

# Assimilation of ExoMars Trace Gas Orbiter thermal infrared observations into the LMD Mars GCM using the LETKF

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1/2 Earth's radius, 50% further from the Sun  
Similar rotation rate,  $\sim 2\times$  year length

Highest point 26km above surroundings  
Southern hemisphere  $\sim 5\text{km}$  above northern hemisphere  
Two tiny moons

96%  $\text{CO}_2$  atmosphere  
Permanent  $\text{CO}_2$ , temporary  $\text{H}_2\text{O}$  polar icecaps  
1/3 of atmosphere condenses onto poles during winter

1% Earth's surface pressure  $\rightarrow$  strong daily cycle  
Similar axial tilt + elliptical orbit  $\rightarrow$  strong seasonal cycle

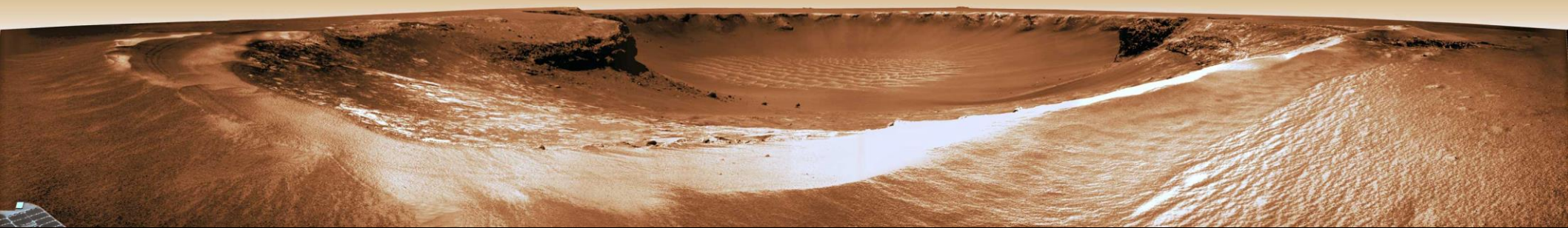
Dust critical to the environment  
Similar to water on Earth: keeps visible light out  
keeps infrared light in



Mars

Tharsis Plateau from *Mars Express*

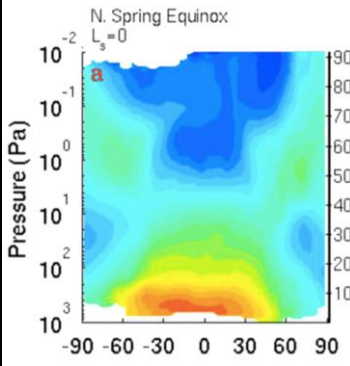
Victoria Crater from *Opportunity*



# Climate, orbit, and seasons

Competing effects determine climate (in ~order of importance):

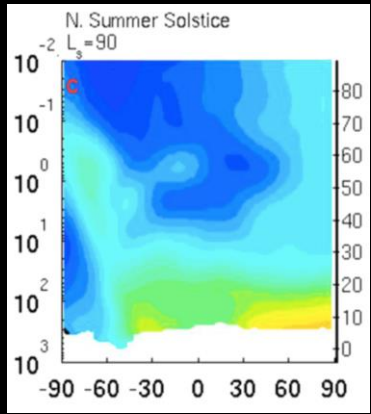
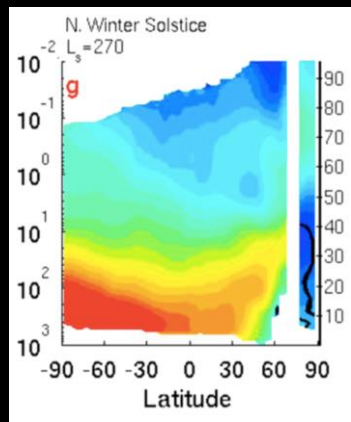
1. Season
2. Planet's distance from Sun
3. Dust activity
4. Surface altitude



Cool poles  
Warm equator  
Start of **clear** season

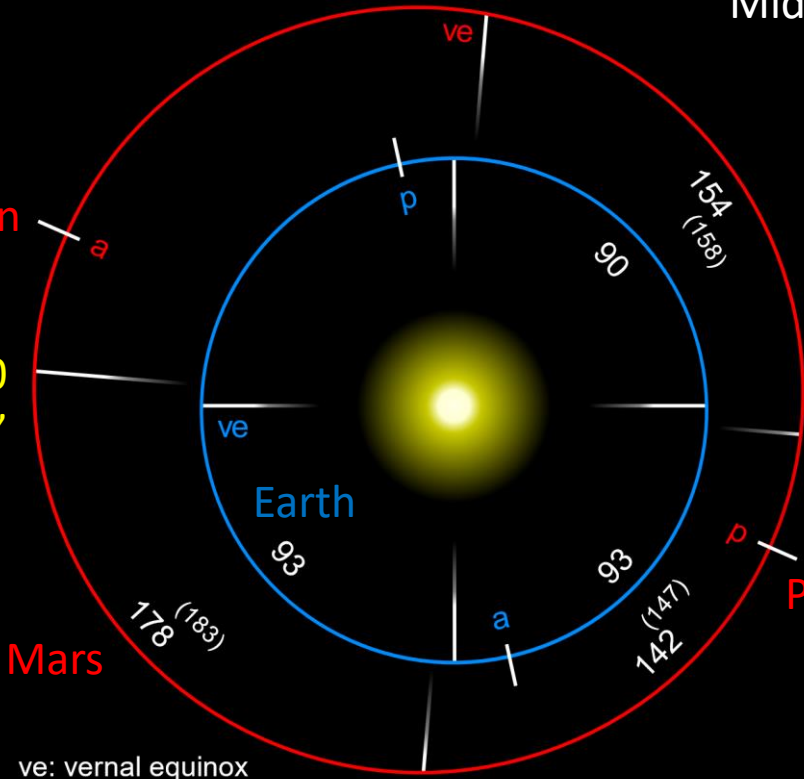
$L_s = 0$  "March"

