



South East European Virtual Climate Change Center

# Dust modeling problems and uncertainties impacts and case studies

Goran Pejanović

Assistant director

Republic Hydrometeorological Service of Serbia  
(host of the SEEVCCC)

34% of the Earth's land surface is dry, home to two billion people exposed daily to the major sources of windblown dust circling the globe

[WWW.SEEVCCC.RS](http://WWW.SEEVCCC.RS)

# Importance of dust modeling - impacts

Mineral dust is recognized as major part of global aerosol mass, but with short residence time in the atmosphere (Kinne et al., 2006).

Including mineral dust transport and corresponding impacts in numerical models can improve accuracy of weather forecasts and climate simulations and also contribute to understand processes caused by mineral dust.

Impact on radiation budget:

Airborne dust changes Earth's radiation budget (modify incoming solar radiation and the outgoing infrared radiation) and consequently the atmospheric dynamics (Perez et al. 2006). Example: case study over Bodélé depression that radiative impact of high dust loadings resulted in a reduction in surface daytime maximum temperature around 7°C (Todd et al. 2007).

Impact on cloud ice nucleation:

Dust aerosol plays important role on climate and environment through its impact on the heterogeneous ice nucleation. Klein et al. (2010) found out that mineral dust is a dominant constituent in the ice nucleating process, observing coincidence of peaks in ice nuclei numbers and dust concentration originating from a major Saharan dust intrusions into Europe.

Impact on ocean productivity:

Dust deposited over remote ocean regions after long-term atmospheric transport can be important nutrient for the marine life. Iron, phosphorus and silicates embedded in dust are considered as major potential micronutrients for the ecosystems in remote oceans. Singh et al. (2008) showed that dust deposition over Arabian Sea several days later causes chlorophyll blooming. Cooling of the ocean surface is also noticed along with higher ocean wind speeds during dust events, which can lead to favorable conditions for blooming.

Impact on health:

Airborne dust can significantly influence human health near and also far from source region. Middleton et al. (2008) observed an increased risk of hospitalization on dust storm days. Liu et al. (2009) estimated impacts of inter-continental transport of aerosols on premature mortality and found that nearly 380 thousands premature deaths per year globally associated with exposure to fine aerosols which dominant component is dust transported inter-continently. Meningococcal (epidemic) meningitis in Sahel, one of the most serious diseases in Africa, has rapid start and high mortality and morbidity rate, and is highly correlated with dusty weather season. How dust eventually triggers the meningitis epidemics remains yet unclear.

Behavior of air borne dust in its interaction with the environment is to a large extent determined by mineral composition of dust particles.

# Problems in dust modeling and model verification - examples

## Sources:

How to define properly dust source?

Necessary is to know land cover and soil texture. Source is region where ground is bare and contain soil particles available for uplift, which depends on soil moisture.

For large dust sources (deserts, such is Sahara) – not enough knowledge about soil texture. In recent years problem is tried to overcome with “preferential source” approach.

For areas with smaller scattered dust sources (South West America) problem is seasonal change of vegetation and needs regular update of land cover information.

## Emission and deposition:

How to properly parameterize?

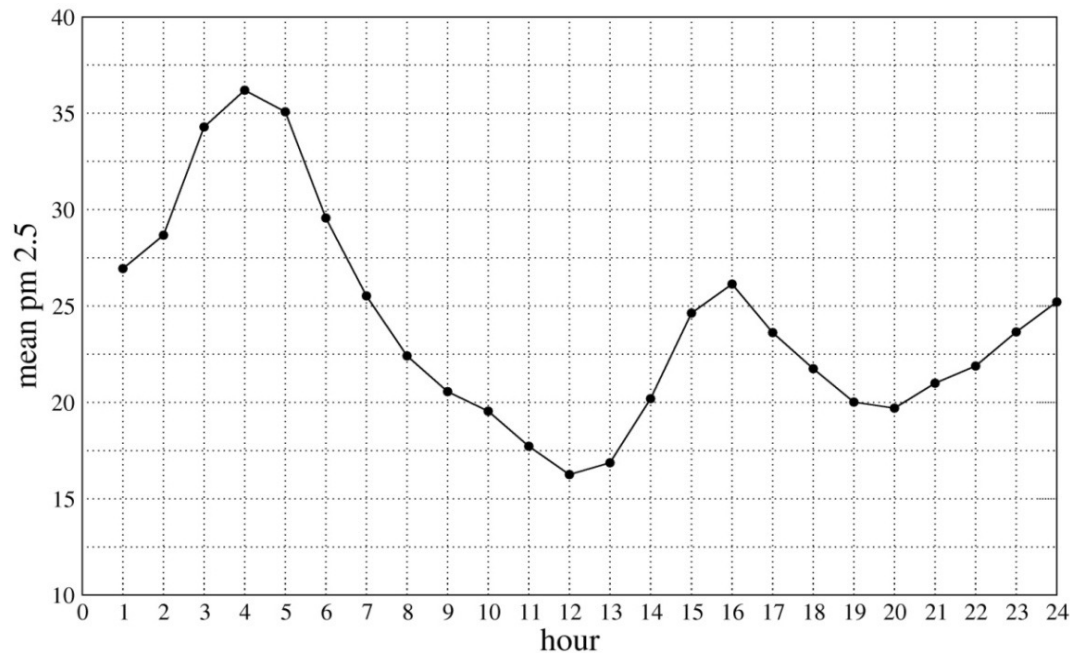
Models use different approaches for emission scheme.

## Verification and intercomparison of models:

Not enough measurements. If observations of pm are in urban areas, it is hard to exclude “man-made” pollution signal.

Models differ in dust related parameterisation schemes, definition of sources, number and size of dust particle nodes, which can influence intercomparison and reason for difference in results is hard to detect.

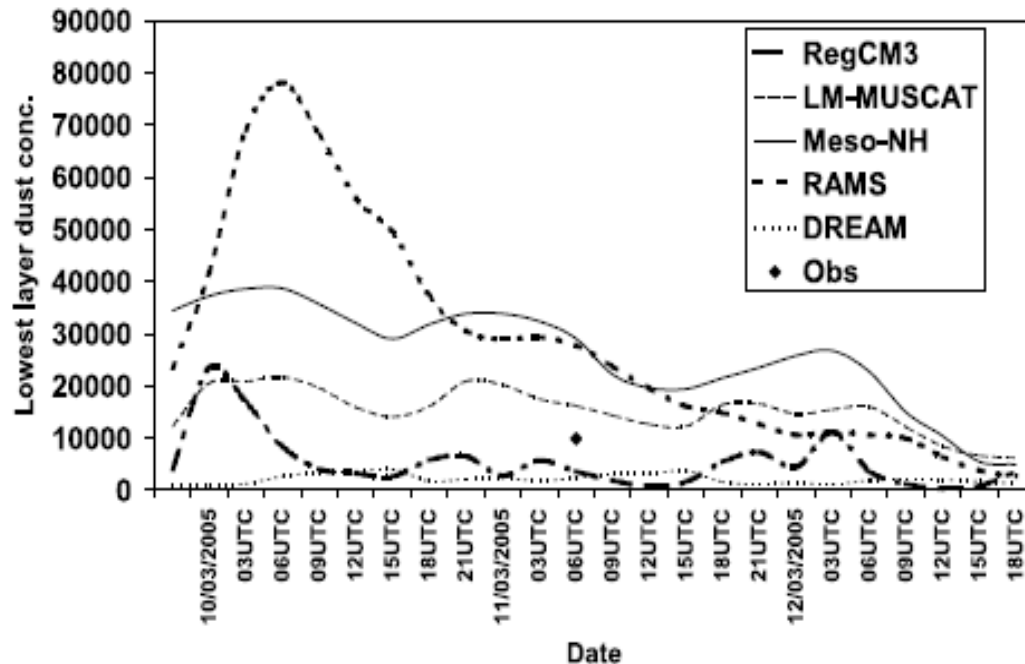




Problem with pm measurements:

Mean hourly values of PM<sub>2.5</sub> in one of AIRNow stations in El Paso, obtained from measured values in period Dec 1<sup>st</sup> 2009 – Sep 30<sup>th</sup> 2010 (hour in UTC)

peaks coincide with traffic peaks



Time series of model simulated dust concentration in model lowest layer at Bodele depression, Chad

Todd et al., (2008) showed that five inter-compared dust models differed by an order of magnitude or more in their simulations of surface concentration.

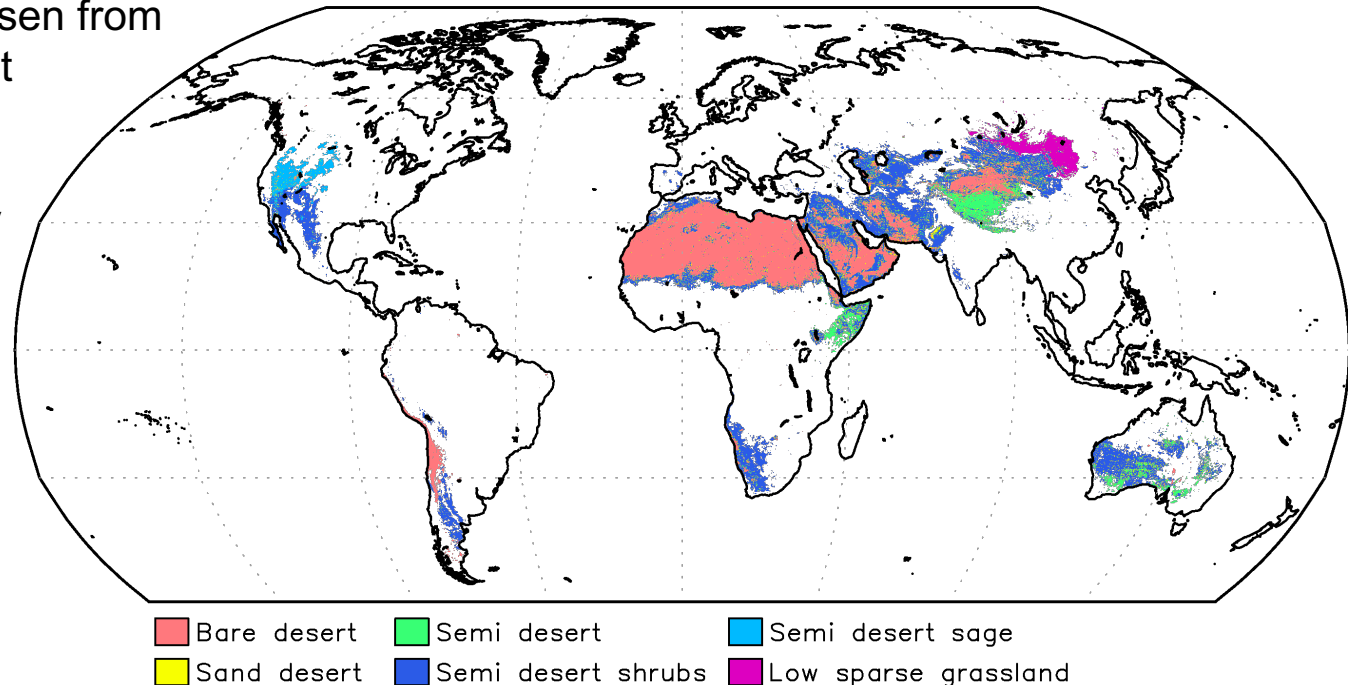
# Mask of dust sources

- provides a numerical model with an information on the location of potential dust sources, amount of dust available for uptake and size distribution of dust particles.
- process of making a dust sources mask differs from model to model and it contains a large amount of uncertainty

## Land cover type based dust sources mask

- potentially dust productive land cover types are chosen from USGS land cover dataset
- chosen categories have different source efficiency

**Land cover types used in DREAM**



# Preferential dust sources mask

- dust productive areas are mainly located in topographic lows, where during the history were located rivers and lakes, Ginoux et al. 2001

$$S = \left( \frac{z_x - z_i}{z_x - z_n} \right)^5$$

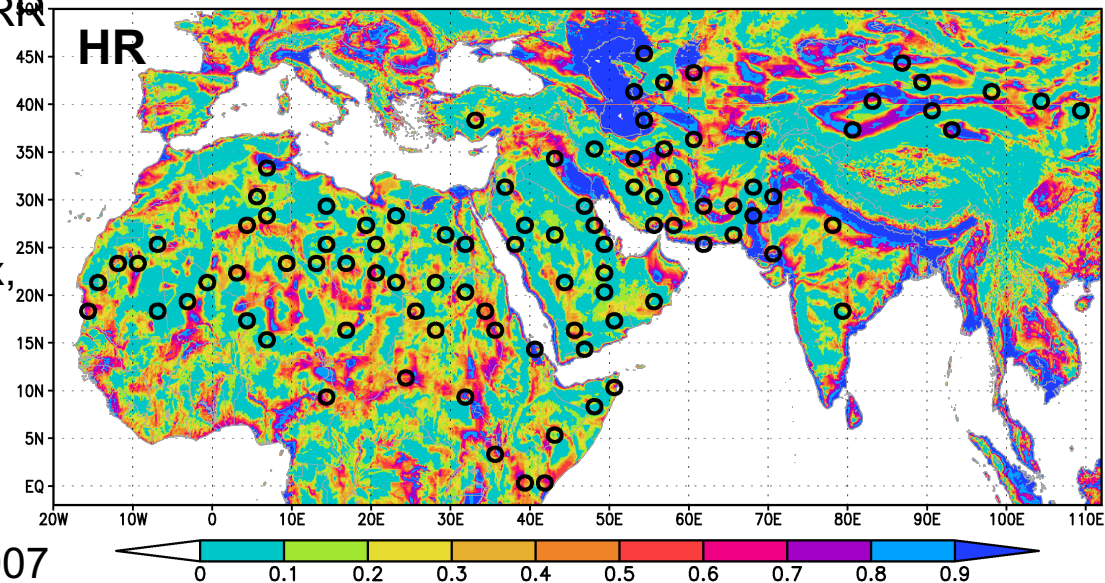
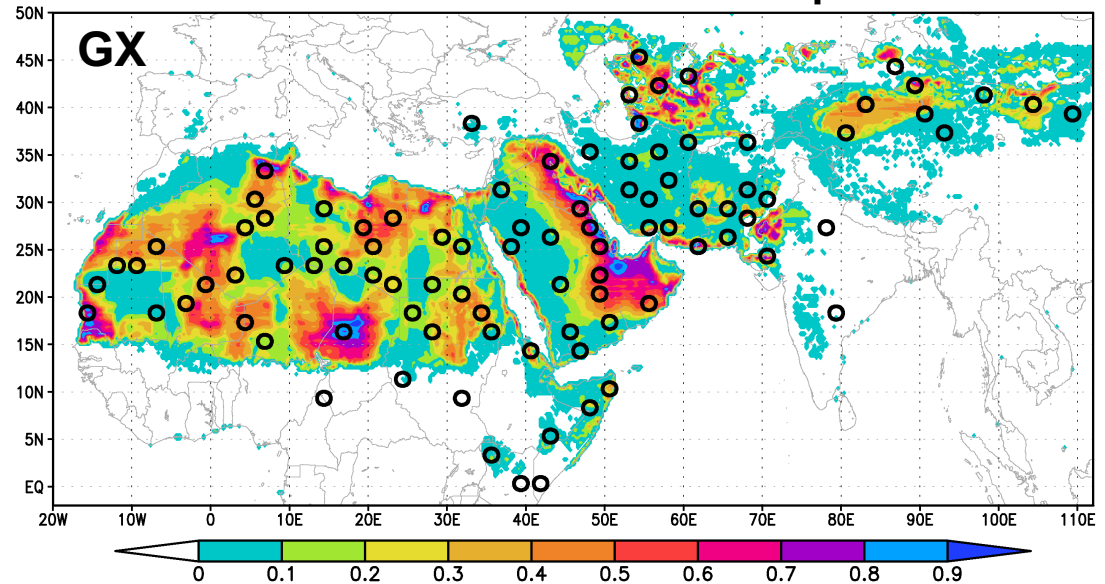
Ginoux (**GX**):  
low resolution, 10x10 degrees box,  
S function + bare surface from AVHRR  
(1x1 degrees)

