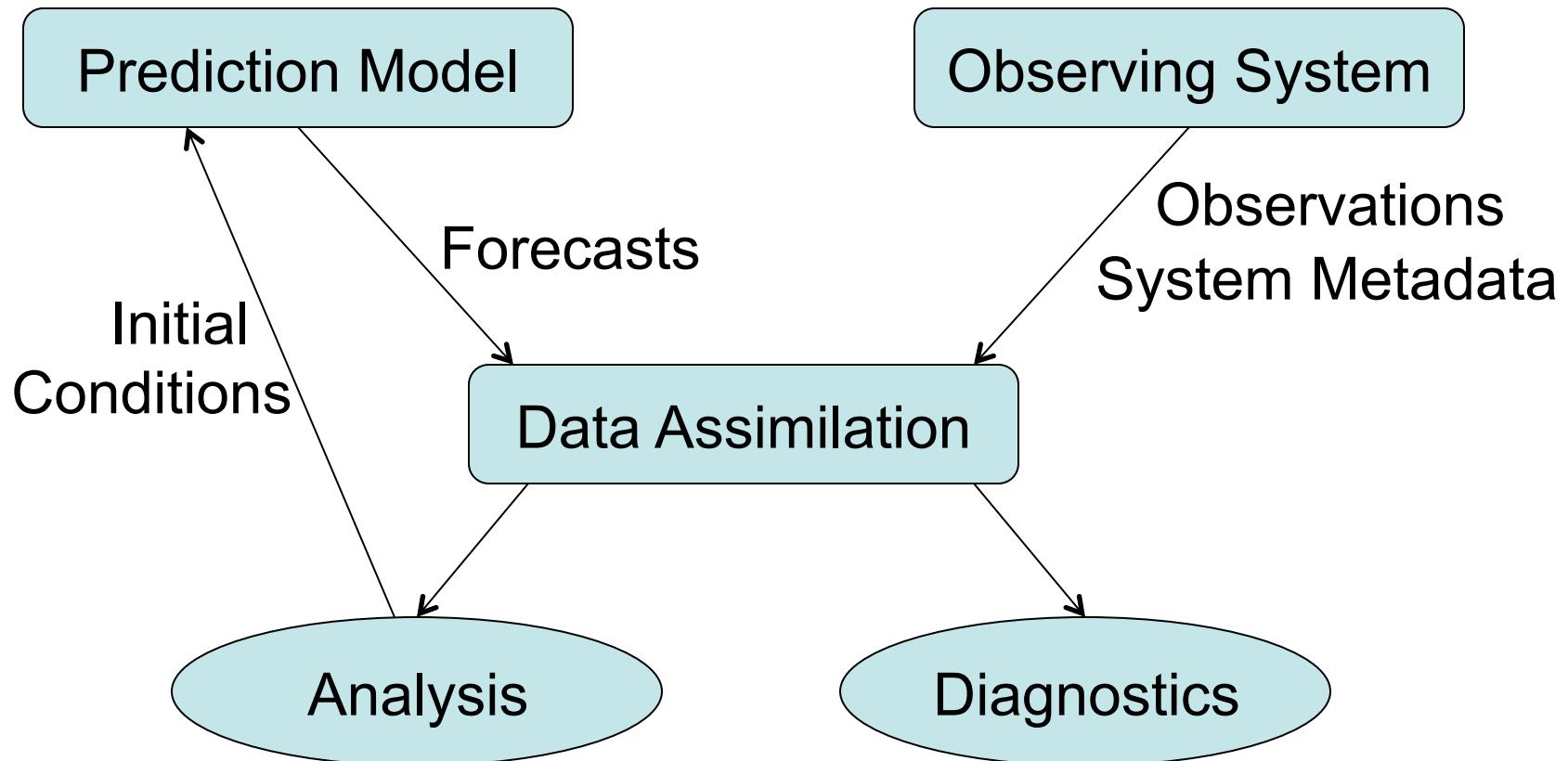
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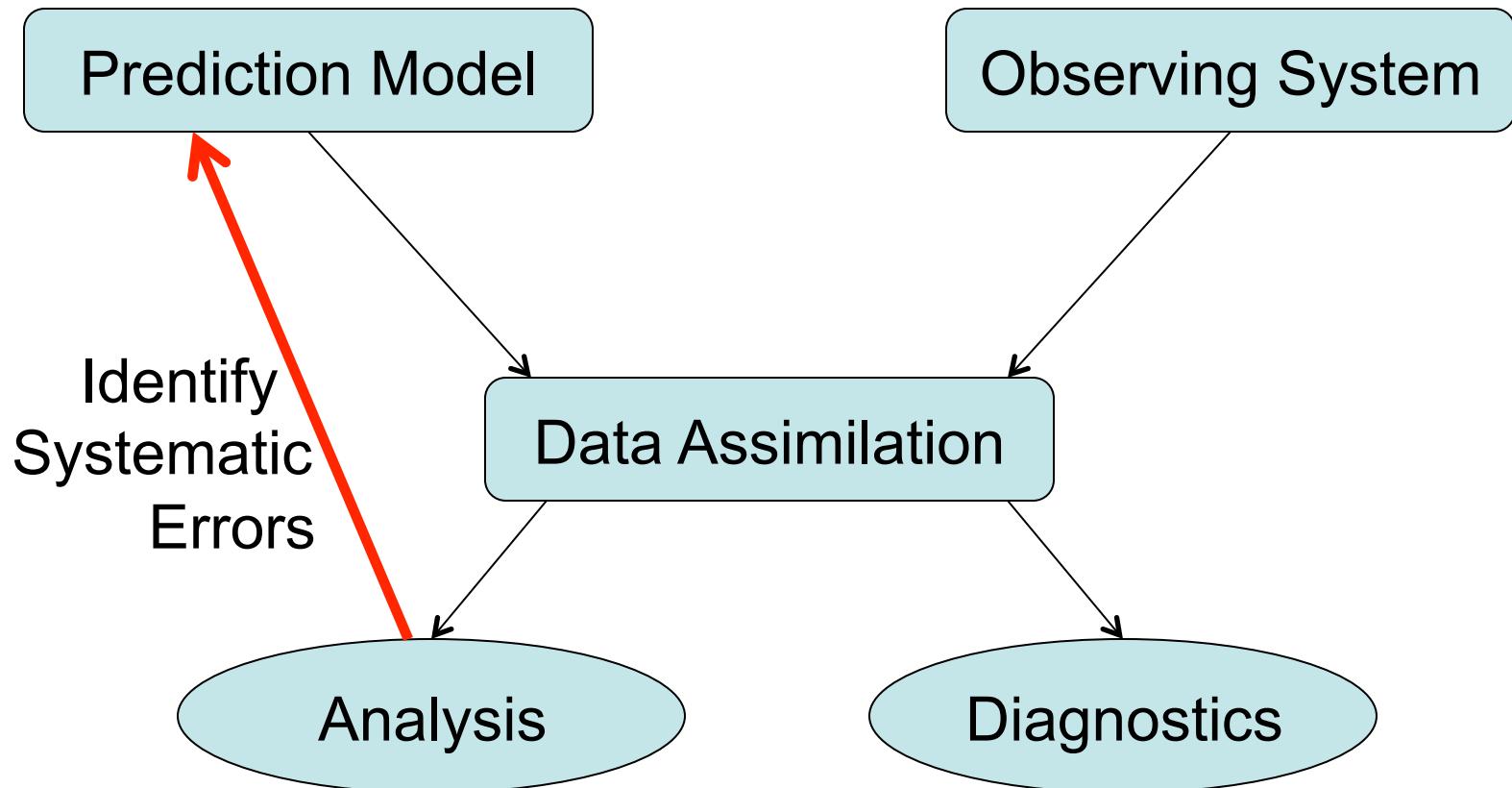