Cold (150K) northern winter  
Warm (250K) southern summer  
Temporary northern CO<sub>2</sub> cap  
Middle of **dusty** season



$L_s = 90$   
"June"

Very cold (120K) southern winter  
Mild northern summer (200K)  
Temporary southern CO<sub>2</sub> icecap  
Middle of **clear** season

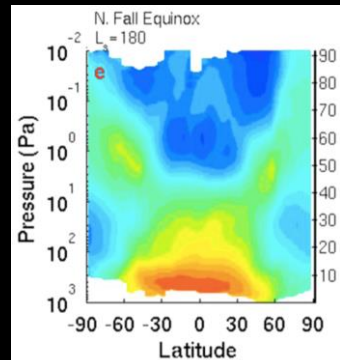


$L_s = 270$   
"December"

Perihelion

$L_s = 180$  "September"

ve: vernal equinox  
p: perihelion  
a: aphelion



Cool poles  
Warm equator  
Start of **dusty** season

Panels show night-time temperatures measured by *Mars Reconnaissance Orbiter*  
[McCleese+ 2010]

1 year = 668.6 "sols"  $\approx$  687 Earth days



# LMD Mars Global Climate Model

State of the art GCM for Mars:

100s of papers using the model or the *Mars Climate Database* by many groups worldwide

Solves the fluid equations on a rotating sphere (“hydrostatic primitive equations”)  
+ representations of the following physical processes:

Radiative transfer

Diurnal and seasonal cycles

“Two-moment” dust transport scheme

Radiatively active dust

Topography

Water cycle + icecaps

CO<sub>2</sub> condensation, clouds, + icecaps

Radiatively active water ice clouds

Boundary layer + small scale convection

Subsurface temperature model

Surface-atmosphere interactions

“Rocket” dust storms (to come, next generation)

Gravity wave drag (to come, next generation)

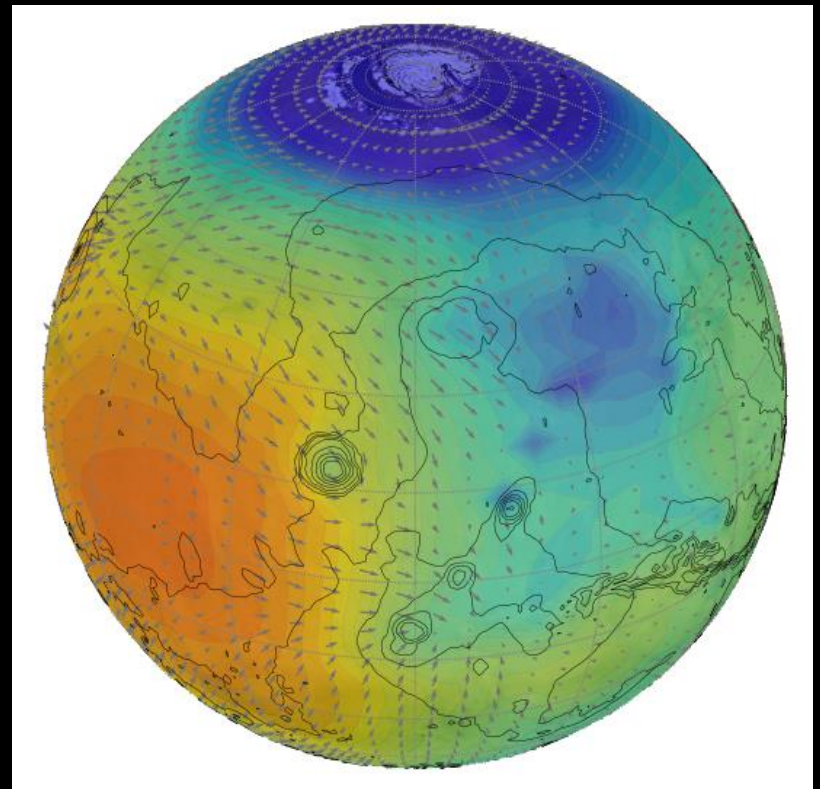
Ionosphere

Thermosphere

Many non-condensable species

Etc...

[Green: Main sources  
of model error]



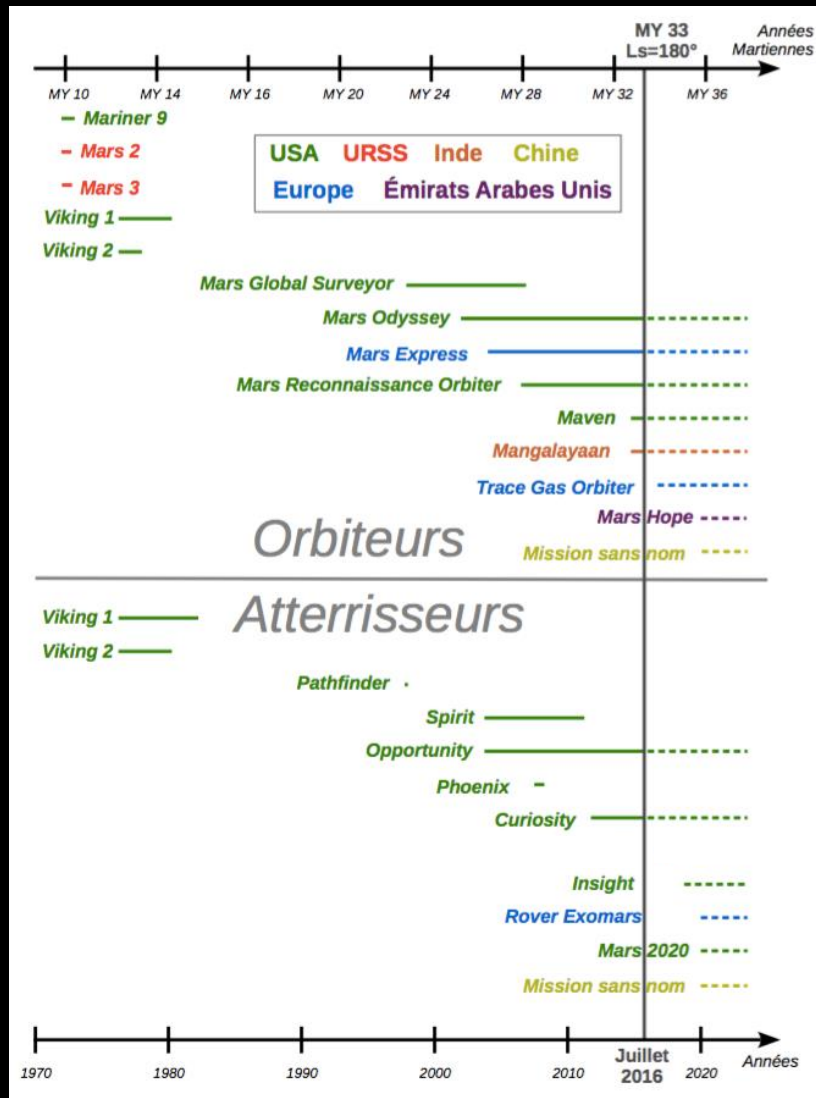
[<http://www-mars.lmd.jussieu.fr>]