High resolution (**HR**):  
1km resolution, 2.5x2.5 degrees box,  
S function only



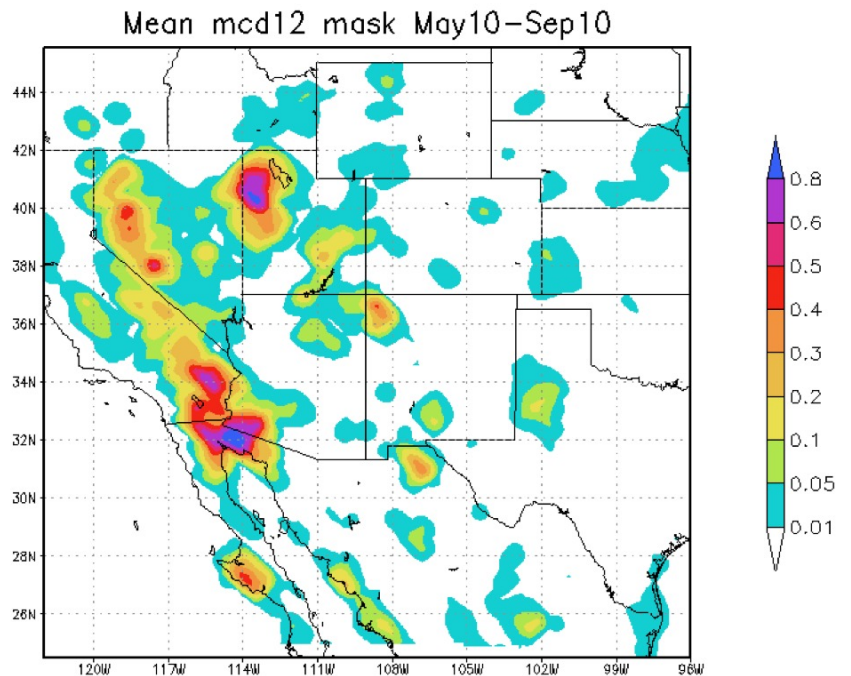
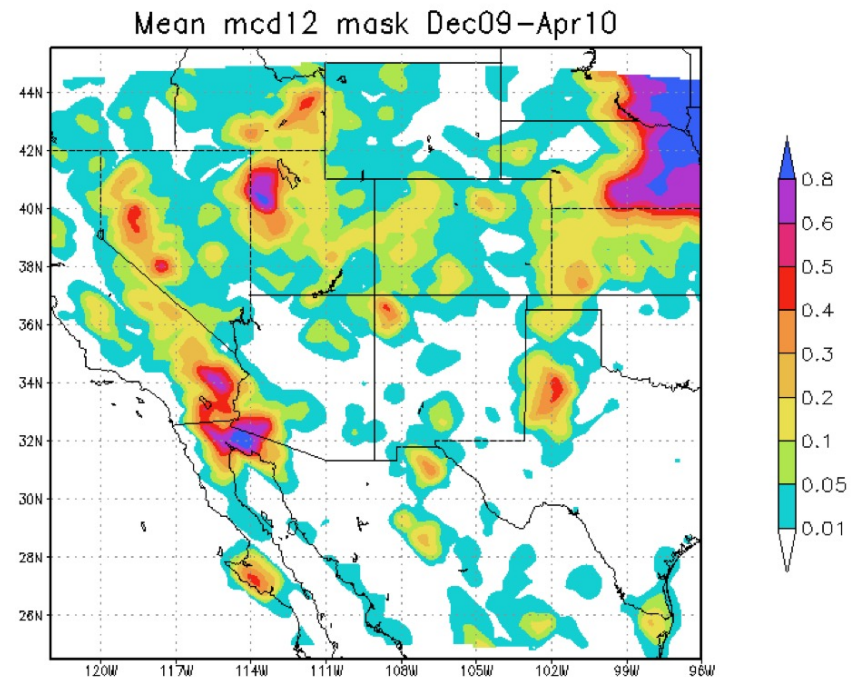
dust hotspots – points with  
maximum TOMS values,  
Engelstaedter and Wasington, 2007

## N. Africa – Europe - SW Asia



# Dust sources mask based on MODIS dat (experience from NASA/EMPHASYS project)

- bare soil from MCD12Q1 annual land cover data from MODIS Aqua and Terra
- seasonal dust sources from agricultural regions should also be included when there are no crops; this could be a very important dust source on local level
- combine bare soil from MCD12Q1 with NDVI data from MODIS Terra
- NDVI data are available for 16-days long periods; updated dust sources mask every 16 days



# DREAM (Dust Regional Atmospheric Model) workflow

Dust model is coupled with atmospheric model (Eta, NMM,...)

Preprocessing:

define dust sources using land cover and soil texture data bases

(or other source of information, depending on area of interest); prepare dust mask on model grid

Kernel of dust modeling – to solve equation:

$$\frac{\partial C_k}{\partial t} = -u \frac{\partial C_k}{\partial x} - v \frac{\partial C_k}{\partial y} - (w - v_{gk}) \frac{\partial C_k}{\partial z} - \nabla (K_H \nabla C_k) - \frac{\partial}{\partial z} \left( K_z \frac{\partial C_k}{\partial z} \right) + \left( \frac{\partial C_k}{\partial t} \right)_{\text{source}} - \left( \frac{\partial C_k}{\partial t} \right)_{\text{sink}}$$

The diagram illustrates the kernel of dust modeling, which is a partial differential equation for dust concentration  $C_k$ . The equation is presented as a sum of terms, each enclosed in a box. A large blue arrow points from the left side of the equation to the first box, indicating the update of dust concentration. Below the equation, three boxes provide context: the first box explains the update of dust concentration in every model time step and in every model point and level (same as atmospheric parameters); the second box explains the use of updated values of soil moisture and friction velocity to calculate dust emission for each of 8 bins; and the third box explains the loss through dry (gravitational settling) and wet (washed down by precipitation) deposition. Arrows point from these boxes to the corresponding terms in the equation: the first box points to the time derivative term, the second box points to the source term, and the third box points to the sink term.

horizontal advection

vertical advection

horizontal turbulent mixing

vertical turbulent mixing

source

sink

update of dust concentration in every model time step and in every model point and level (same as atmospheric parameters)

using updated values of soil moisture and friction velocity calculate dust emission for each of 8 bins

loss through dry (gravitational settling) and wet (washed down by precipitation) deposition

(Nickovic et al., 2001)



# Assimilation of satellite information on mineral dust

ECMWF dust aerosol analysis assimilated in initial field.

<http://www.seevccc.rs/test/wp-content/uploads/2010/04/assimilation.jpg>

Newtonian relaxation equation:

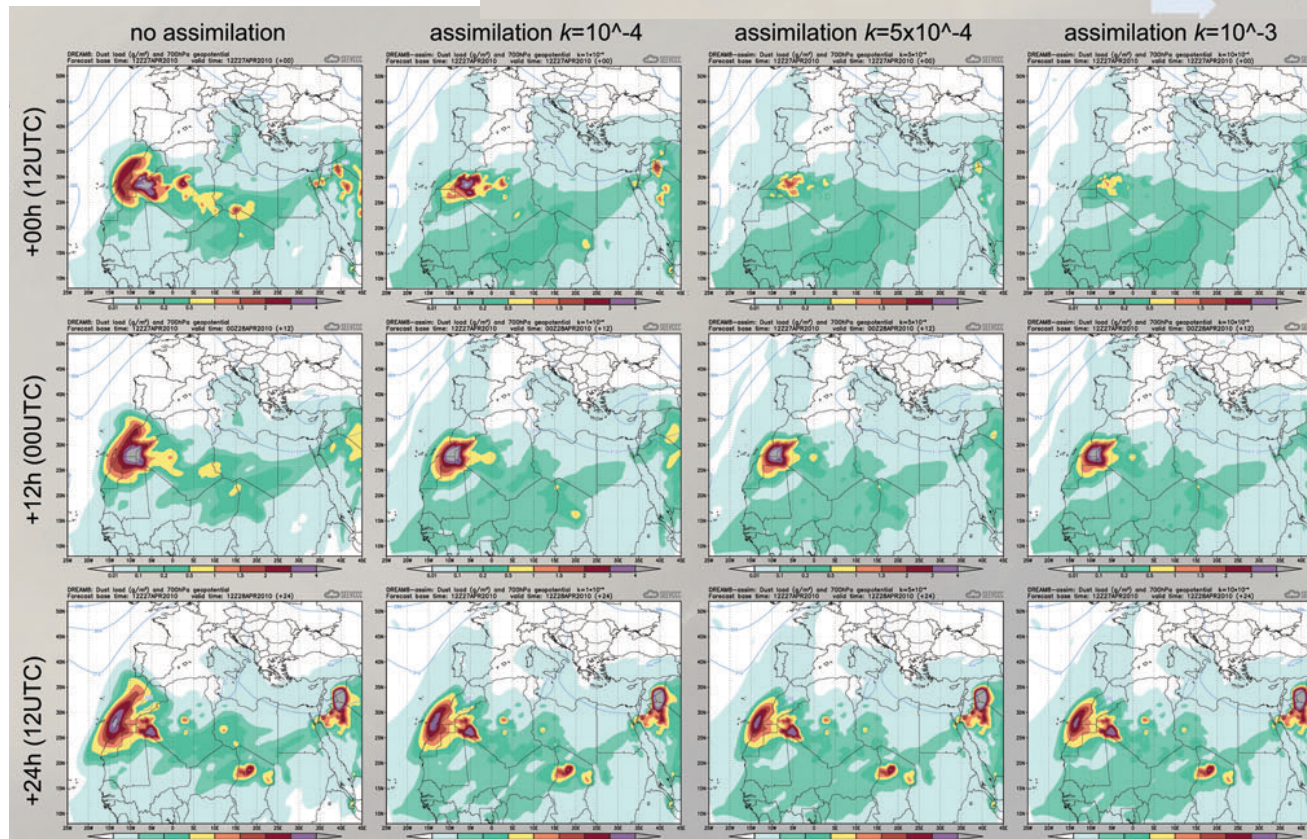
$$\frac{C^{n+1} - C^n}{\Delta t} + k(C^{n+1} - C^*) = 0$$

Additional term, for nudging, in equation for dust particles concentration:

$$C^{n+1} = \frac{C^n + k\Delta t C^*}{1 + k\Delta t}$$

k - coefficient for intensity of nudging ; C - concentration of the dust particles ;  
Δt - model time step ; C\* - value toward nudging is performed

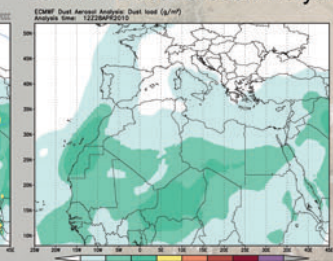
Forecast with assimilation:



## CONCLUSION:

Nudging was done for the 6h period before the forecast start, in order to obtain initial fields of better quality. This way, observations of dust concentrations are assimilated. Three coefficients for nudging toward analysis were used. It is shown that difference between forecast with initial fields obtained with different nudging coefficients disappear quickly, during the first 24h. But, assimilation produced dust over areas that model without assimilation didn't manage to simulate (Spain, Western Europe and Western Africa). After 24h model without assimilation still didn't produce dust over those areas. Verification confirmed benefit from dust assimilation into initial fields.

## ECMWF Dust Aerosol Analysis



# Dust related products in SEEVCCC

## Daily products:

- DREAM8: forecast starting from 00 UTC for 72h ahead using  
DREAM model with 8 dust particles size bins;  
domain: Euro- Mediterranean and North Africa; resolution: 1/3 degrees
- DREAM8assim: forecast starting from 00 UTC for 72h ahead using  
DREAM model with 8 dust size bins:  
ECMWF dust analysis from previous day is incorporated within  
the initial field of dust concentration  
domain: Euro- Mediterranean and North Africa; resolution: 1/3 degrees
- DREAM8asia: forecast starting from 00 UTC for 72h ahead using  
DREAM model with 8 dust particles size bins;  
domain: Southwestern Asia; resolution: 1/3 degrees

<http://www.seevccc.rs/?p=8>

[http://www.seevccc.rs/SW\\_ASIA/](http://www.seevccc.rs/SW_ASIA/)

## Products for special purposes:

- FENNEC project: during FENNEC field campaign SEEVCCC provides with  
DREAM8 72h forecasts twice per day, starting at 00 and 12 UTC  
domain: Northwestern Africa and Mediterranean; resolution: 1/6 degrees

<http://www.seevccc.rs/FENNEC/>

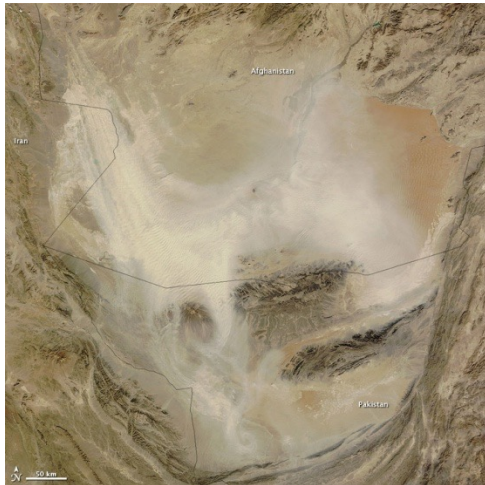


## Example of SW- ASIA domain dust forecast: Dust storm December 4<sup>th</sup> -5<sup>th</sup> 2010

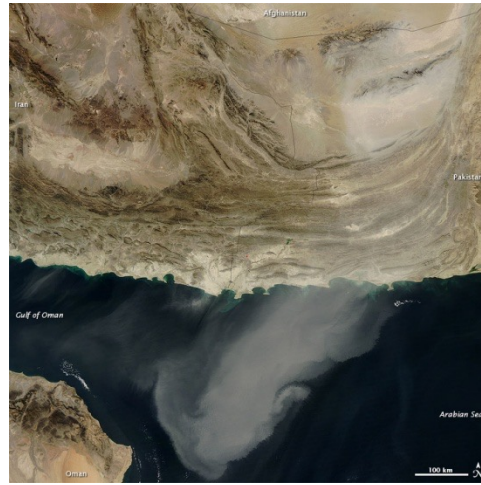
### NASA Earth Observatory:

- A dust storm spanned hundreds of kilometers over the borders between Iran, Afghanistan and Pakistan on December 4, 2010. This dust storm appears to arise from the dry lake region along the Iran-Afghanistan border, and may pick up more dust over the Afghanistan-Pakistan border
- On December 5, 2010, the plume was over the Arabian Sea, headed for the southeastern tip of the Arabian Peninsula.

