

Mars Atmosphere Data Assimilation workshop at Savoie, France. 17:30 - 18:00, 29th, Aug., 2018



Venus AFES LETKF Data Assimilation System (VALEDAS)

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Akira Yamazaki (JAMSTEC), Toru Kouyama (AIST), Hiroki Kashimura (Kobe University), Takeshi Enomoto (Kyoto University), Masahiro Takagi (Kyoto Sangyo University) 1. Introduction [#]Atmospheric GCM For the Earth Simulator
 AFES[#] project for planetary atmosphere
 (Y.-Y. Hayashi, Y. O. Takahashi, W. Ohfuchi, T. Enomoto, etc)
 To understand the varieties of global circulation in planetary atmospheres
 Mars, Venus, Jupiter, Aqua-planet...
 Common framework of the Atmospheric GCM (AFES)













Computational Efficiency

■ AFES (<u>AGCM For the Earth Simulator</u>)

Optimized for parallel vector super computer

(T639L96 simulation for Mars (Takahashi et al.)

grid intervals ~11 km (1920 × 960 grids with 96 layers)

Node number	64 node	Mars T639L96 simulation (Vorticity distribution)
Vector efficiency	99.4%	Year 1, Ls = 198.7 degrees, 0.0 hour vorticity $(1e-5, s-1)$
Parallel efficiency	99.8%	90 90 90 90 90 90 90 90 90 90 90 90 90 9
CPU time	1 Martian days/~4 hours	(ed ed e
		-30 -0 -0 -0 -0 -0 -0 -0 -0 -0 -0 -0 -0 -0
		Longitude (degree) T; trancation wavenumbers L; vertical layers

<u>Venus</u>

Solid part of Venus is similar to that of Earth but ...

- Rotation period: 243 days, Solar day: 116 days. Cloud layer rotates about 4 days, "super-rotation" is not revealed.
- **Dynamical regime is different from those on the Earth and Mars.** Circulation below the cloud is unknown because of dense cloud.



http://www.isas.jaxa.jp

Less observations and reproducibility of Venus GCM than Mars

Akatsuki -Venus elimate orbiter-

Observations have stared from Dec. 2015.

Frequent meteorological observations at multiple altitudes (Nakamura et al., 2011, 2014...)



AFES-Venus

Atmospheric GCM (For the Earth Simulator) for Venus
 ✓ Dynamical GCM; high resolution, simple idealized physics.
 ✓ Conserves angular momentum; reproduction of super-rotation.

AFES-Venus results



Sugimoto et al. (2014a, b...)

Machado et al. (2014)

Observations: Doppler measurements



Akatsuki and AFES-Venus

AFES-Venus reproduces phenomena of the Venus atmosphere.



Akatsuki IR2

OMG (sig = 4E-3)



(Kashimura et al., Nature Com., revision submitted.)

Data assimilation of Venus has now become realistic!

Latitude-height distribution of the zonally and temporally averaged static stability



Static stability distributions obtained by RO (314 points) and AFES-Venus are also qualitatively consistent with each other. (Ando et al., in preparation) 2. VALEDAS (VAFES; Venus AFES = AFES-Venus)
 2. VALEDAS (VAFES-LETKF data assimilation system)
 LETKF (Local Ensemble Transform Kalman Filter)
 Already used for Earth (ALERA*) and Mars
 (Hunt et al., 2007; Miyoshi et al., 2007...; Hoffman et al., 2010)
 *AFES-LETKF experimental ensemble reanalysis

 $t=t_{i+1}$

 $t=t_i$

Local: considers only observations within a certain distance. Ensemble: uses an *ensemble* of GCM forecasts.

Transform: uses a square-root filter.

Kalman Filter: uses past information to update the present state, and estimates both the state and its uncertainty (covariance)



Estimate variance by ensemble forecasts: easy to implementation

Quick summary of preliminary results

We have developed a data assimilation system for Venus (VALEDAS; VAFES-LETKF data assimilation system).

Test observations; horizontal winds at the cloud top level ①Idealized: AFES-Venus runs

(2)Real: Venus Monitoring Camera (VMC/VEX)

Both observations include thermal tide but AFES-Venus forecasts forced with solar heating exclude thermal tide.

 \Rightarrow Thermal tide appears by the data assimilation.

The development system works well!!