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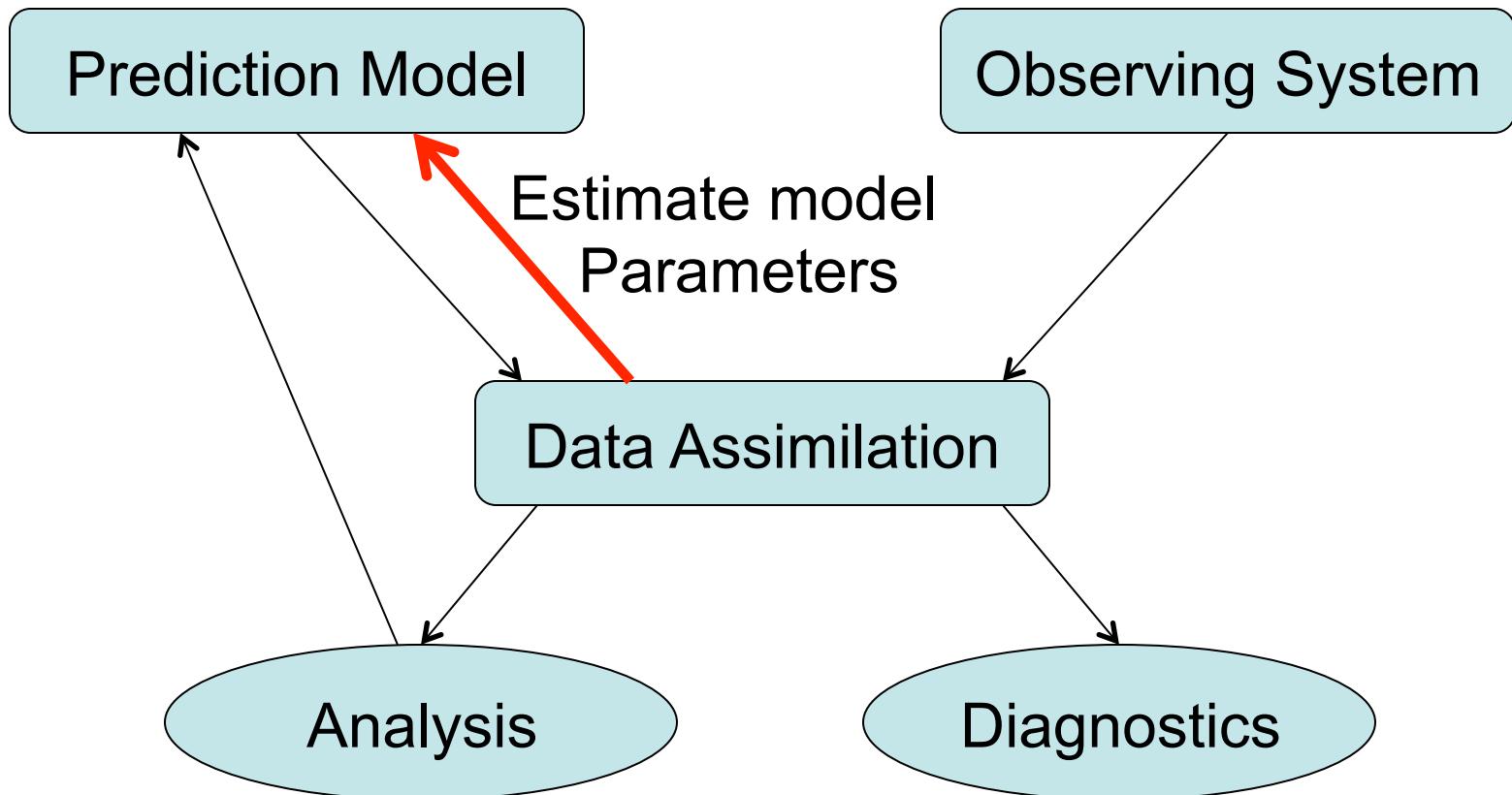
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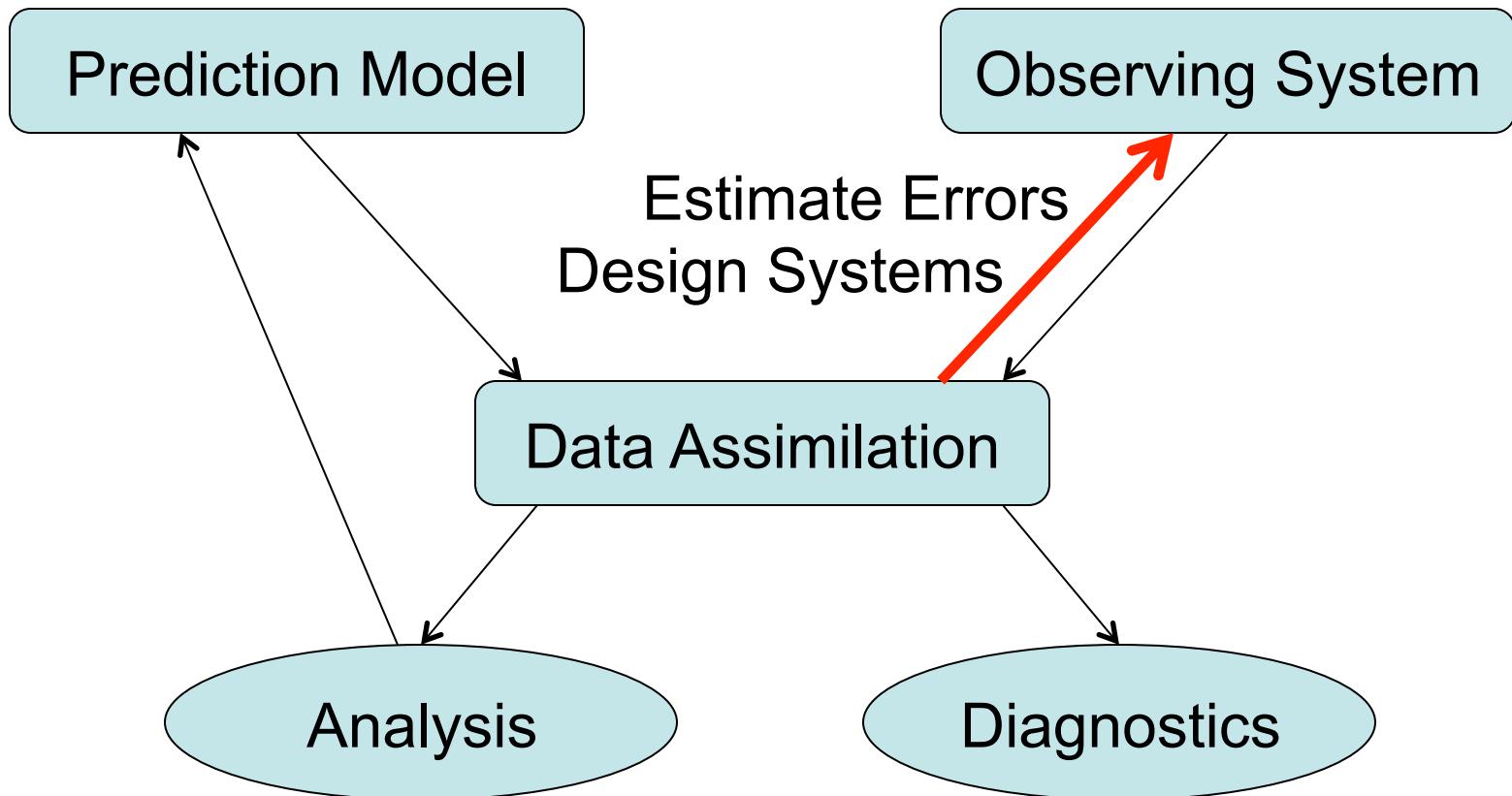