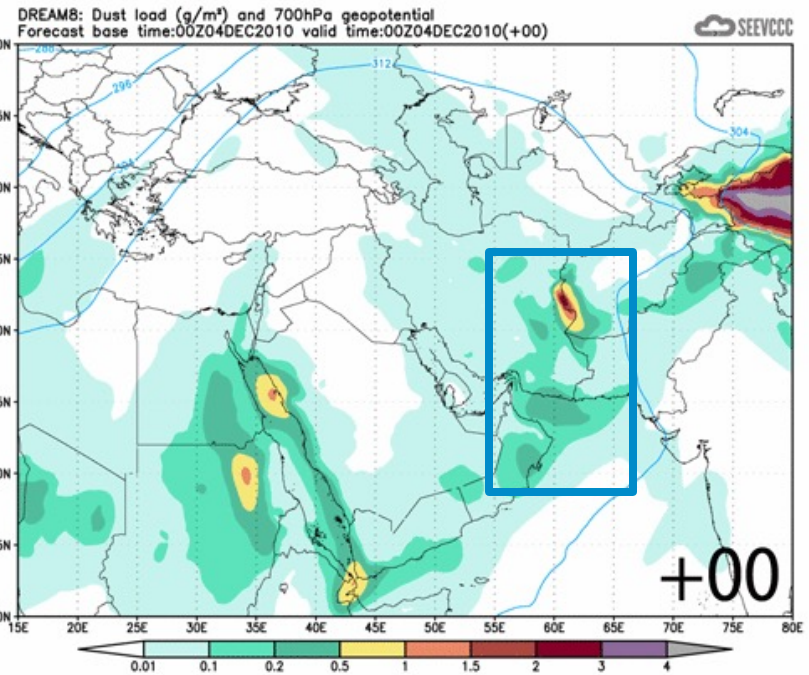
**MODIS: Dec 4<sup>th</sup> 2010**



**MODIS: Dec 5<sup>th</sup> 2010**



**DREAM: Dec4<sup>th</sup>2010 00UTC for 72h**





# High resolution dust modeling

In case of short time and intense dust events high resolution (below 10km) of model simulations is necessary.

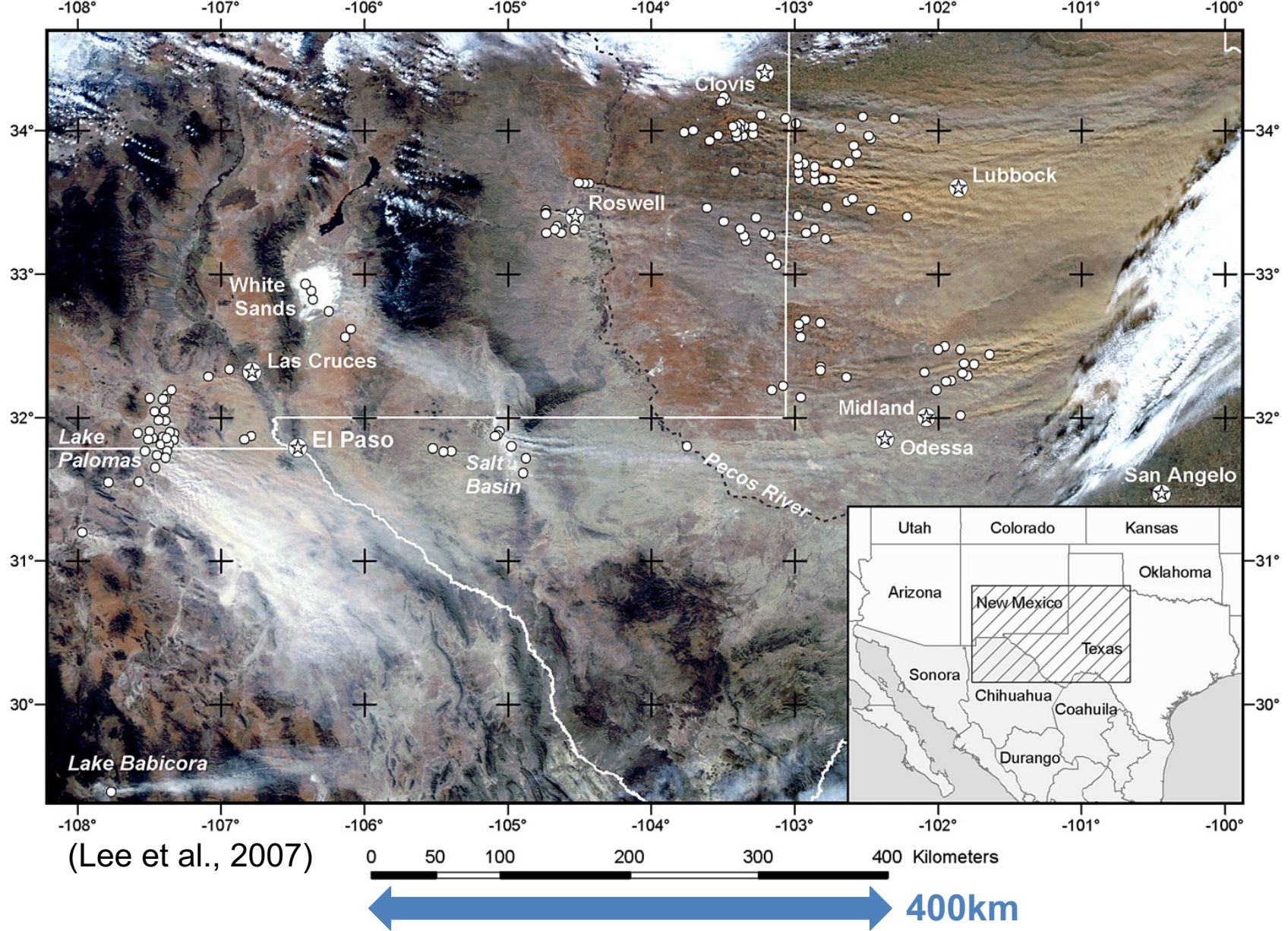
Example:

South middle and west USA

– territory with a lot of small strong dust sources, seasonally dependant.

During summer season, under NAM monsoon conditions, strong winds followed by dust storms are common. Dust outbursts are local, short lived but with extremely high dust concentrations. These events are called “haboobs”.

High resolution is necessary because of local character of the event and for models to be able to capture small dust sources.

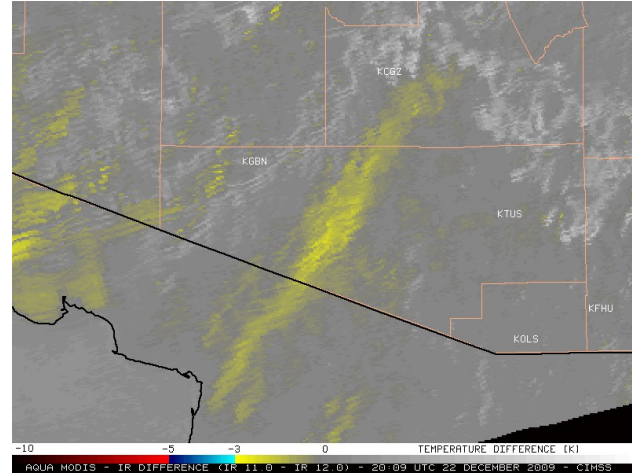


Dust hot spots in Texas, New Mexico detected from NASA/MODIS images.



# Case: Arizona - December 22<sup>nd</sup> 2009

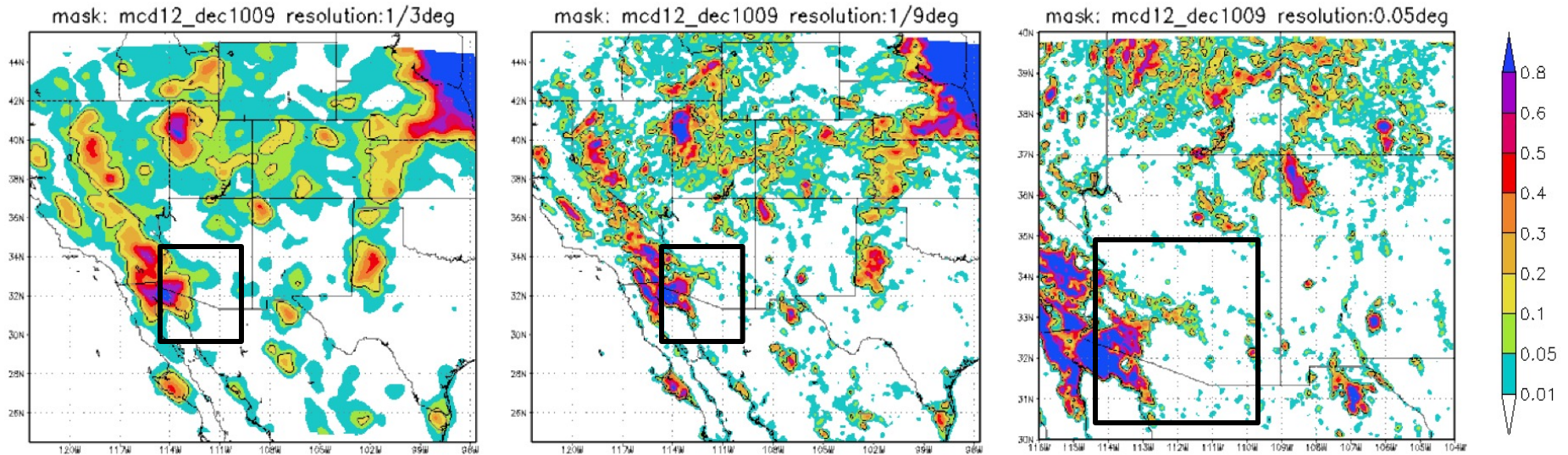
(from NASA/EMPHASYS report)



Satellite images for December 22<sup>nd</sup> 2009 (~20hUTC), Terra MODIS (left) and Aqua MODIS IR difference (right)

Model resolutions: 50km, 17km, 7.5km

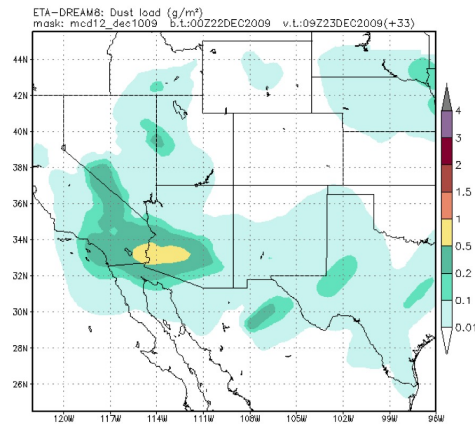
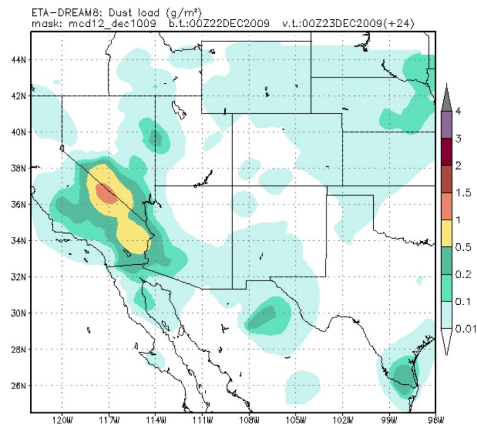
Dust mask: Mcd annual + NDVI for period of simulation (data from Modis & Aqua)



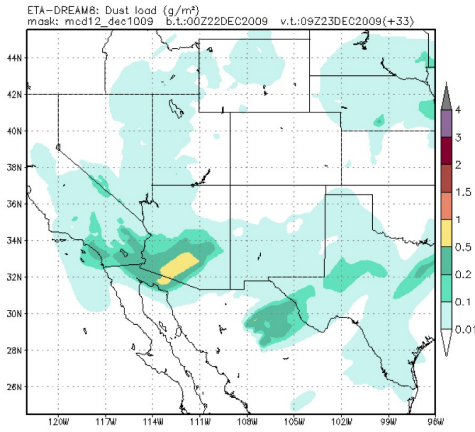
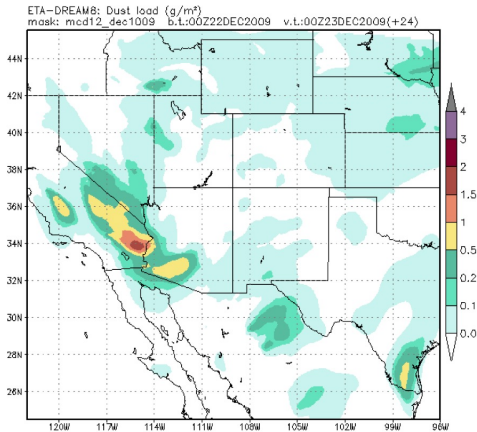
December 22<sup>nd</sup> 2009 00UTC +24h

December 22<sup>nd</sup> 2009 00UTC +33h

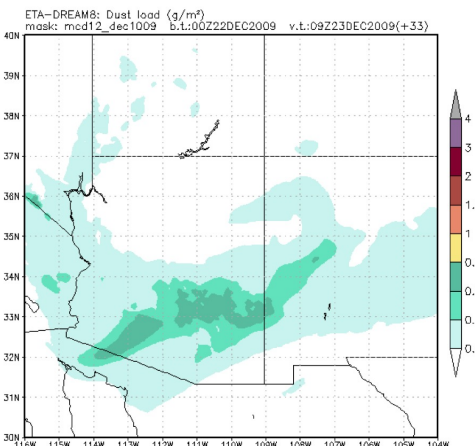
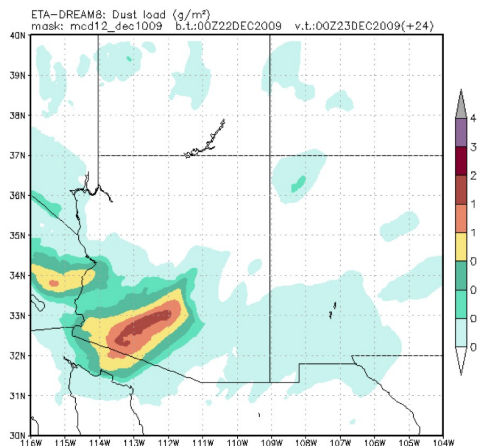
D8MCD 50km



D8MCD 17km



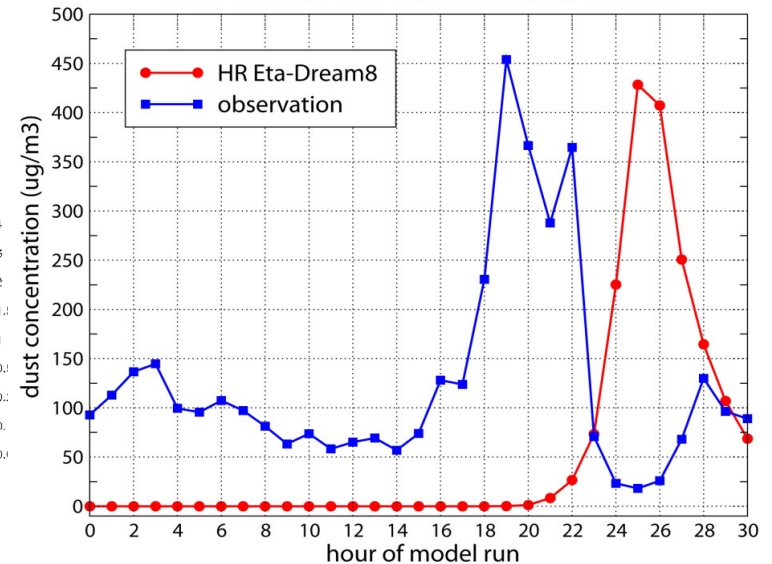
D8MCD 7.5km



Model:  
DREAM with ETA atmospheric driver

Results show:  
With increasing model resolution  
timing is better,  
dust sources in mask are stronger,  
produce larger dust uptake,  
closer to reality.