Development: Forget et al. (1999)  
and many subsequent references

Validated and tuned against many orbiter  
and lander datasets since Viking (1970s)

# Past and current exploration of Mars

Spacecraft that have successfully reached Mars



Mostly  
Atmosphere  
studies



Mostly  
geological  
studies

## Currently 6 orbiters:

- 3 NASA, 2 ESA/Russia, 1 India
- Good spatial coverage
- Vertically-resolved measurements
- No wind/pressure measurements
- Limited local times of day

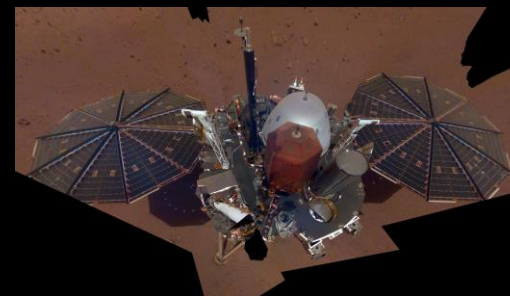
## Currently 2 NASA surface platforms:

- Measurements of wind/pressure
- Excellent time resolution
- Full diurnal cycle
- Only one point

Curiosity rover

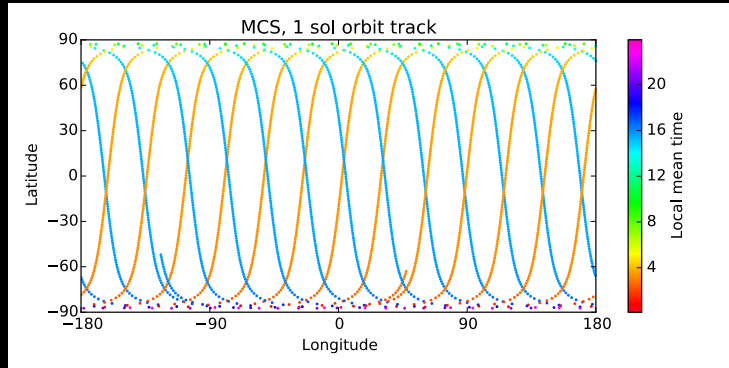


Insight lander



# Mars data assimilation – state of the art

## Orbit track for Mars Reconnaissance Orbiter, 1 sol



State-of-the-art is to assimilate data from *one* polar orbiting satellite

All assimilation schemes (since first work in 1990s) assimilate **atmospheric temperature profiles** + **Dust column opacities** since 2005 (most schemes)

Most extensive work has used **analysis correction** scheme  
Ensemble methods (**LETKF**) in use since ~2010

One attempt to assimilate **thermal IR radiances** (2011)

Recent work focuses more on assimilating aerosols:

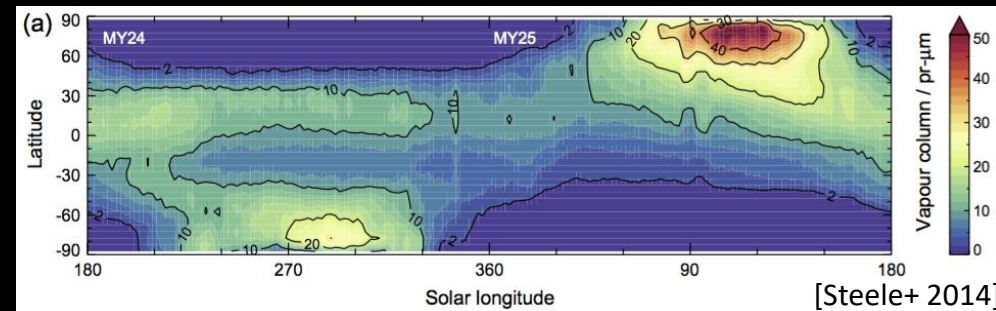
- **Water ice** profiles (2014)
- **Water vapour** column opacity (2014)
- **Dust profiles** (2015-)
- **Ozone** column opacity (2018)
- **Carbon monoxide** column opacity (2019)

No dedicated assimilation of **lander data** yet  
(used mostly for verification)

There are many contemporaneous datasets  
But most work has focused on assimilating one dataset, a few at most

## Water vapour column assimilation

Mars' water cycle is dominated by seasonal evaporation / deposition at polar caps, and transport to and from them



[Steele+ 2014]

## Ozone column assimilation

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[Holmes+ 2018]