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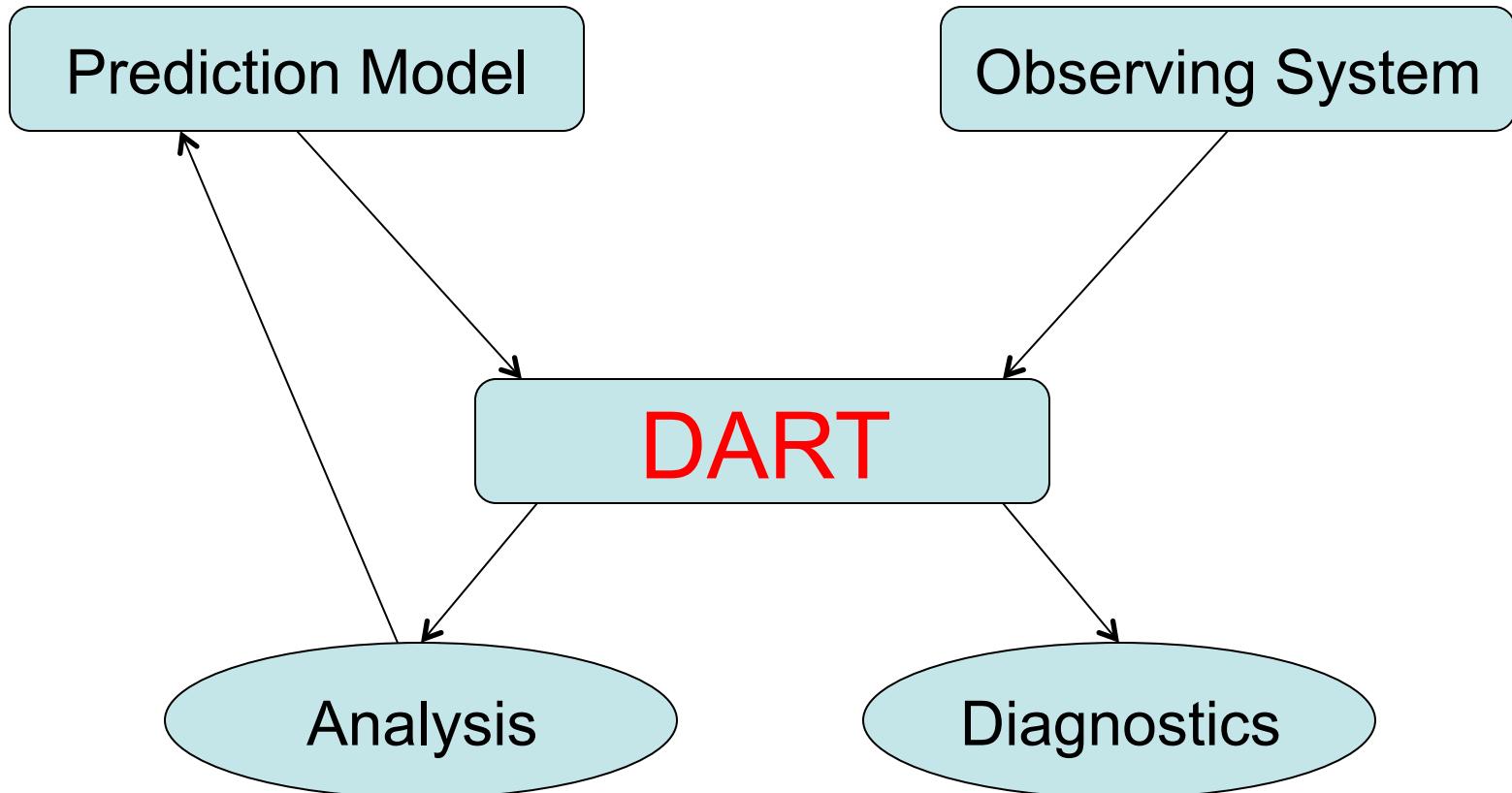
# Overview of Data Assimilation