Dust concentration pm10  
mean value for: Casa Grande, Stanfield, Cowtown



## Case: Arizona, Phoenix – July 5<sup>th</sup> 2011

According to National Weather Service Forecast Office:

dust storm was estimated to reach a peak height of at least 5000ft (1500m);  
areal coverage on the leading edge stretching nearly 100 miles (160 km);  
storm traveled at least a 250km and in the evening hours reduced visibility in Phoenix to zero;

at about 7 PM MST (2 UTC) dust storm hit the far southeast part of Phoenix and continued further through entire city area during next two hours;

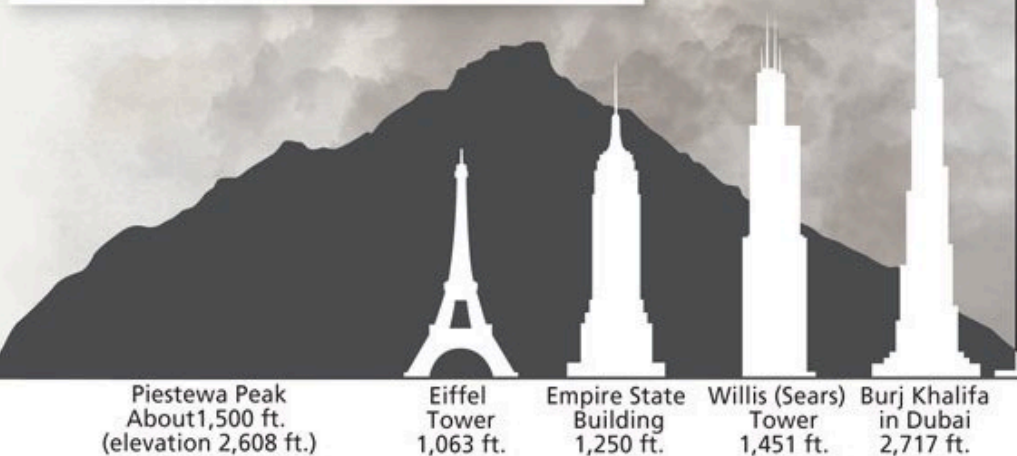
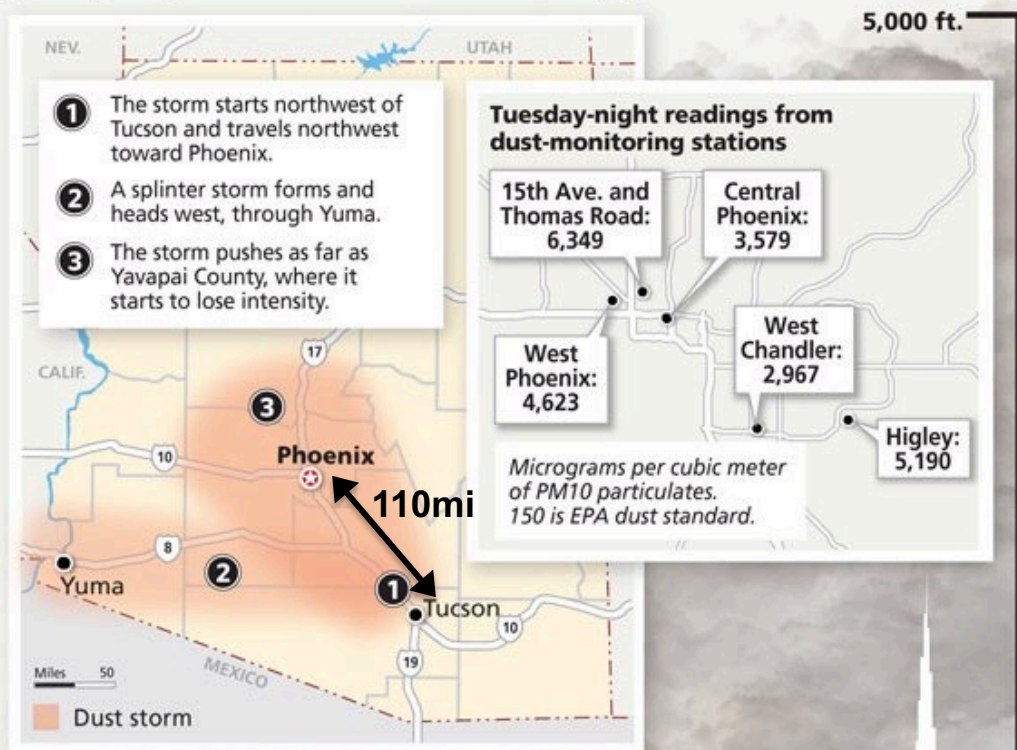
Cause for such event is development of severe thunderstorms in south of Arizona that produced downburst winds and elevation difference between Tuscon and Phoenix area (+460m). Strong outflow winds continued toward north over very dry area, with precipitation less than 50% of normal since the end of the last summer.

Dust storms developed in this way are also called haboobs.



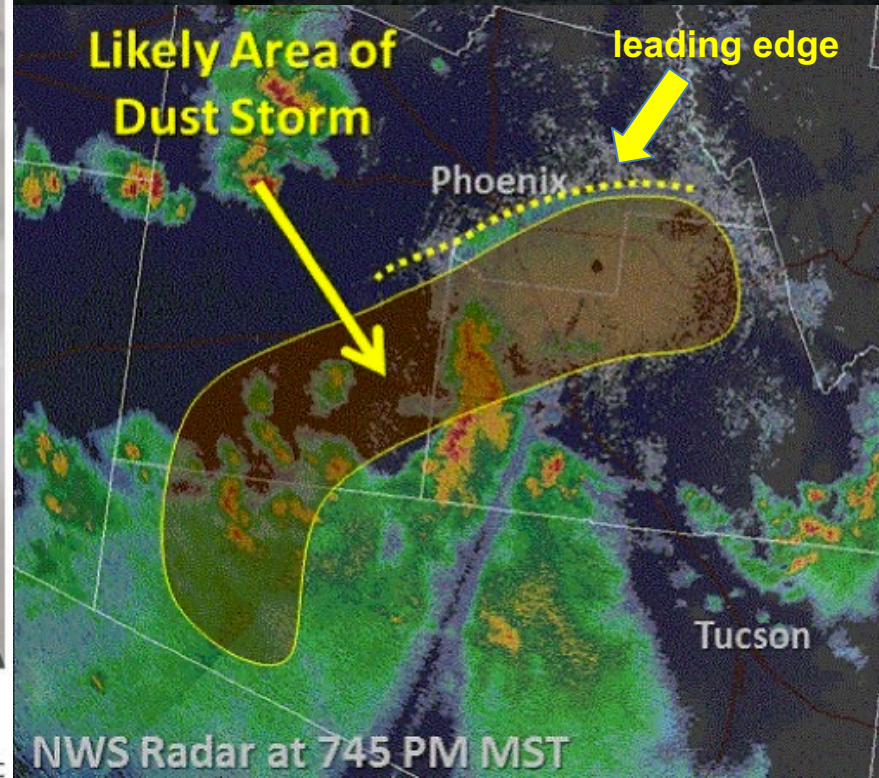
# A wall of dust nearly a mile high

Powerful downdrafts from thunderstorm systems in southern Arizona pushed against the ground, pressing out a cloud of dust that reached unusual proportions.



Source: Republic research

KATHLEEN RUDELL/THE REPUBLIC





## Simulations specification:

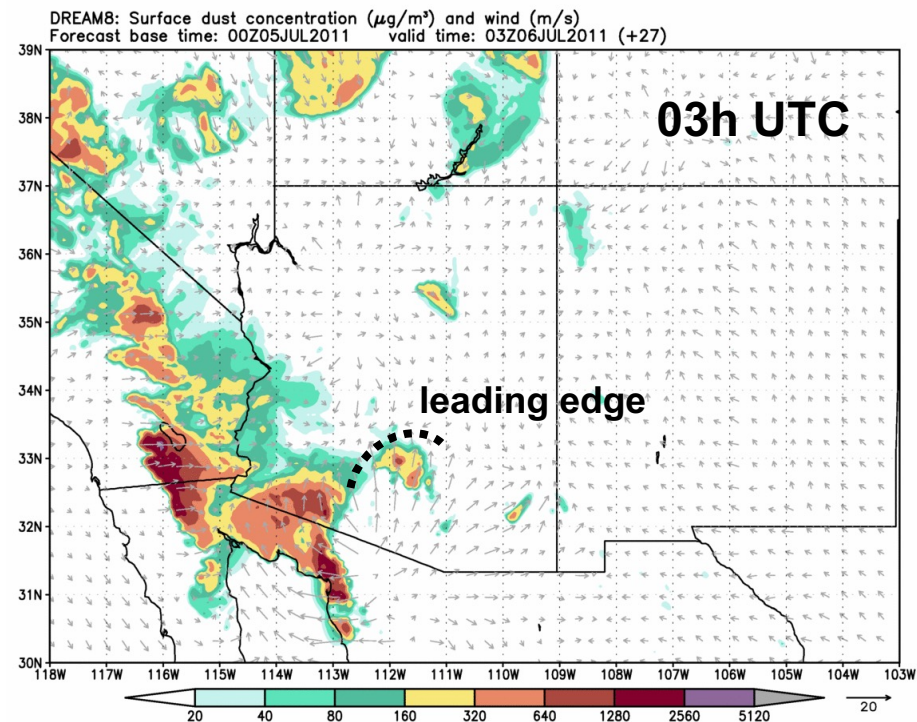
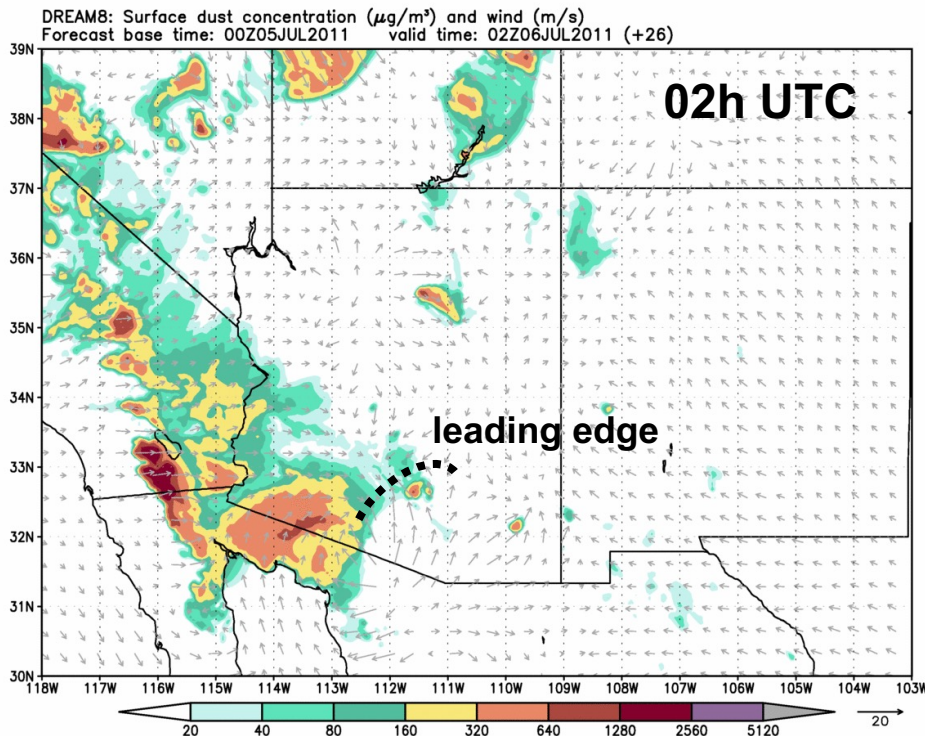
model: DREAM with NMM as atmospheric driver;