# Direct and indirect assimilation in the LMD Mars data assimilation scheme

**Assimilation scheme:** LETKF, 16 ensemble members, adaptive covariance inflation, no bias correction

**Indirect assimilation:** Directly assimilate quantity  $\alpha$ :  $\bar{\mathbf{x}}_{\alpha}^a = \bar{\mathbf{x}}_{\alpha}^b + \mathbf{X}_{\alpha}^b \mathbf{W}_{\alpha}^a$   
Assimilate quantity  $\beta$  using observations of  $\alpha$ :  $\bar{\mathbf{x}}_{\beta}^a = \bar{\mathbf{x}}_{\beta}^b + \mathbf{X}_{\beta}^b \mathbf{W}_{\alpha}^a$

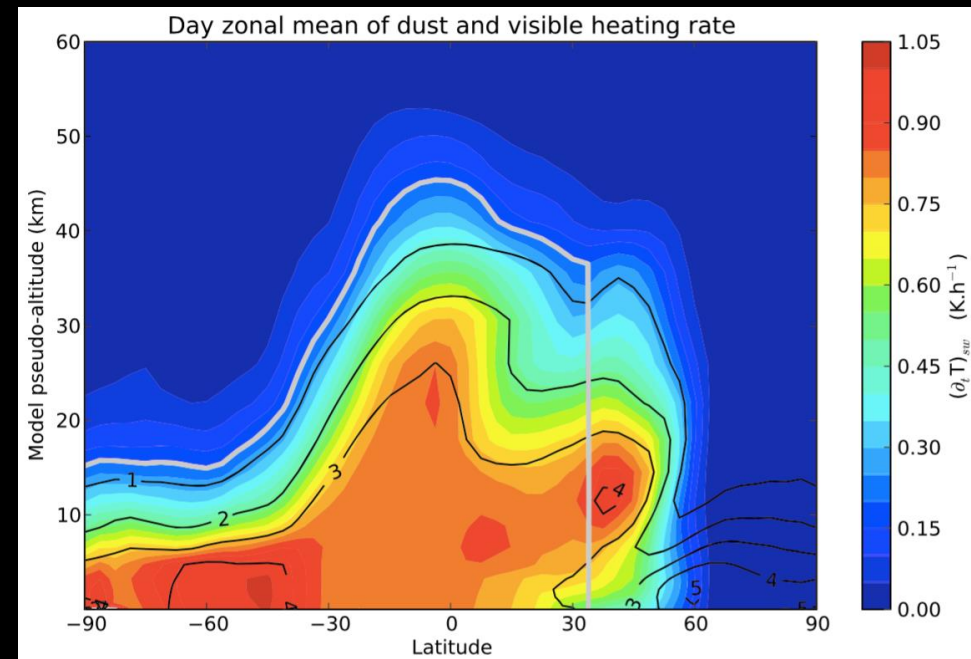
**Directly-assimilated quantities (so far):**

- Atmospheric temperature (vertical profiles)
- Density-scaled dust opacity profiles (MCS only)
- Density-scaled water ice opacity profiles (MCS only)

**Indirectly-assimilated quantities:**

- TuPs: Surface pressure  
[Observed: Atmospheric T at lowest model level]
- TuUV: Zonal and meridional velocities [Obs: T]
- TuD: Dust mass mixing ratio and number of particles [Obs: T where daily insolation  $> 100 \text{ W m}^{-2}$  and local solar heating rate  $> 0.2 \text{ K hr}^{-1}$ ]

“Temperature updates Dust” (TuD)  
applied below the grey line



[Navarro+ 2014]

**All other simulated quantities adjust dynamically during forecast step**



# ExoMars Trace Gas Orbiter



**Main goal:**  
To search for rarefied gases  
e.g. methane, HDO, other  
compounds relevant to life

Inserted into Mars orbit on 19 Oct 2016

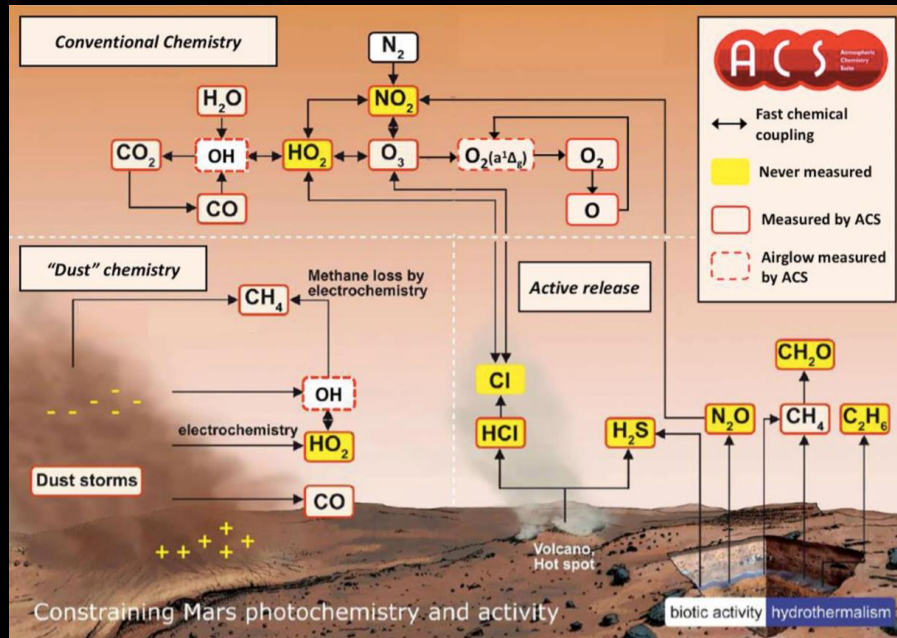
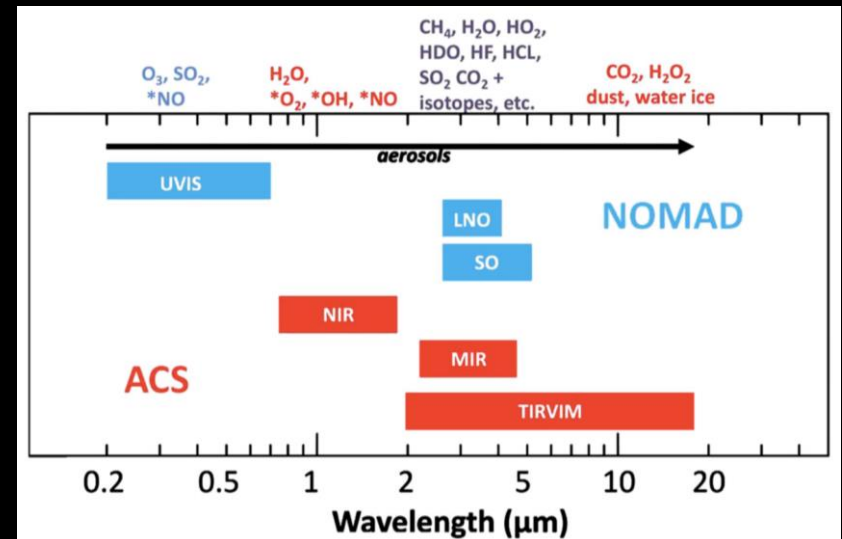
“Aerobraking” put spacecraft into  
low orbit during 2016-2017