# Overview of Data Assimilation



# Data Assimilation Research Testbed (DART)

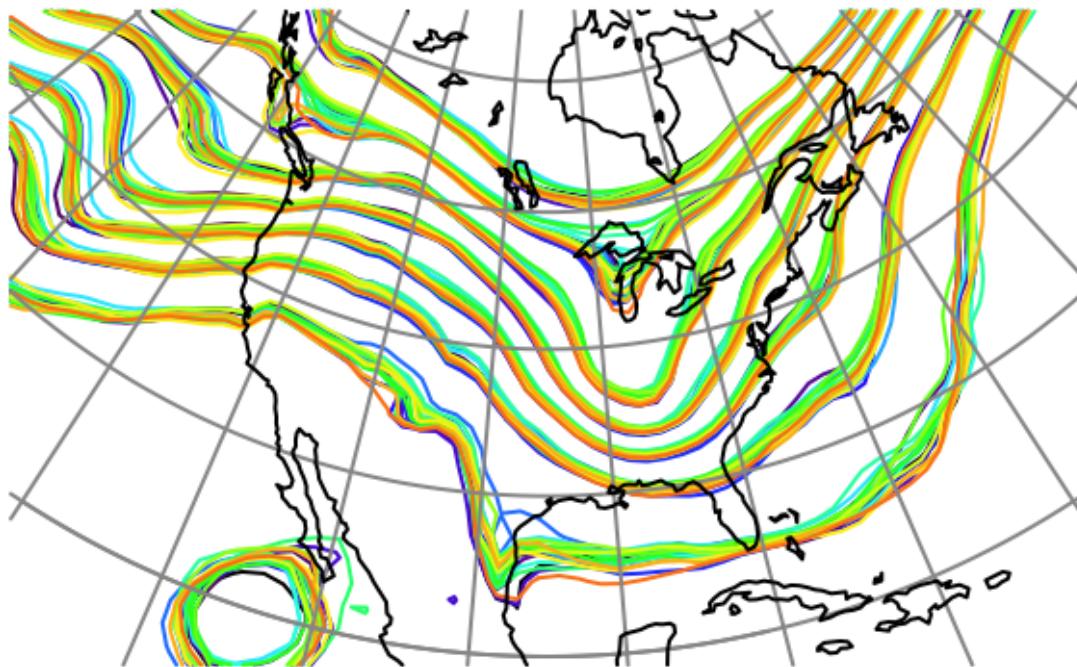


DART is a community ensemble assimilation facility.

# What is Ensemble Data Assimilation?

Use an ensemble (set) of model forecasts.

Use sample statistics to get covariance between state and observations.





## Public domain software for Data Assimilation

- Well-tested, portable, extensible, free!

## Models

- Toy to HUGE

## Observations

- Real, synthetic, novel

## An extensive Tutorial

- With examples, exercises, explanations

## People: The DARES Team



Earth Cube, 17 Dec. 2012

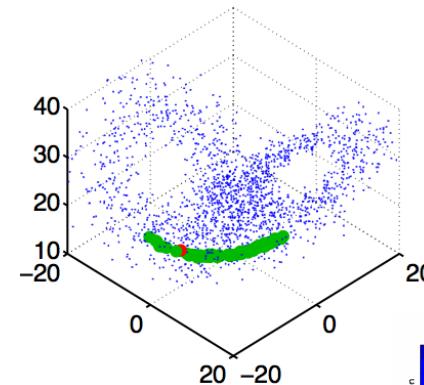
# DART is used at:

48 UCAR member universities  
More than 100 other sites





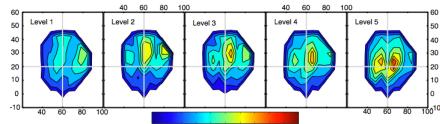
DART is:



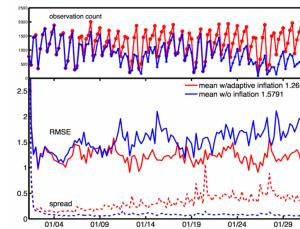
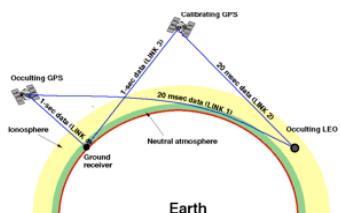
## Education