simulation: start at July 5<sup>th</sup> 2011 00UTC +48h

resolution: 6km and 3.5 km

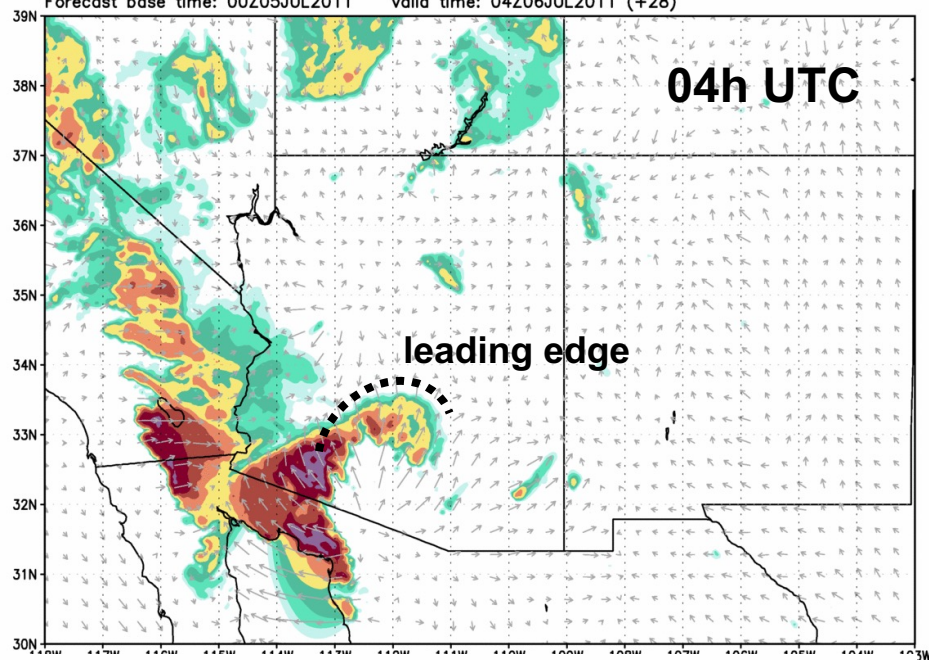
mask: mcd12\_jun0110

## Results for 6km resolution run

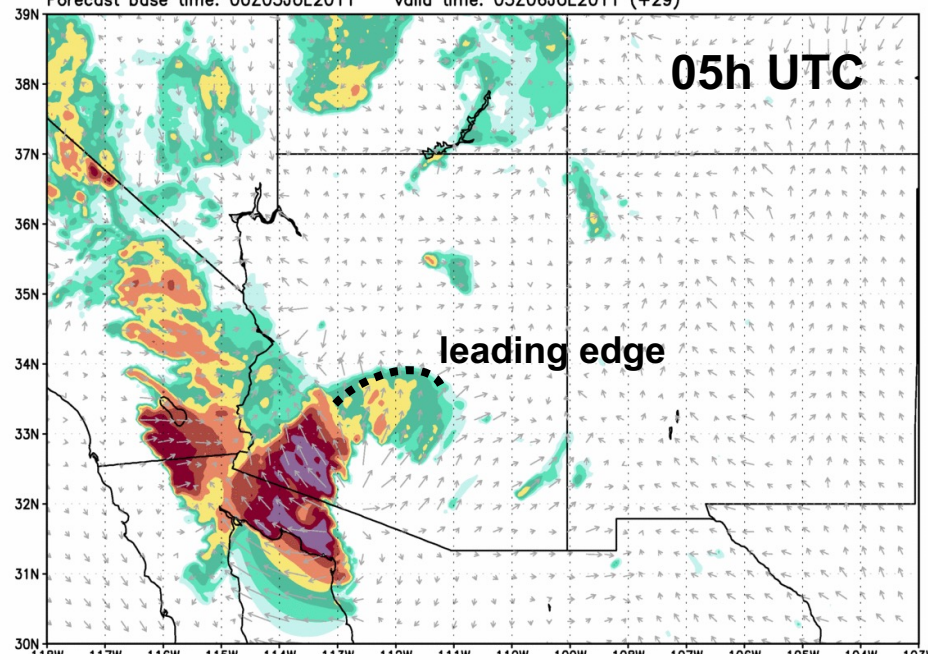




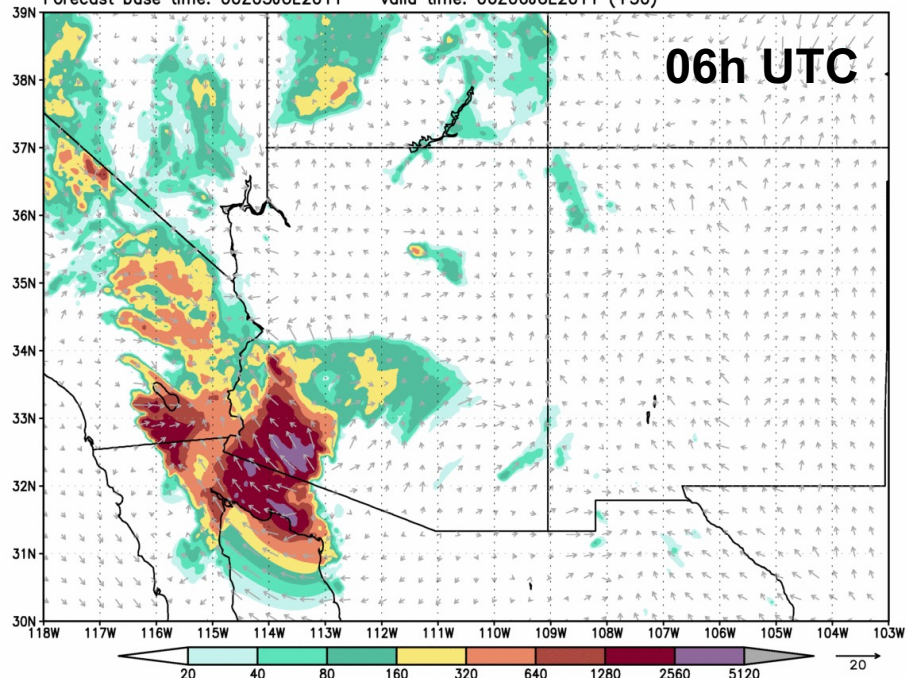
DREAM8: Surface dust concentration ( $\mu\text{g}/\text{m}^3$ ) and wind (m/s)  
Forecast base time: 00Z05JUL2011 valid time: 04Z06JUL2011 (+28)



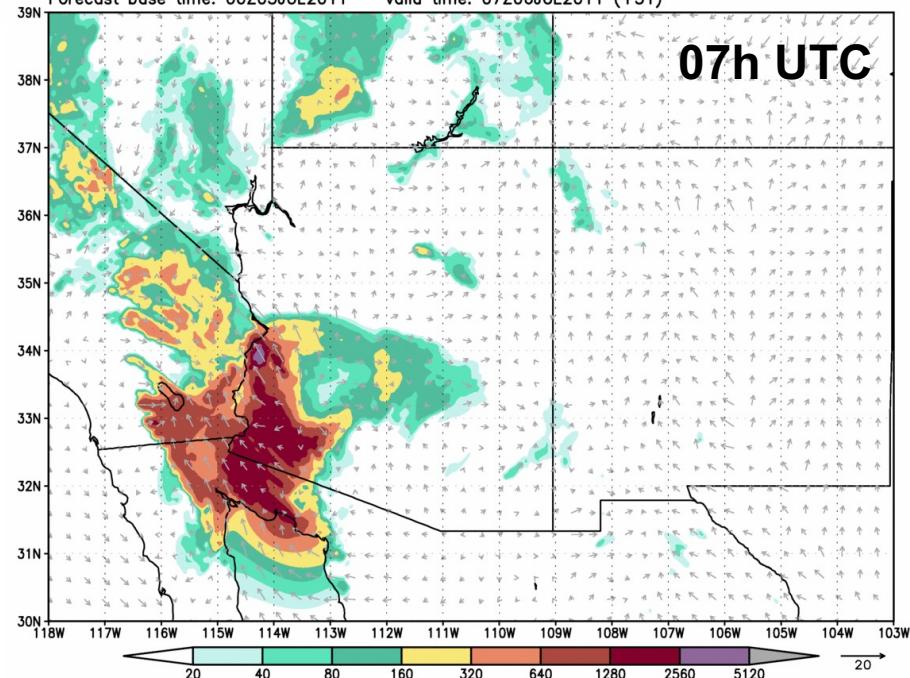
DREAM8: Surface dust concentration ( $\mu\text{g}/\text{m}^3$ ) and wind (m/s)  
Forecast base time: 00Z05JUL2011 valid time: 05Z06JUL2011 (+29)



DREAM8: Surface dust concentration ( $\mu\text{g}/\text{m}^3$ ) and wind (m/s)  
Forecast base time: 00Z05JUL2011 valid time: 06Z06JUL2011 (+30)



DREAM8: Surface dust concentration ( $\mu\text{g}/\text{m}^3$ ) and wind (m/s)  
Forecast base time: 00Z05JUL2011 valid time: 07Z06JUL2011 (+31)

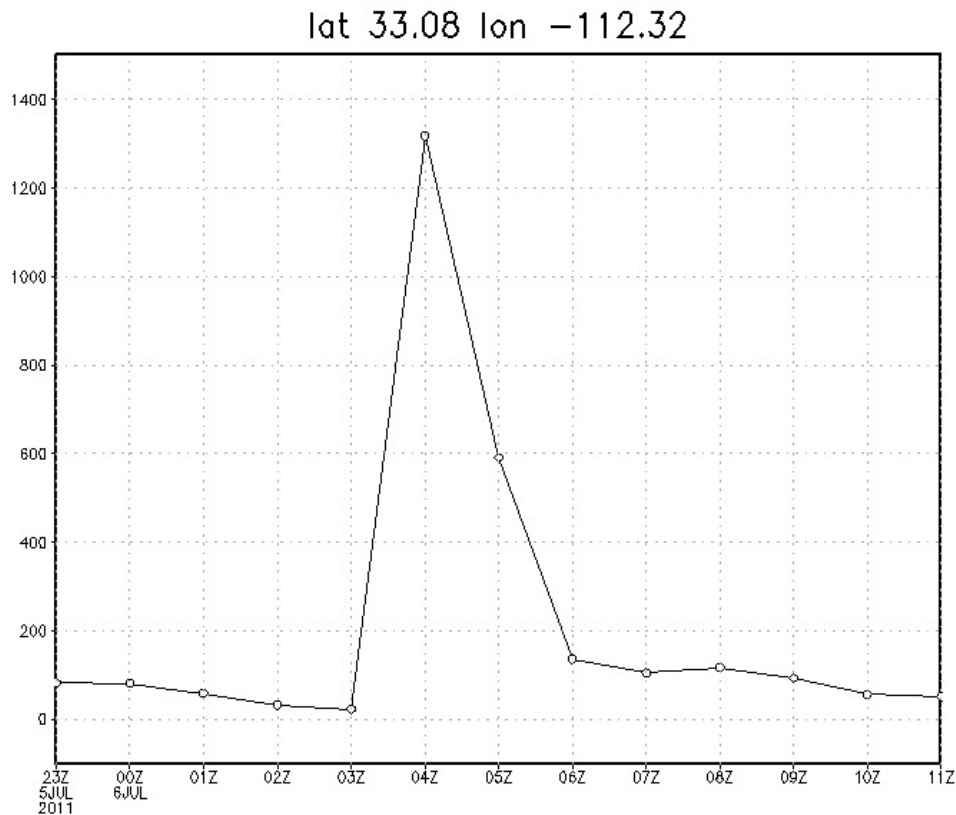




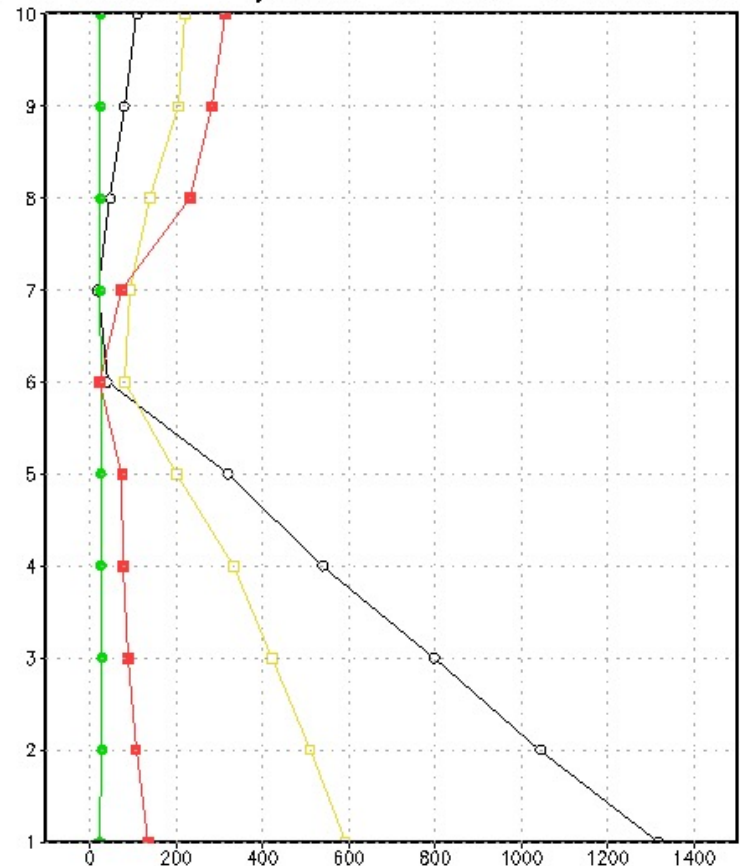
# Cross-sections and profiles for point N33.08 W112.32 (point with max. dust concentration)

In point with max surface dust concentration:  
-> maximum at 4 UTC

vertical profile of dust concentration  
in first 10 model levels:



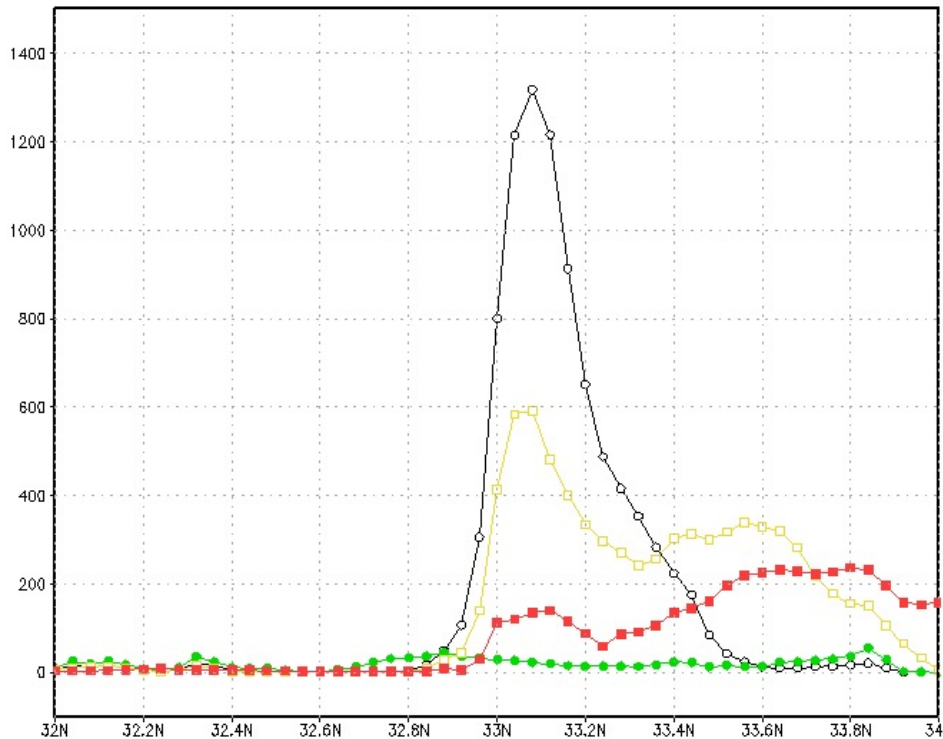
green=3 black=4 yellow=5 red=6 UTC 6JULY2011