Reached final 400km circular 75°  
inclination orbit on 7 Apr 2018

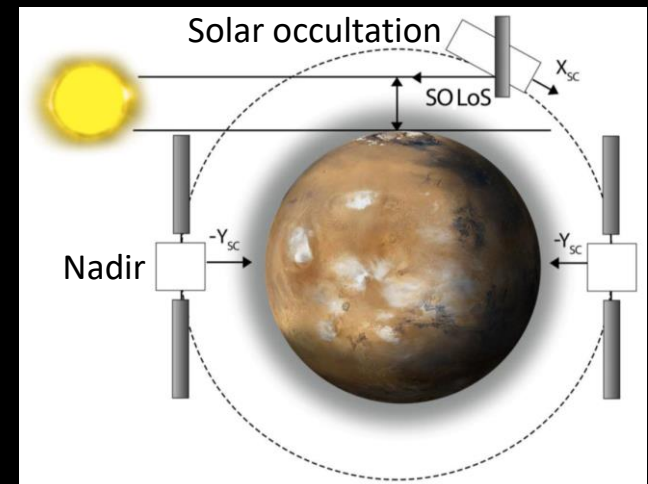
Orbit sees all  
local times over  
a 55-sol cycle

## Instruments:

ACS (three infrared spectrometers)  
CASSIS (stereo visible imaging camera)  
FREND (neutron detector — subsurface)  
NOMAD (3 infrared/UV spectrometers)



Instrument  
viewing  
geometry



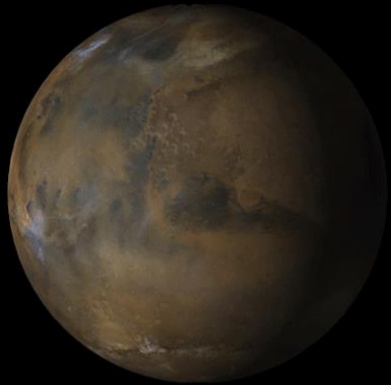


# 2018 Mars Global Dust Storm

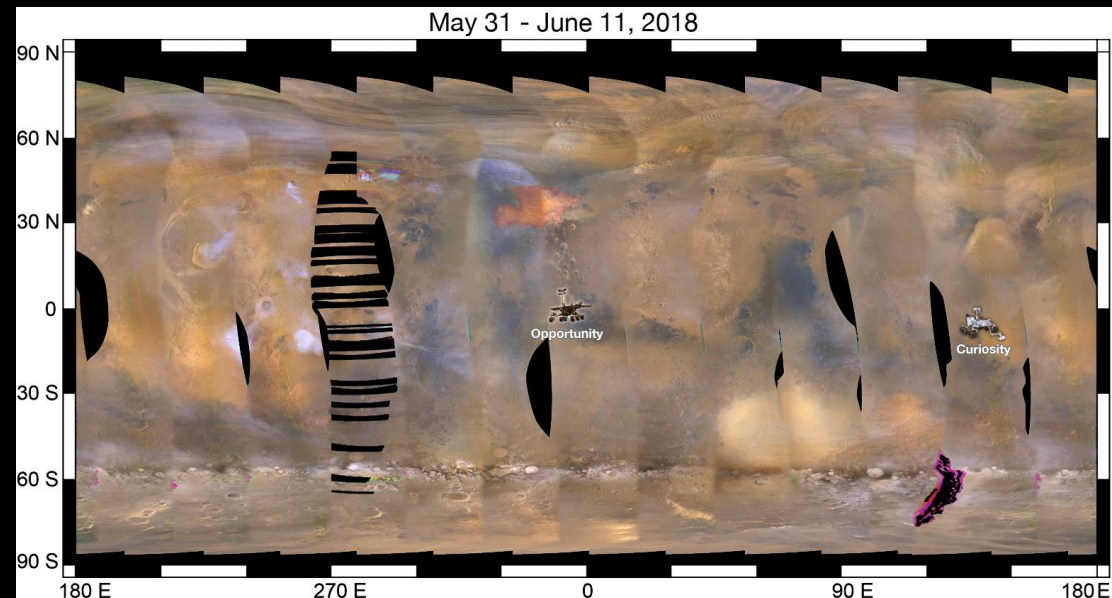
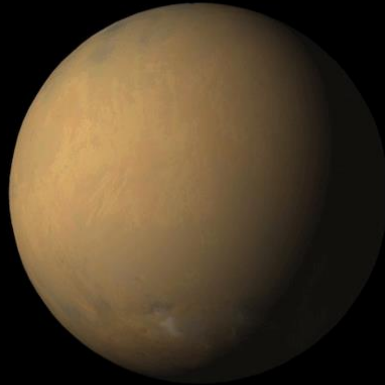
Global Dust Storms occur every 3-4 Mars years