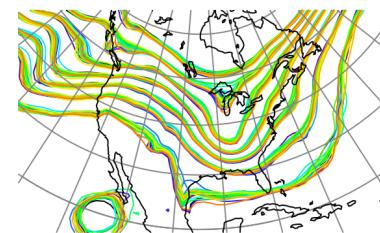
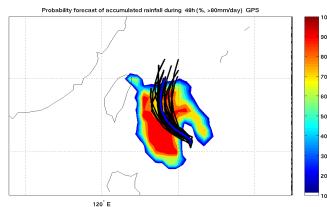
## Exploration



## Research



## Operations



# DART works with many geophysical models

## Global Atmosphere models:

CAM	Community Atmosphere Model; (all 3 dynamical cores)	NCAR
CAM/CHEM	CAM with Chemistry	NCAR
WACCM	Whole Atmosphere Community Climate Model	NCAR
AM2	Atmosphere Model 2	NOAA/GFDL
NOGAPS	Navy Operational Global Atmospheric Prediction System	US Navy
ECHAM	European Centre Hamburg Model	Hamburg
Planet WRF	Global version of WRF	JPL
MPAS	Model for Prediction Across Scales	NCAR/DOE



# DART works with many geophysical models

## Regional Atmosphere models:

WRF/ARW	Weather Research and Forecast Model	NCAR
WRF/CHEM	WRF with Chemistry	NCAR
NCOMMAS	Collaborative Model for Multiscale Atmospheric Simulation	NOAA/NSSL
COAMPS	Coupled Ocean/Atmosphere Mesoscale Prediction System	US Navy
CMAQ	Community Multi-scale Air Quality	EPA
COSMO	Consortium for Small-Scale Modeling	DWD

# DART works with many geophysical models

## Ocean models:

POP  
MIT OGCM

Parallel Ocean Program  
Ocean General Circulation  
Model

DOE/NCAR  
MIT

ROMS

Regional Ocean Modeling  
System (under development)

Rutgers

MPAS

Model for Prediction Across  
Scales (Under development)

DOE/LANL

# DART works with many geophysical models

## Upper Atmosphere/Space Weather models:

ROSE  
TieGCM

Thermosphere Ionosphere  
Electrodynamic GCM  
Global Ionosphere  
Thermosphere Model  
Dynamo/sunspot model

NCAR  
NCAR/HAO

GITM

Solar Dynamo

Michigan  
NCAR/HAO

# DART works with many geophysical models

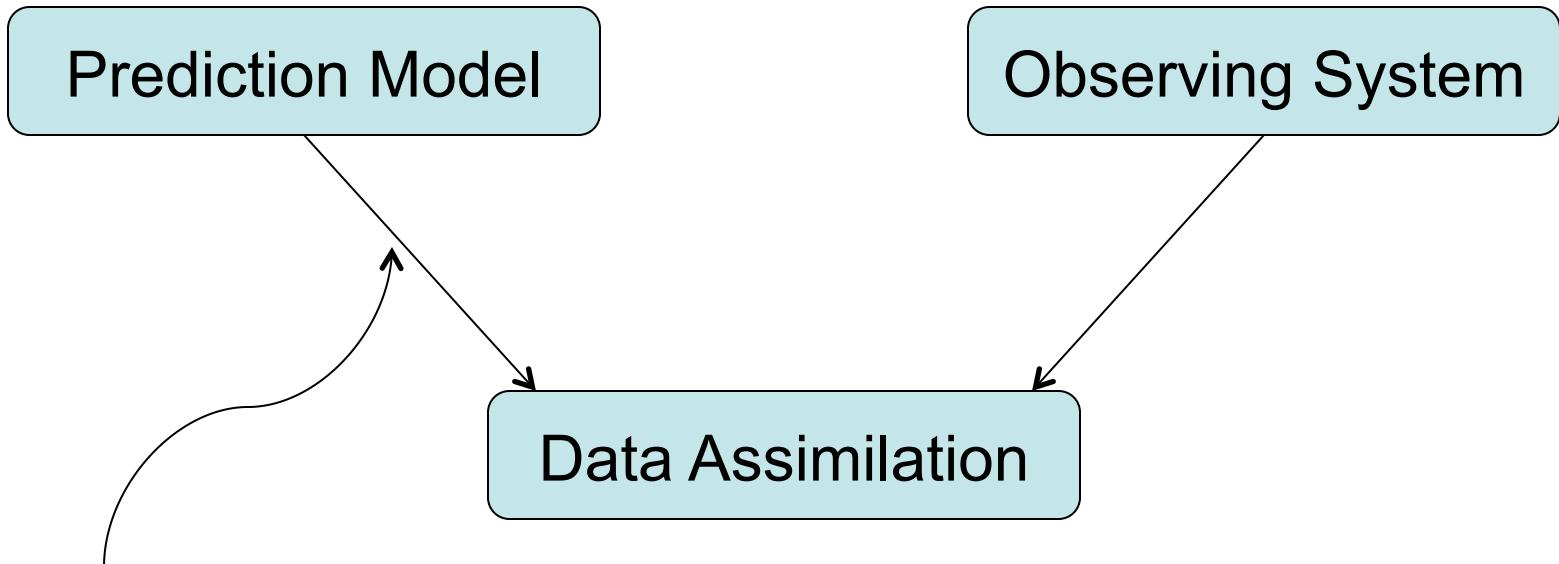
## Land Surface models:

CLM  
NOAH

Community Land Model  
Relatively simple land model

NCAR  
Community

# Model Forecast Data Formats in DART



Model state output files.  
Many (not all) are NetCDF.  
Various metadata conventions.

Standardization would ease implementation.