## Example of cross-sections: over selected point

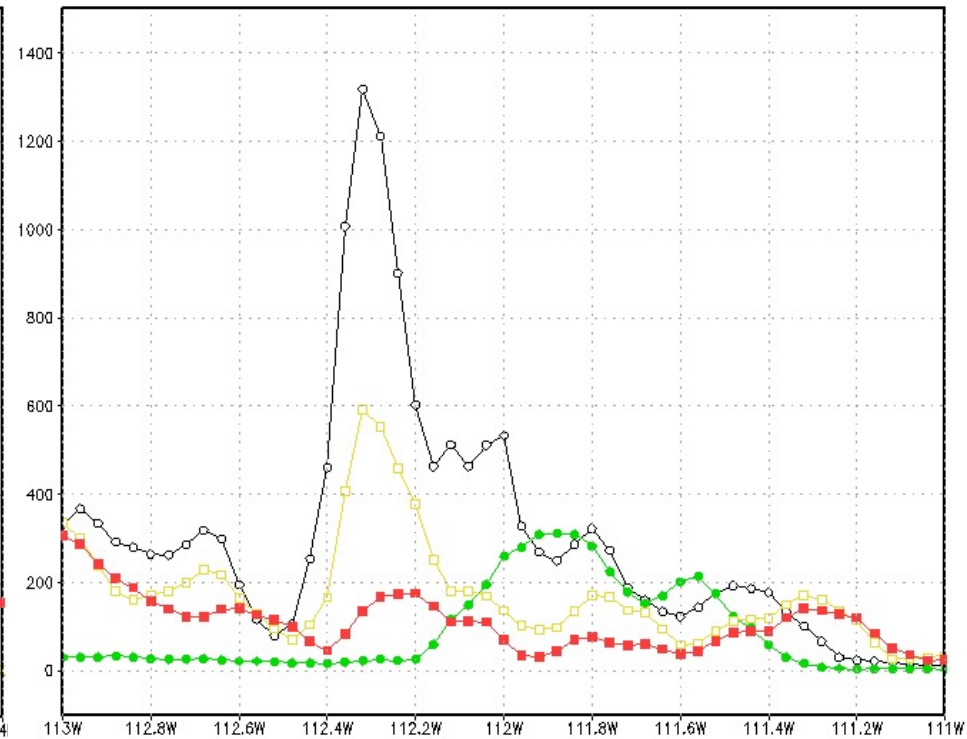
Cross-section along lon W112.32:

green=3 black=4 yellow=5 red=6 UTC 6JULY2011

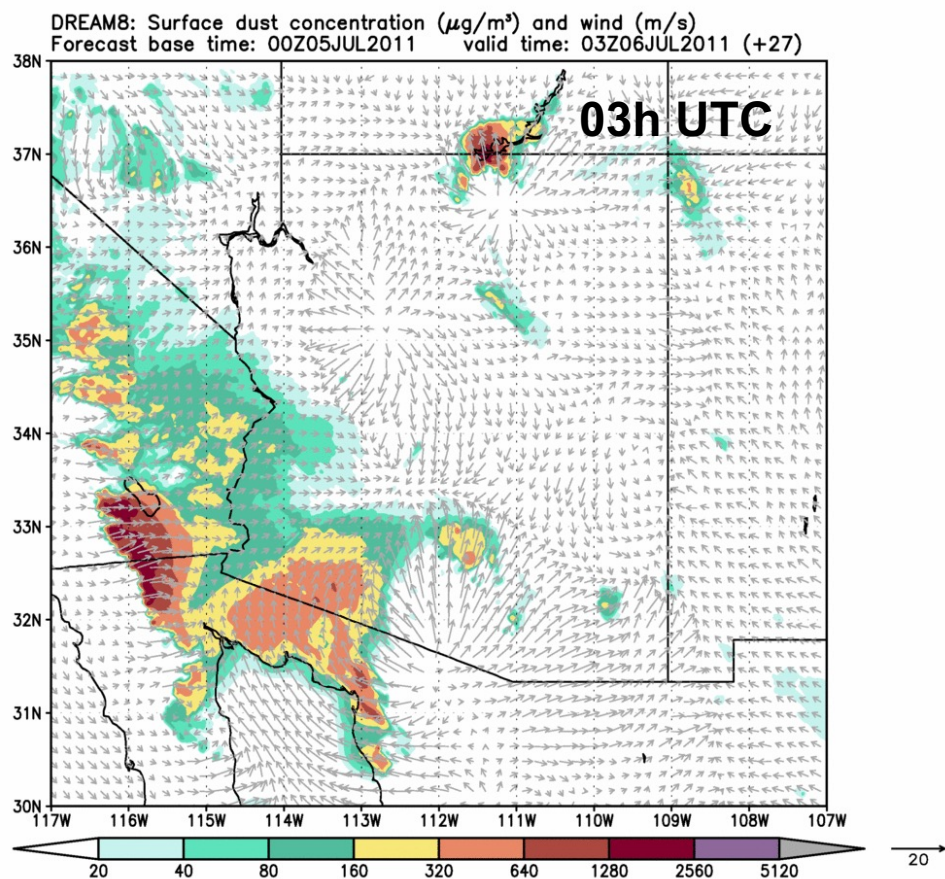
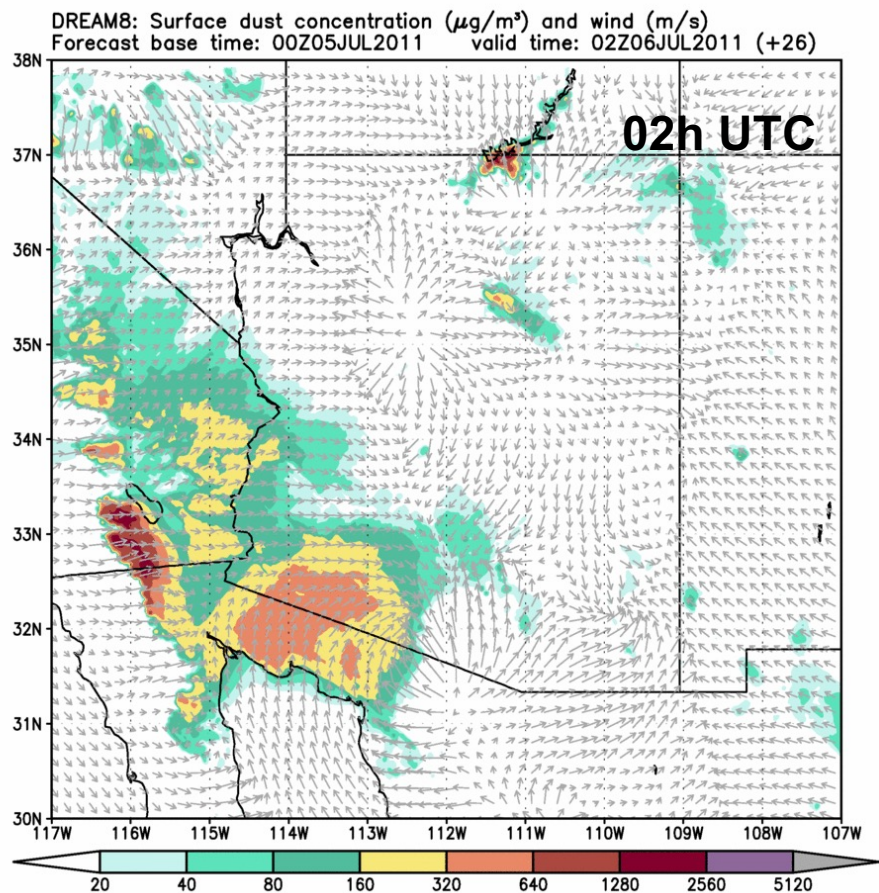


Cross-section along lat N33.08:

green=3 black=4 yellow=5 red=6 UTC 6JULY2011

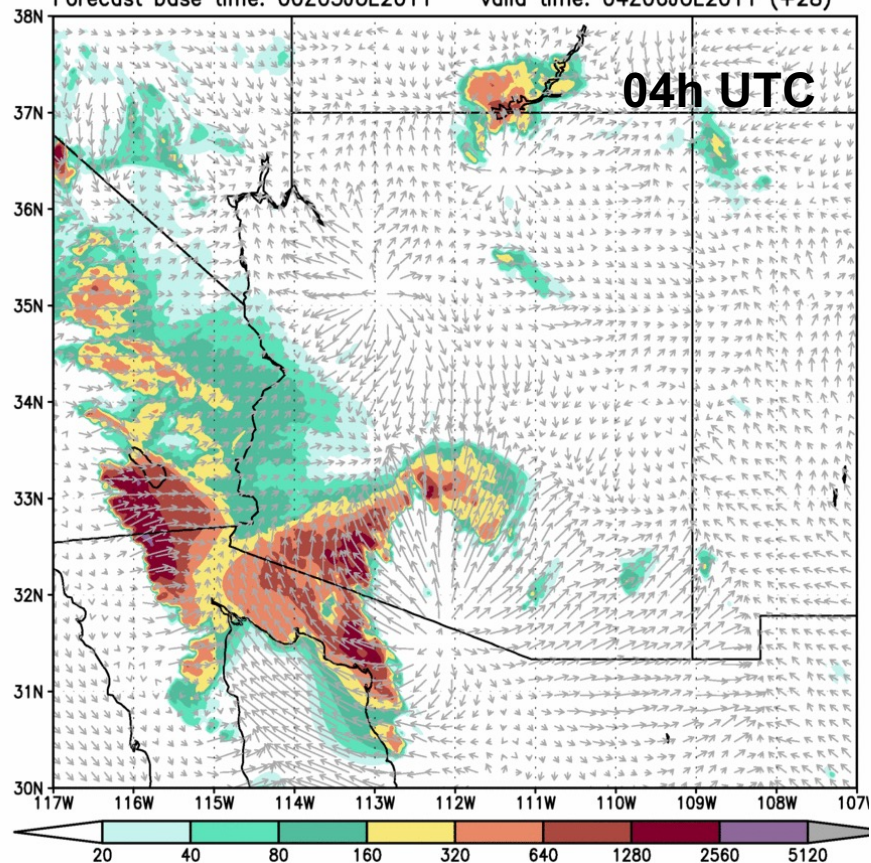


## Results for 3km resolution run

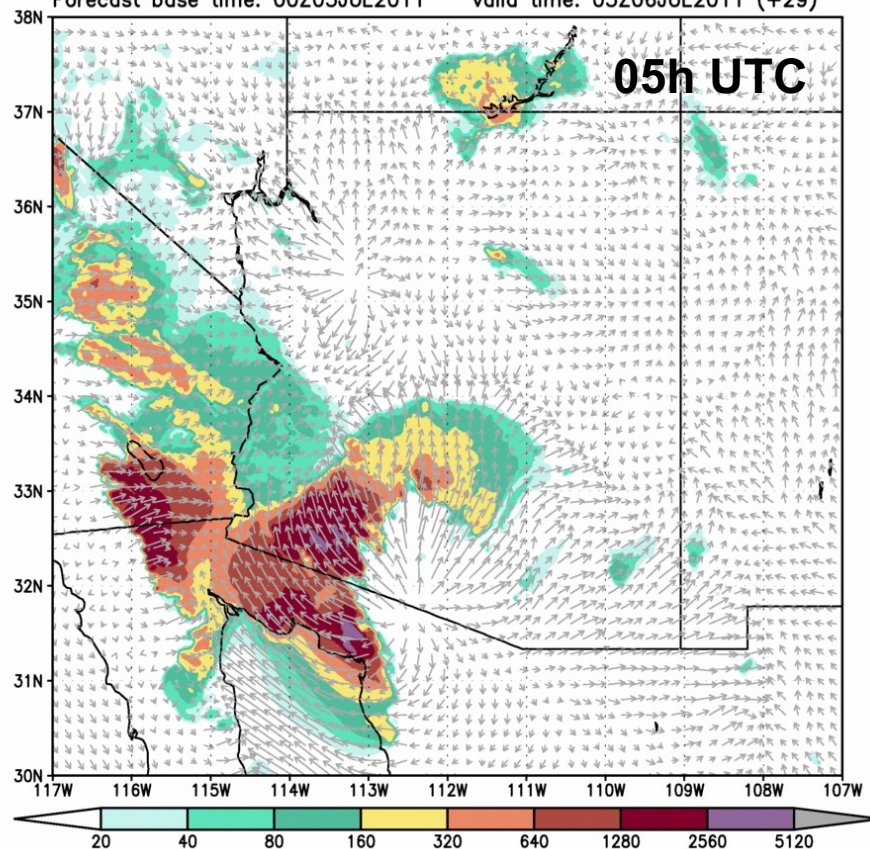




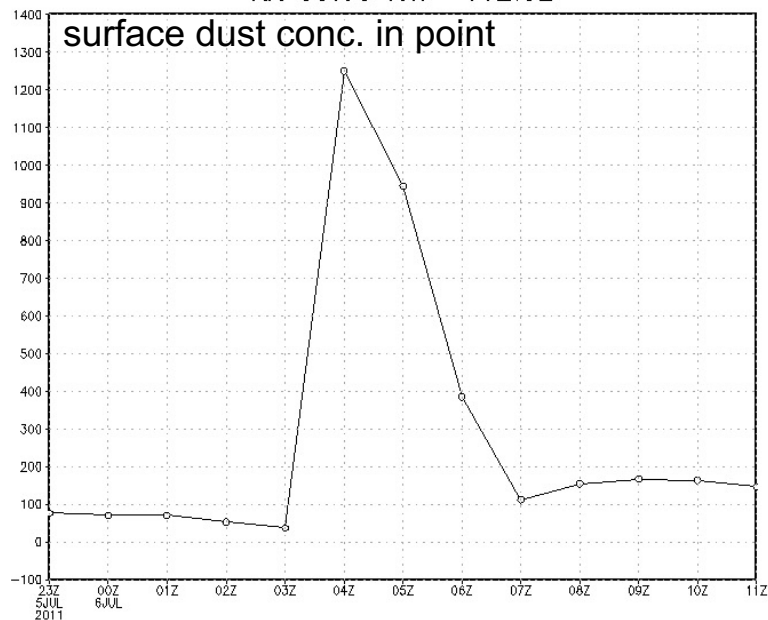
DREAM8: Surface dust concentration ( $\mu\text{g}/\text{m}^3$ ) and wind (m/s)  
Forecast base time: 00Z05JUL2011 valid time: 04Z06JUL2011 (+28)