Development of the storm (dust in dark orange)

May 2018



July 2018



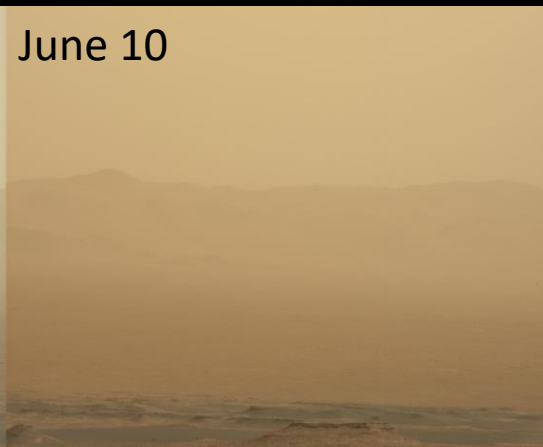
*NASA Mars Reconnaissance Orbiter*

The view from *NASA Curiosity*

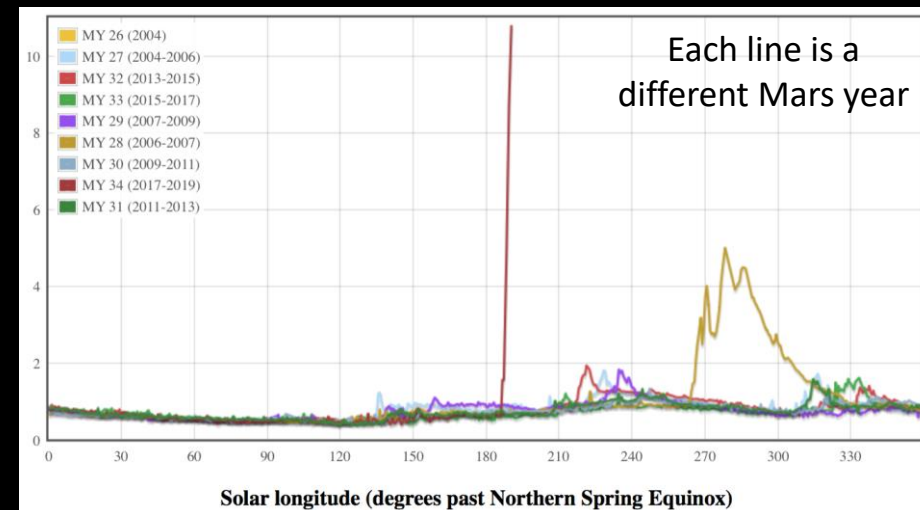
June 7



June 10



Dust opacity measured by *NASA Opportunity*



# Assimilation during the Mars Year 34 Global Dust Storm: 26 May – 15 July 2018

What effect does the Global Dust Storm  
have on Mars' general circulation?

Observations assimilated:

Atmospheric temperature profiles from  
ACS/TIRVIM, retrieved from nadir thermal  
emission spectra at LMD by Sandrine Guerlet

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Free GCM run alongside, using  
MCD 'climate' dust scenario

This model represents the  
atmospheric state and its evolution  
during a typical year *without* a  
global dust storm

Available ACS observations up to 15 July 2018

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MCS 9.2 $\mu$ m dust optical depth at 610 Pa, red = 2.4

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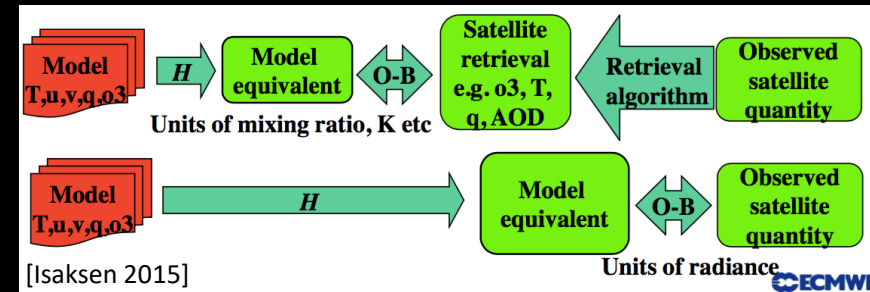
[Montabone+ 2019]



# TIRVIM **observation operator**: $\mathbf{x}^a = \mathbf{x}^b + \mathbf{K} \left( \mathbf{y}^o - H(\mathbf{x}^b) \right)$

What would a retrieval look like if TIRVIM observed an atmosphere that took the form of the background  $\mathbf{x}^b$ ?

1. **Interpolate**  $\mathbf{x}^b$  to profile position and pressures, linear in lon, lat,  $\ln(p/p_{\text{surf}})$ , t.
2. Use **averaging kernels** to retrieve what ACS would see:  $H(\mathbf{x}^b) = \mathbf{x}^p + \mathbf{A}(\mathbf{x}^b - \mathbf{x}^p)$  [Rodgers & Connor, 2003]. Prior  $\mathbf{x}^p$  and averaging kernels  $\mathbf{A}$  are same as for observations  $\mathbf{y}^o$ .