# DART users work with many observational datasets

## Atmosphere Observations (1):

U,V,T,Q	NCEP: Radiosonde, AIRCRAFT (commercial), ACARS	BUFR
U,V	NCEP: Cloud Drift Winds from satellite	BUFR
U,V (ocean surface)	QUIKSCAT, including L2B (JPL)	HDF-4
T,Q,refractivity of the atmosphere	COSMIC Global Positioning Satellite radio occultation	NetCDF
T,Q,Tsurface	AIRS from Aqua/A-train satellite	HDF-4, HDF-EOS
U,V,T,Q,T, surface,pressure,altimeter	MADIS: ACARS, Marine and MESONET surface, METAR, radiosonde, satellite wind	NetCDF
Radar reflectivity, radial velocity	NCEP	Level2 (binary)

# DART users work with many observational datasets

## Atmosphere Observations (2):

U,V	MADIS; Wind Profilers, Atmospheric Motion Vectors (AMVs)	NetCDF, ASCII Text
U,V,T,Q,altimeter	OK mesonet (U. OK)	ASCII Text
Cloud Liquid Water Path, Cloud Top and Base Pressures	GOES satellite, CIMSS	NetCDF
U,V	SSEC (U Wisconsin): Cloud Drift Winds from satellite	ASCII Text
CO (carbon monoxide)	MOPITT	HDF
U,V	GOES CIMSS (U. WI); rapid-scan AMVs (Atmospheric Motion Vectors), satellite cloud winds	CIMSS ASCII

# DART users work with many observational datasets

## Atmosphere Observations (3):

T,Q,Total Precipitable Water	GOES CIMSS hyperspectral AIRS IR	CIMSS ASCII
Total Precipitable Water	AMSR, MODIS Microwave	ASCII Text
U,V	Operational typhoon bogus winds, Taiwan Central Weather Bureau	ASCII Text
U,V (at wind turbine hub height)	Seimens(?)	?
Electron density	COSMIC/FORMOSAT-3	LDM (UCAR/Unidata)
U,V,T	GTS	little-r
Chemical concentrations	IASI on EUMETSAT Polar System MetOp satellite	converted to ASCII intermediate format
Aerosol optical depth (AOD)	TERA and AQUA	HDF

DART users work with many observational datasets

## Solar, Space Weather, Extraterrestrial Observations:

Radiances, Occultation on Mars	TES, limb sounder on Mars	?
Density, ion concentrations	CHAMP	NetCDF
Thermospheric Mass Densities	CHAMP, GRACE	NetCDF
Electron densities	COSMIC	NetCDF
Total Electron Density	Garner GPS Archive	RINEX
Orbital element information	NORAD	ASCII
Solar Magnetic Fields	Wilcox, Mt Wilson, National Solar Observatories	?
Rotational, Meridional Circulation	Mt Wilson, SoHO, SDO, HMI	?

DART users work with many observational datasets

### Ocean Observations:

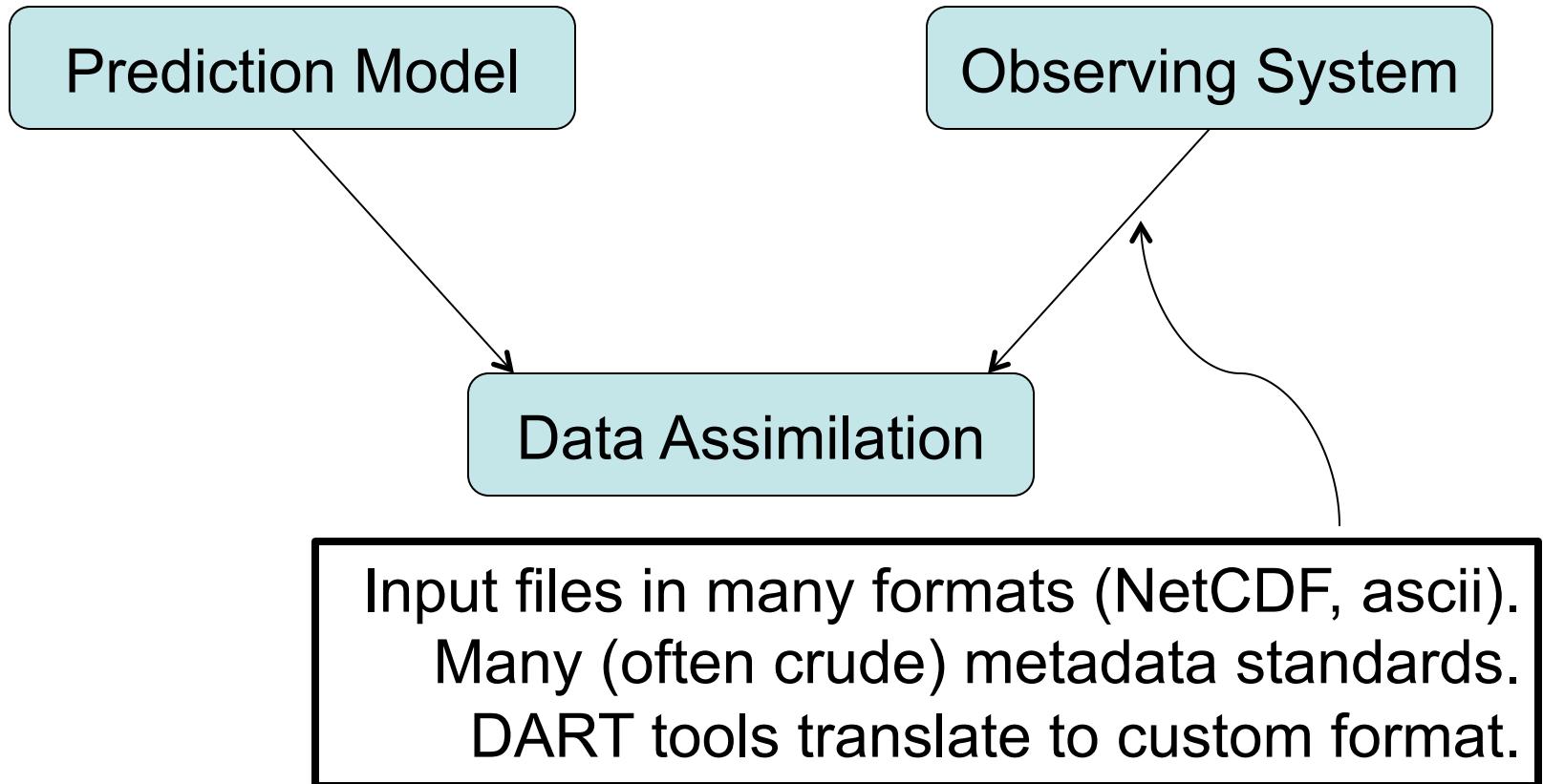
T,Salinity	World Ocean Database: Argo floats, CTD(ships), XBT,moored thermistors, drifting buoys(GT-SPP)	packed ASCII
Surface U,V currents	CODAR	ASCII Text