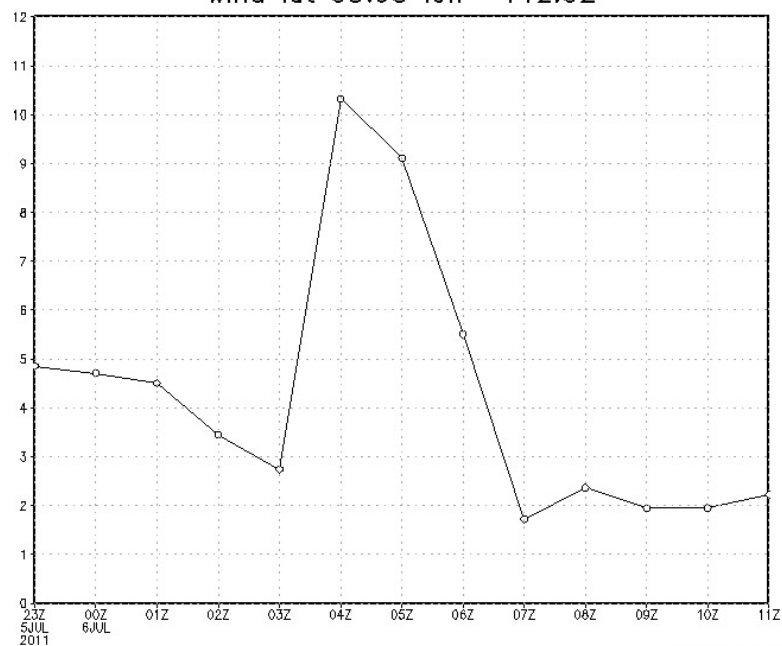
DREAM8: Surface dust concentration ( $\mu\text{g}/\text{m}^3$ ) and wind (m/s)  
Forecast base time: 00Z05JUL2011 valid time: 05Z06JUL2011 (+29)



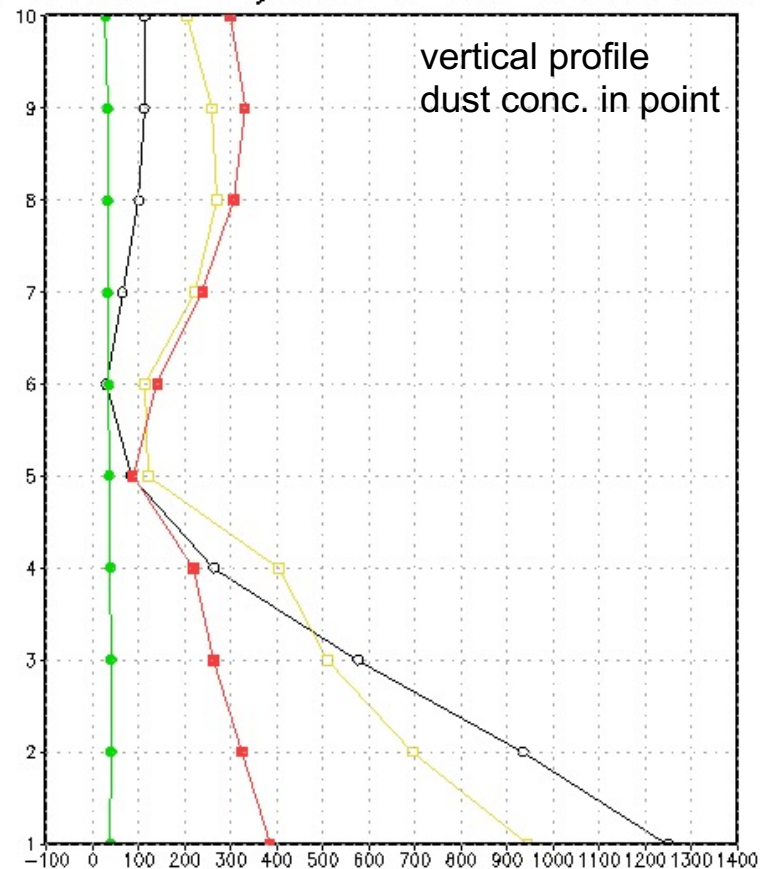
lat 33.08 lon -112.32



wind lat 33.08 lon -112.32



green=3 black=4 yellow=5 red=6 UTC 6JULY2011



## Mineral composition of arid soils

- dust is composed of minerals that differ in physical and chemical characteristics
- each mineral has different impact on environment, atmospheric radiation, ice nucleation
- important impacts on: human health, ocean bio-productivity, cloud formation

## GMINER30: High-resolution global dataset on surface mineralogy in arid areas

- data on mineral fraction for 9 most common minerals in arid regions
- based on Claquin et al., 1999, but improved
- minerals are sorted by size in clay and silt populations

silt	clay	silt & clay
feldspar	illite	calcite
gypsum	kaolinite	hematite
	smectite	quartz

+ phosphorus

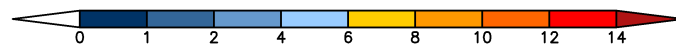
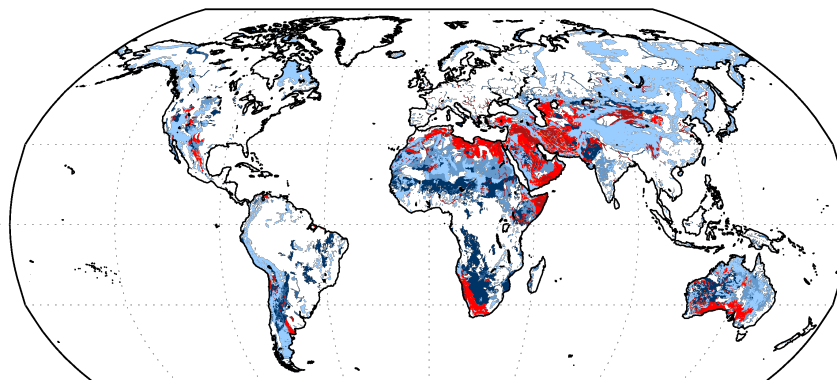
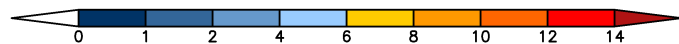
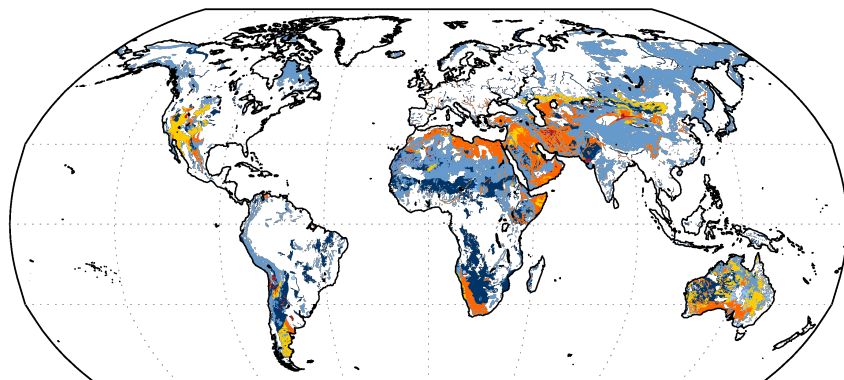
- dataset is global on 30 arc-seconds resolution (~ 1 km)
- available for download at: <http://www.seevccc.rs/GMINER30/>



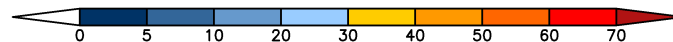
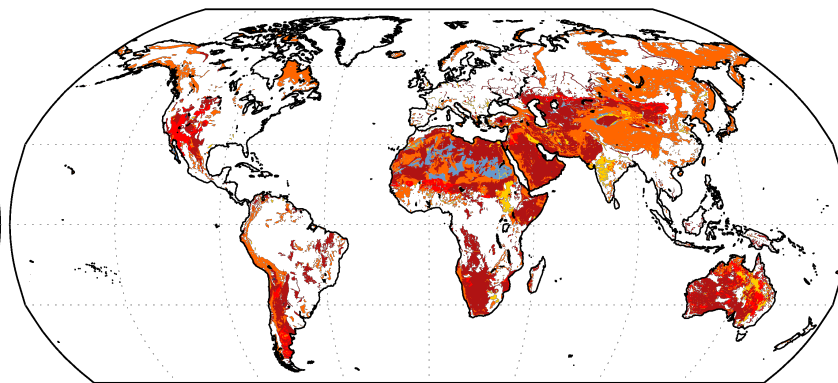
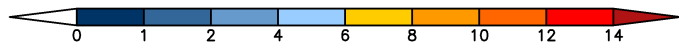
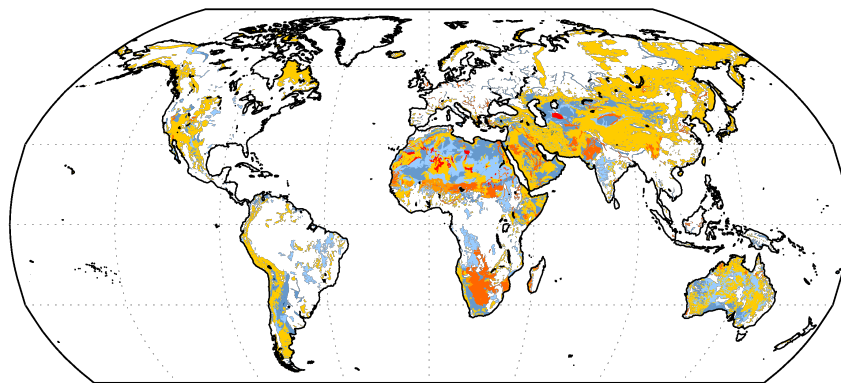
## CLAY POPULATION

## SILT POPULATION

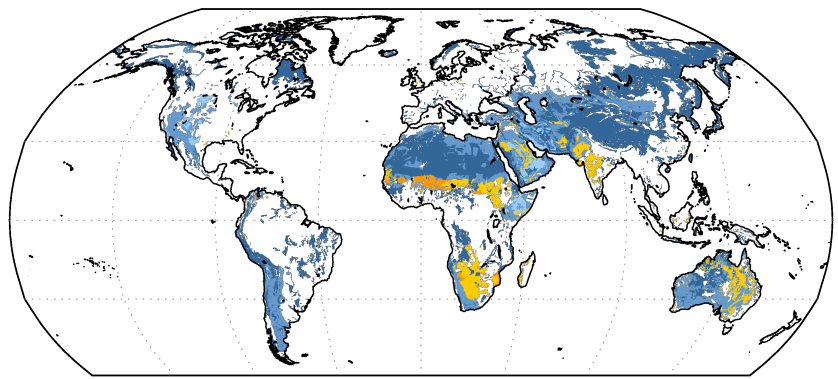
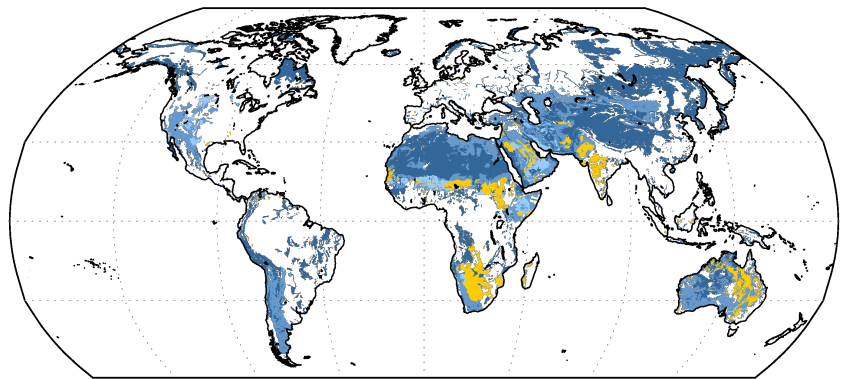
CALCITE