Highest sensitivity  
where kernel sum  $\approx 1$

Observations and  
forecast  $\approx$  prior  
where kernel sum is  
small – instrument  
not sensitive here

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Interpolation and  
final observed  
background similar  
where kernel sum  
 $\approx 1$

# Temperature evolution at 100Pa, 3PM local time

## LETKF analysis

obtained by  
assimilating ACS  
temperature  
profiles

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## Free-running model

using climate dust  
scenario

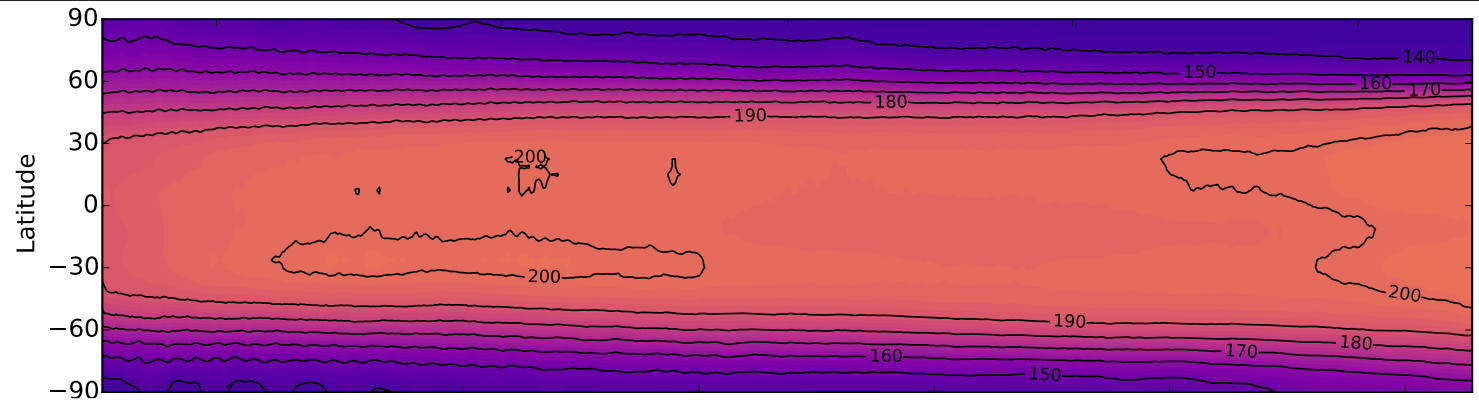


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## Independent temperature observations

from MRO-MCS



# Temperature cross-section, 3PM local mean time, sols 412–416

Free-  
running  
GCM

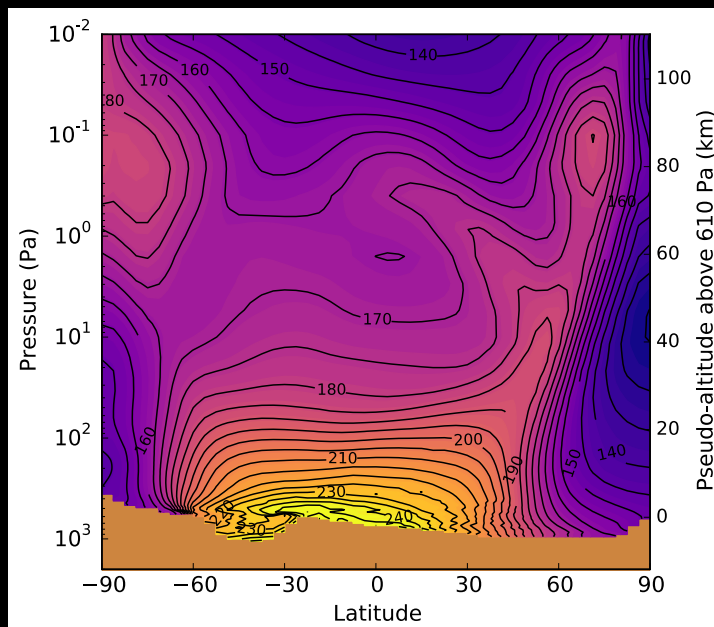


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LETKF  
analysis

Difference:  
Analysis -  
GCM

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Independent  
MCS  
observations

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# Dust distribution, 3PM local mean time, sols 412-426

Density-scaled dust opacity at  $21.6\mu\text{m}$   
Units are  $10^{-4} \text{ m}^2 \text{ kg}^{-1}$

Dust updated using ACS temperature retrievals only

Free-running GCM

LETKF analysis

Independent MCS  
observations

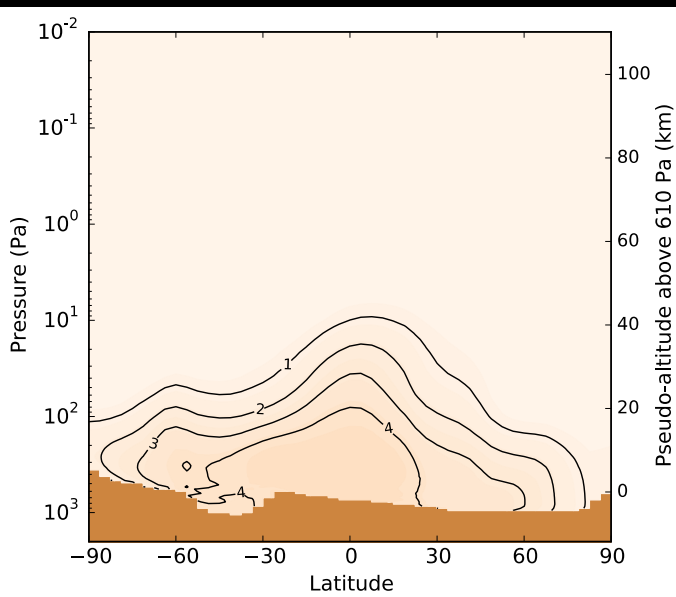


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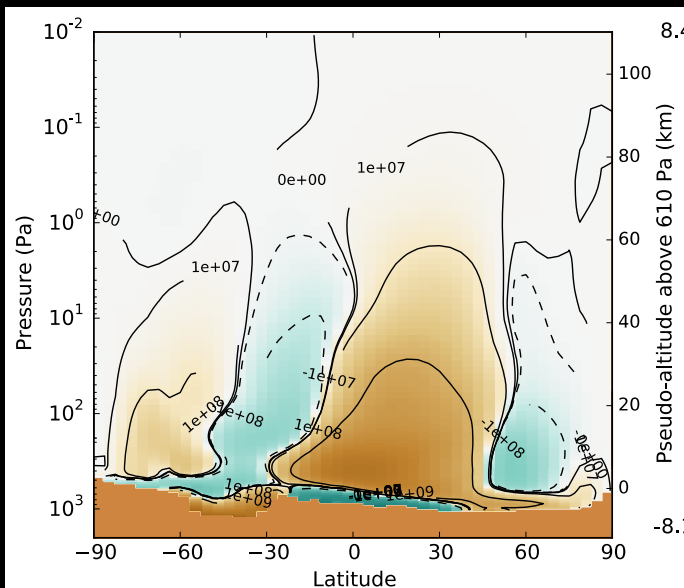