DART users work with many observational datasets

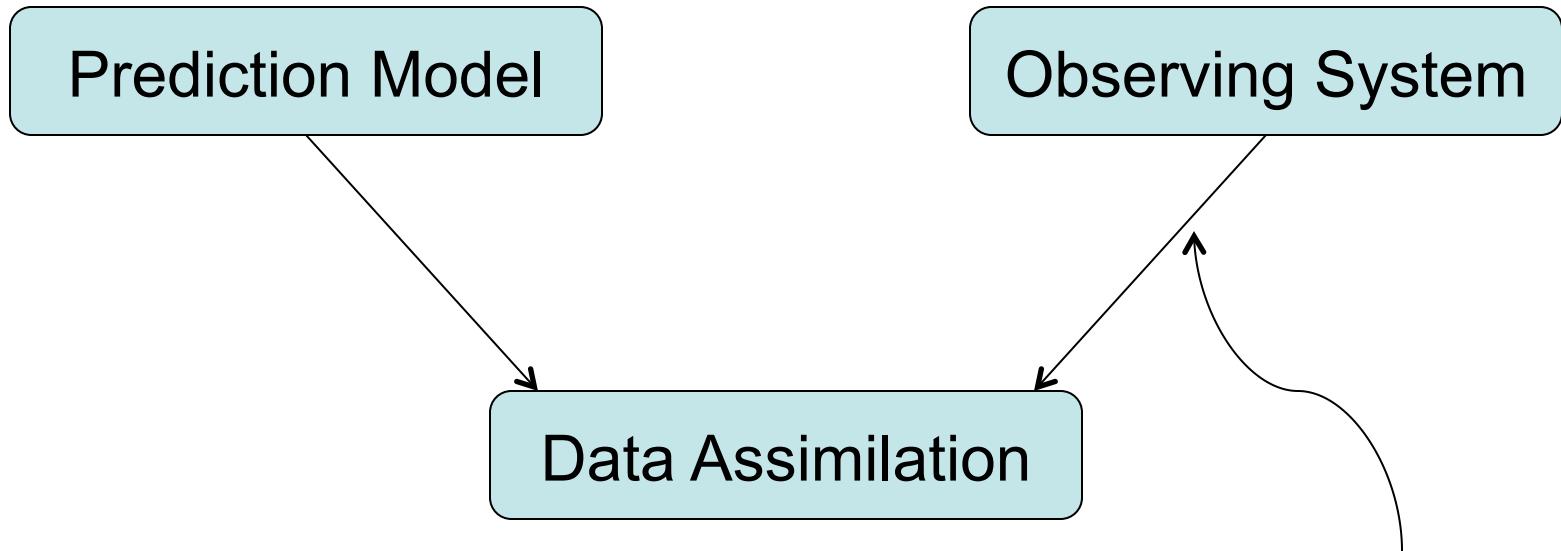
### Land Observations:

Snow cover	MODIS	HDF
Heat Flux, Net Carbon	Ameriflux tower network	ASCII Text
Soil Moisture	COSMOS (neutron counter)	ASCII Text