QUARTZ

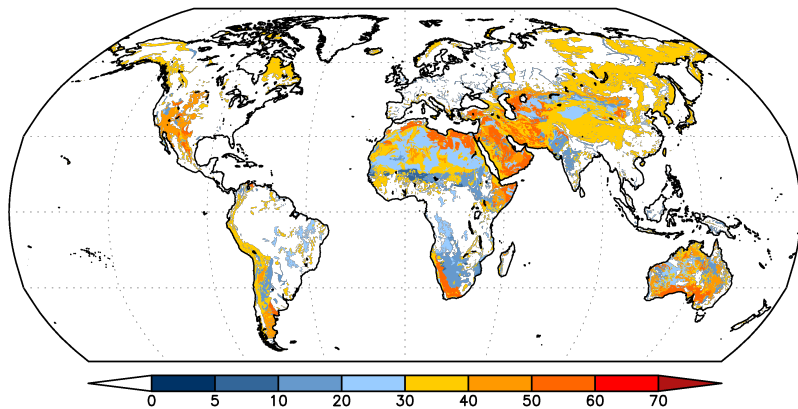


HEMATITE

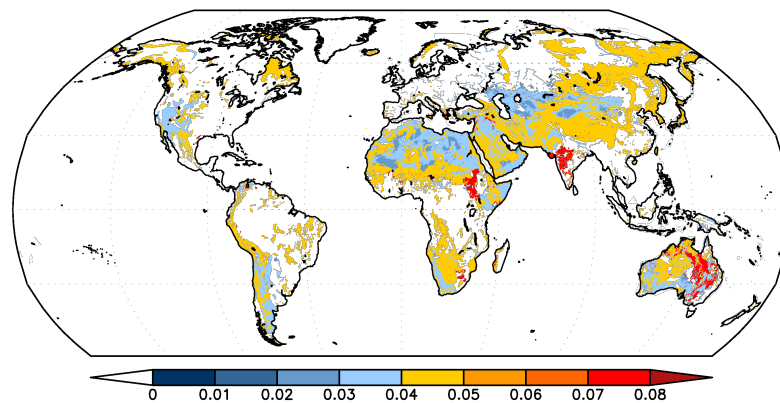


ILLITE

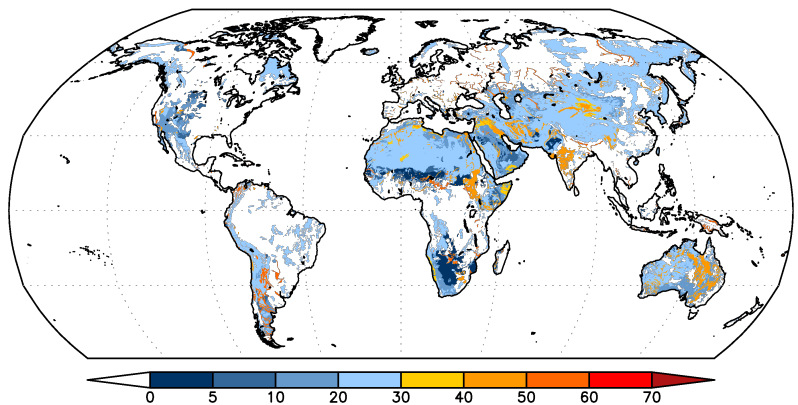
## CLAY POPULATION



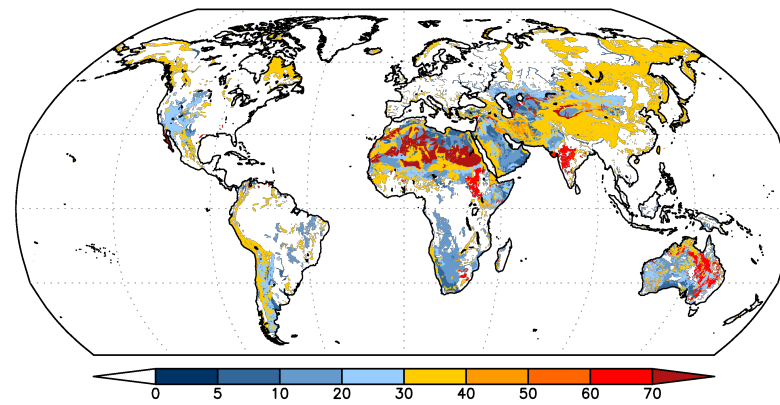
PHOSPHORUS



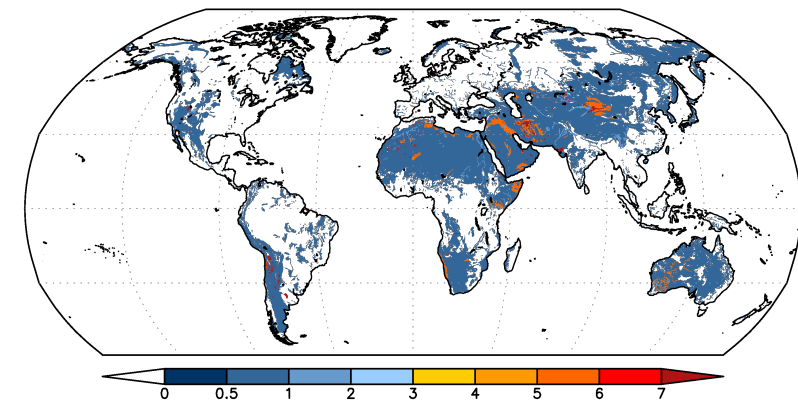
SMECTITE



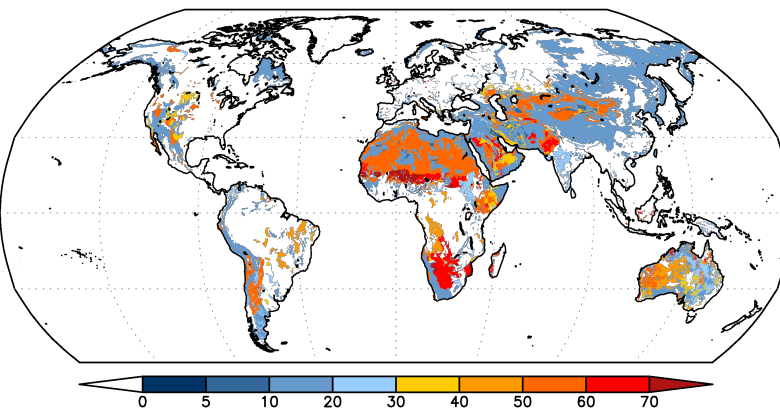
FELDSPARS



GYPSUM



KAOLINITE



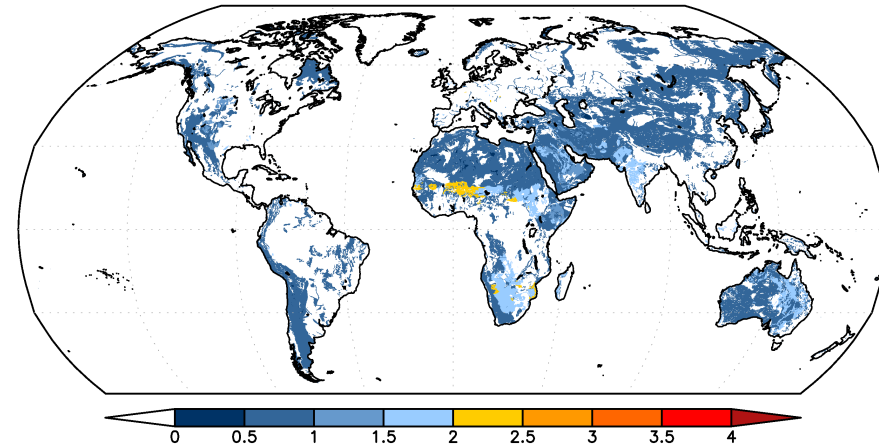
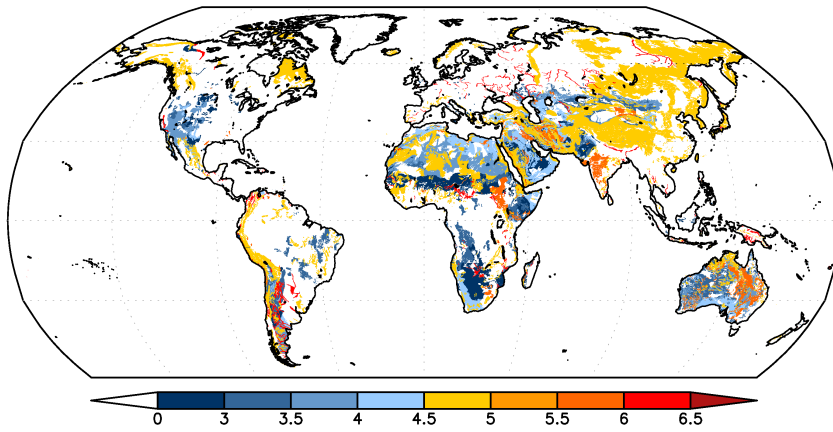


- using mineralogy data we calculated fraction of total and soluble Fe in clay and silt
- information on Fe percentage combine with land cover data provides information on how much Fe is available to uptake DREAM-IRON

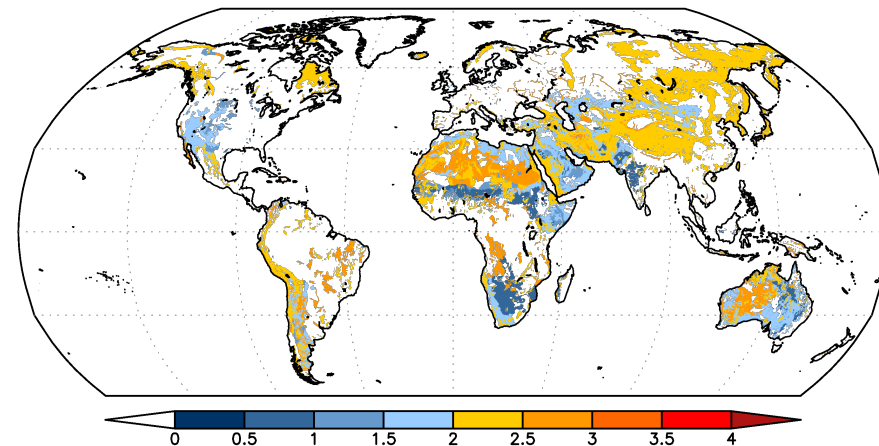
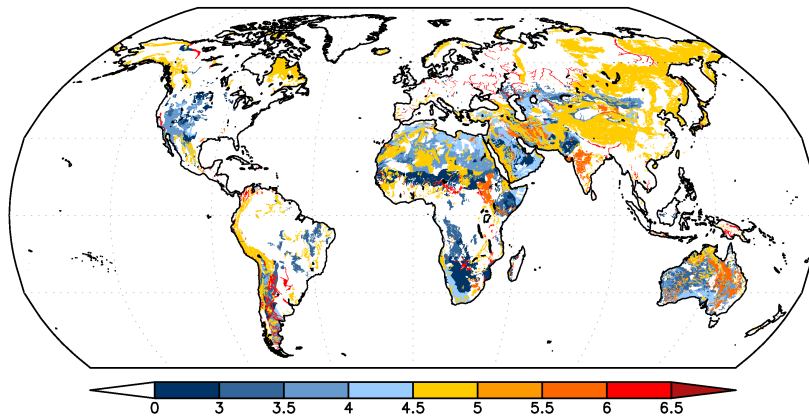
### CLAY POPULATION

### SILT POPULATION

TOTAL Fe



SOLUBLE Fe



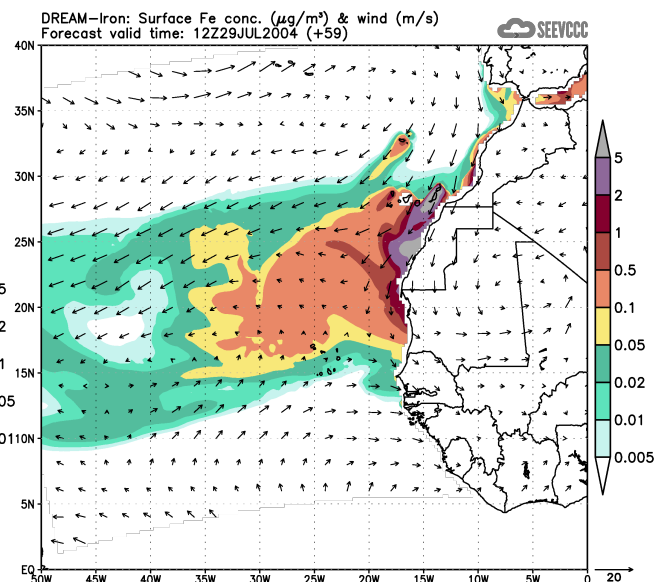
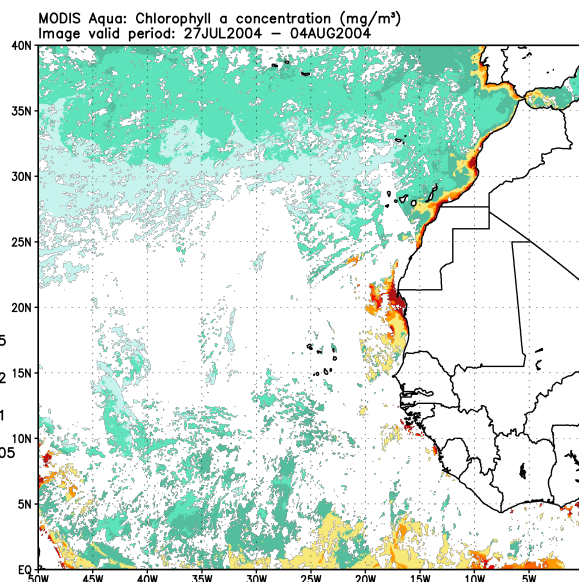
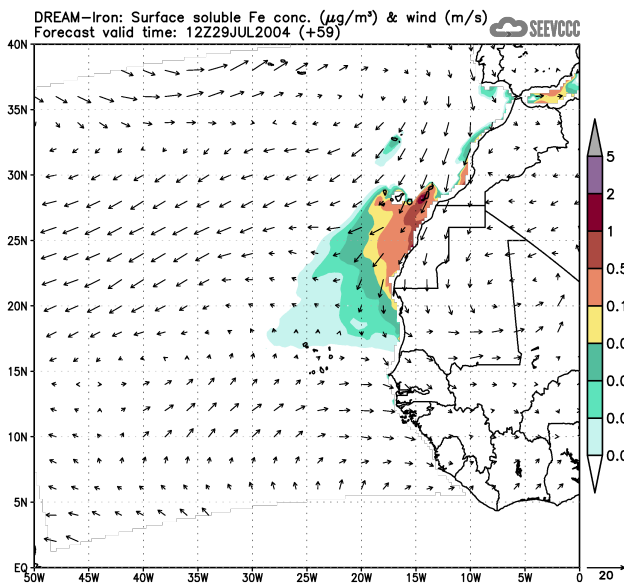
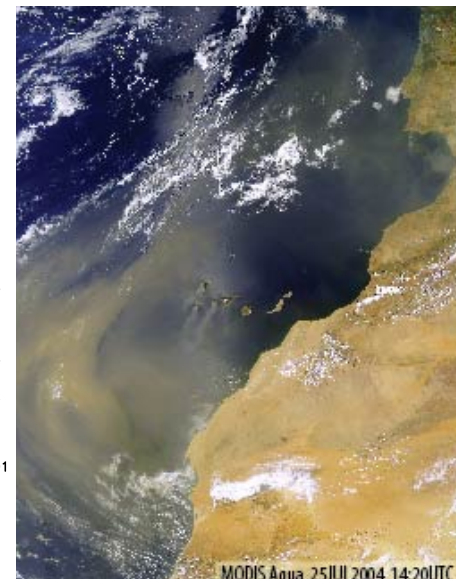
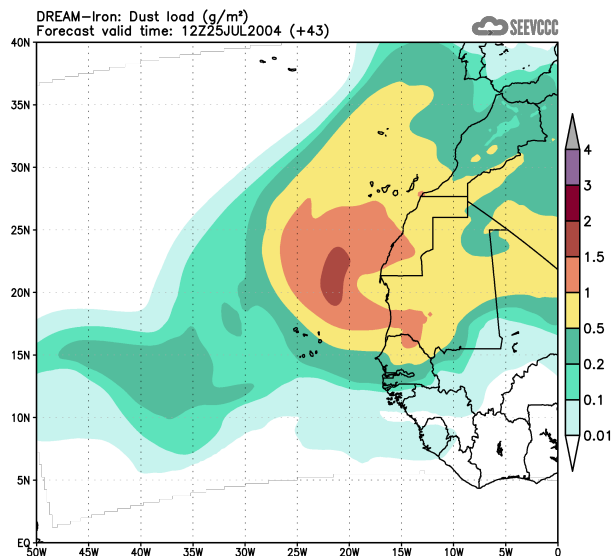
# Atmospheric iron transport modeling

## Example of mineral database application

### CASE STUDY

#### Dust storm induced chlorophyll bloom near Canary Islands, July 2004

During July and August 2004, numerous dust storms occurred in northwestern part of Africa during which Saharan dust was blown towards the Atlantic ocean. Mineral rich dust aerosol was deposited mainly along the northwest African shelf, supplying the ocean with nutrient necessary for phytoplankton growth. During August, a massive occurrence of cyanobacteria was reported near Canary Islands (Ramos et al., 2005). According to the iron hypothesis (Martin, 1994), the deposition of iron, along with dust aerosol, might increase biological productivity of the ocean and might enhance chlorophyll concentration. Therefore, we simulated this event using DREAM-Iron. The integration covers the period between 15th and 31st of July. Here we present preliminary results for dust load and iron deposition and surface concentration which is in good agreement with observed pattern of chlorophyll a concentration, observed with MODIS Aqua satellite.



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