# Effect of the Global Dust Storm on the meridional circulation

Meridional mass stream function: **An unobserved quantity retrieved by the assimilation**

Contours of the mass stream function show direction of air mass transport

Free-running GCM



LETKF analysis

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Difference:  
Analysis – Free GCM

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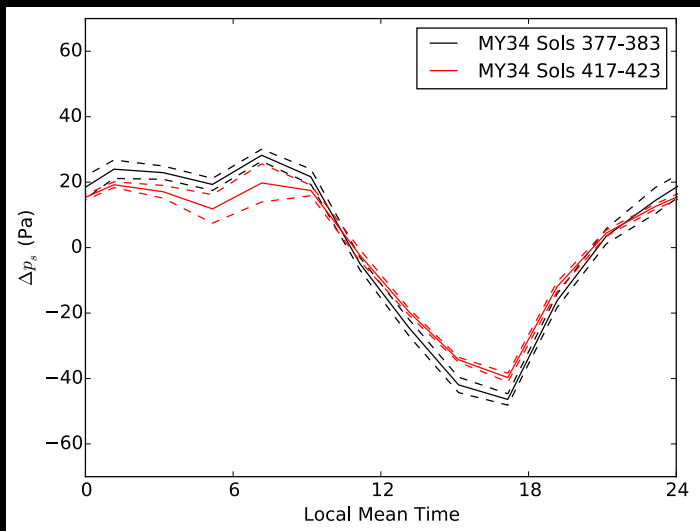
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Zonal mean, averaged over sols 412–416  
Brown = Clockwise  
Red = More clockwise

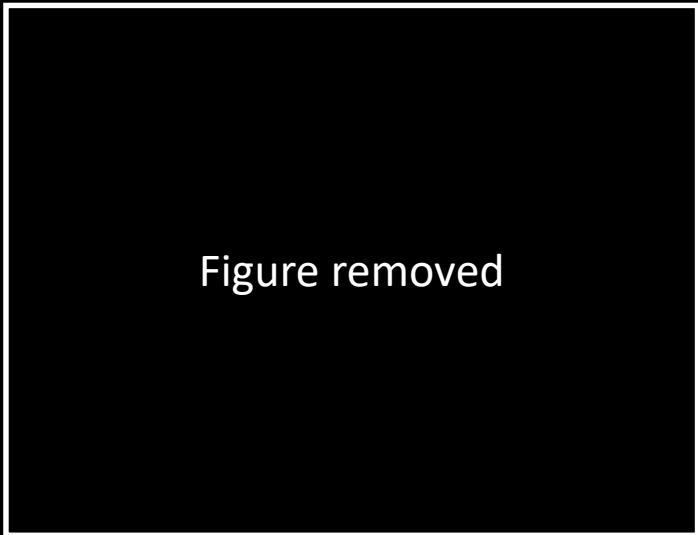


# Independent verification against Curiosity surface pressure data

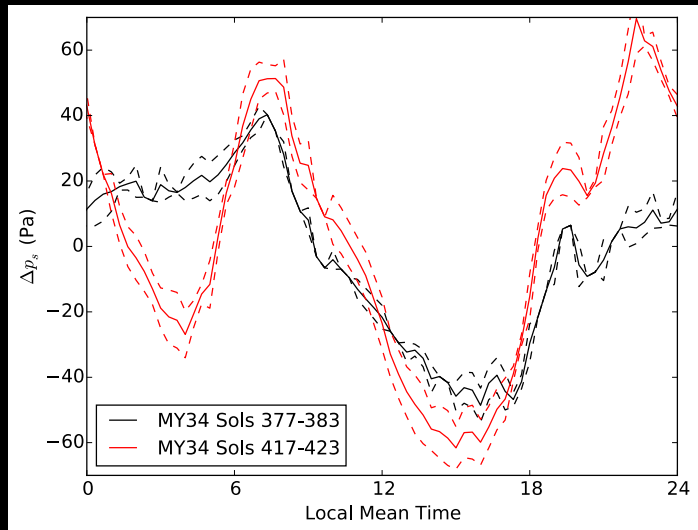
Free-running GCM



LETKF analysis



Curiosity observations



Surface pressure interpolated to Curiosity location and corrected for true surface elevation

Daily mean subtracted to show diurnal, semi-diurnal tide modes

Solid: Mean over 6 sols. Dashed: Mean  $\pm$  1 SD

Black: Before GDS, sols 377-383

Red: During GDS, sols 417-423

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# Next steps for ACS-TIRVIM assimilation

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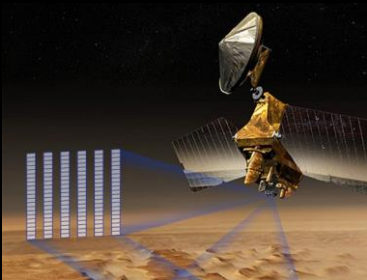
ACS-TIRVIM operational mode  
since ~September 2018

Assimilate ACS and MCS simultaneously  
throughout MY34

Assimilate surface temperatures –  
not done before at Mars

MCS and ACS-TIRVIM are complementary:

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← MRO-MCS:  
High vertical resolution  
(limb sounder), more complete time  
coverage, but only two local times,  
can sound down to 10km altitude

ExoMars ACS-TIRVIM: → Lower vertical resolution, complete local time  
coverage over 55 sols, poorer time coverage, but can sound nearer surface