# Observation Data Formats in DART

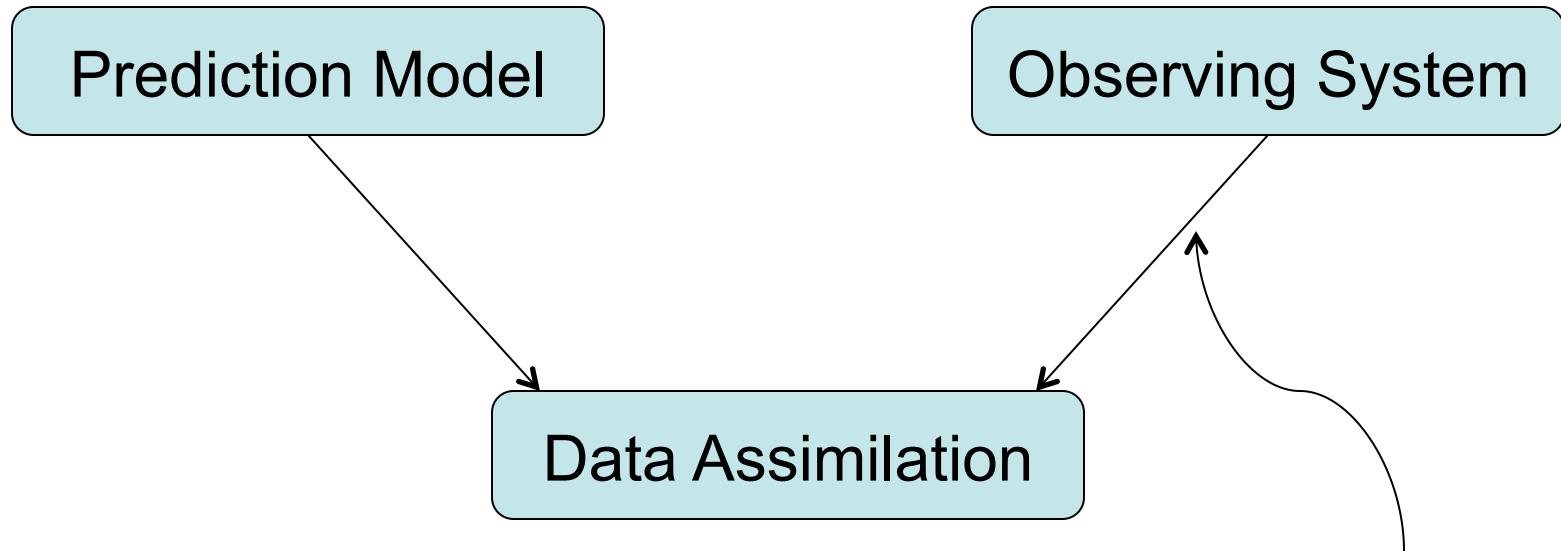


# Observation Data Formats in DART



Often do additional ‘pre-processing’ to observation files.  
Quality control, thinning, super-observations.  
No mechanism to record these operations in metadata.

# Observation Data Formats in DART



Great need for standardized file formats and metadata.

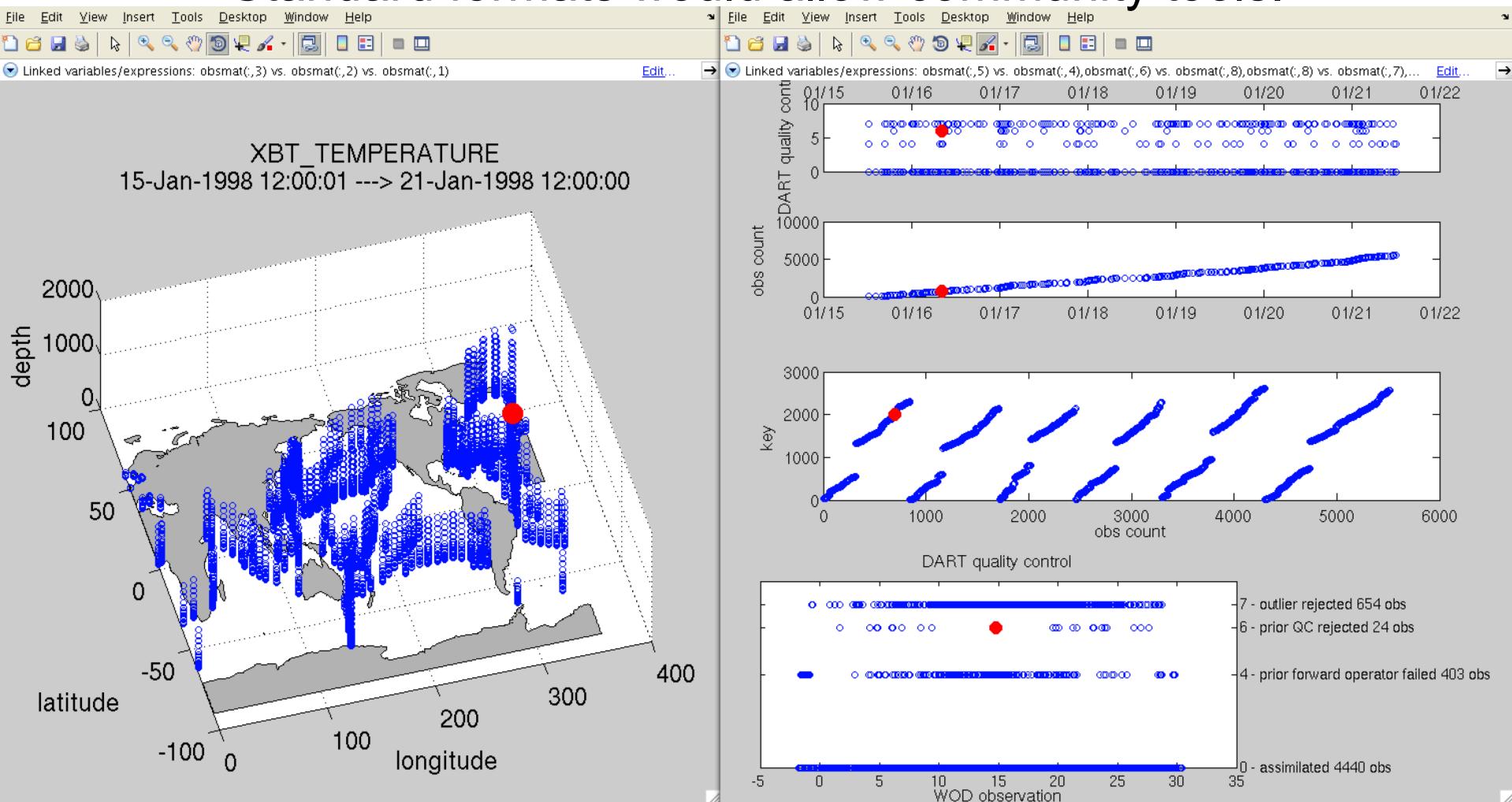
**Need to record complete provenance of data.**

Be able to recreate the data generation from file info.

DART observation space output just one more process.

# DART Observation Visualization/Diagnostic Tools

## Standard formats would allow community tools.



# Summary

DART enables DA for diverse geophysical models:

- Most output is NetCDF,

- Need coordinated metadata standard.

DART users assimilate diverse observations:

- Data is in many formats,

- Standardized format would enable easier DA,

- Need coordinated metadata standard,

- Complete file provenance would facilitate science.

# Learn more about DART at:



<http://www.image.ucar.edu/DARes/DART/>

Anderson, J., Hoar, T., Raeder, K., Liu, H., Collins, N., Torn, R., Arellano, A.,  
2009: *The Data Assimilation Research Testbed: A community facility.*  
BAMS, **90**, 1283—1296, doi: 10.1175/2009BAMS2618.1