Experimental setting

AFES-Venus

- Dry 3-D Primitive equation on sphere
- Resolution: T42L60 ($128 \times 64 \times 60$ grids)
- Specific heat: Cp is constant (1000 Jkg⁻¹k⁻¹)
- Horizontal hyper-viscosity: 0.1 Earth days for 1/e
- Vertical eddy viscosity: 0.15m²s⁻¹
- Rayleigh friction: lowest and above 80km
- No topography and planetary boundary

✓ Solar heating

- Zonal (Qz) and diurnal (Qt) component of realistic heating
- Based on Tomasko et al. (1980) and Crisp (1986)
- ✓Infrared radiative process
 - Newtonian cooling: $dT/dt = -\kappa (T-T_{ref}(z))$ κ : based on Crisp (1986) $T_{ref}(z)$: horizontally uniform field



Lat

AFES-Venus runs

Cases	Solar heating
Qz	Zonal mean only
Qt	Including diurnal
	variation

• Test observations: horizontal winds at the cloud top level (70 km)

- Idealized: AFES-Venus runs: Qt (solar heating including diurnal variation)
- Real: VMC; Venus Monitoring Camera (73 obs. in Epoch 4: 28 Jan to 26 Apr 2008)

	Test observations				
Case	Obs	interval	AFES		
H1	Qt	1h	Qz		
H6	Qt	6h	Qz		
H24	Qt	24h	Qz		
Vmc	VMC	~24h	Qz		
Frf	None	None	Qz		
AFES-Venus runs					
Cases Solar heating					
Qz Zonal mean only					
Qt	Including diurnal variation				



Kouyama et al. (JGR 2013)

VALEDAS (VAFES-LETKF data assimilation system)

- ✓ Ensemble size: 31-member
- ✓ assimilation cycle: 6-hourly interval
- ✓ Localization: horizontally 400 km, vertically lnP~0.4
- ✓ Observational errors: 4.0 m/s
- ✓ Inflation:10 %



- ✓ 9-hour forecast from t=0 and use from t=3 to t=9 for the assimilation
- ✓ Input observations from t=3 to t=9 and output reanalysis at t=6 (=4D LETKF)

Test results

Vertical structure (Case H24) at the equator



Thermal tide <u>propagates in the vertical direction</u> in Case H24 (once a day only for horizontal winds) even for the temperature field.

How much each obs. improves model forecast?

Implementation of EFSO (Ensemble Forecast Sensitivity to Observations)

Kalnay et al. (2012 Tellus), Ota et al. (2013 Tellus), Hotta et al. (2017 MWR)



- ✓ Forecast Sensitivity to Observations (FSO) done automatically by ensemble run.
- ✓ Estimate impacts of specific observations diagnostically (without data denial exp.).

No need for Observation System (Simulation) Exp. (OS(S)E) and adjoint model.

Test of EFSO (Case H1)

✓ Correlation 80.64%; EFSO works well *but overestimates a little*



3. Future work B Reanalysis data for Venus produced by VALEDAS

Akatsuki data assimilation with diurnal solar variation run.



Data assimilation of Akatsuki continuous obs.

We have planed 2-hourly continuous obs. during 20 days (Dec. 2018).

Test for Akatsuki obs. (with diurnal solar variation run)

Dayside horizontal winds of VMC/VEX at 70 km only once a day are assimilated.

Vertical structure at the equator

Without data assimilation (thermal tides in AFES)

With data assimilation (phase is improved)



Sugimoto et al. (2018) in preparation

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✓ With Akatsuki (Temp.) more realistic structure would be reproduced.

 \checkmark But we need more frequent obs. to reproduce high frequency waves.

Radio occultation by multiple satellites for Venus

✓ Test data assimilation with EFSO gives useful information to propose better orbits ⇒ Contributes to future Venus missions



http://www.cosmic.ucar.edu/related_papers/GPS_RO_cartoon.jpg

Improvement of AFES-Venus

- ✓ Implementation of cloud physics (by Dr. Ando and Takagi)
- Implementation of radiation process (by Dr. Sagawa)





Data assimilation of clouds and radiance would be possible by implementation of physical processes.

Galileo obs.: many clouds are at pole, few at mid-latitude. Carlson et al. (1991)

Cloud mass loading (48 km) T= 0.00 DAYS



Summary

Venus AFES LETKF Data Assimilation System* is introduced.

 \checkmark The mechanism of the super rotation has not been revealed so far.

• There is no GCM that reproduces realistic super rotation from a motionless state with realistic setting by the long time integration.

✓ AFES-Venus enables to maintain realistic super-rotation and reproduce atmospheric motions near the cloud level.

- Several interesting results have been obtained and analyzed so far.
- It is necessary to compare our results with obs. and other GCMs, consider more realistic model settings, and improve GCM physical processes.

VALEDAS* is the first data assimilation system for the Venus atmosphere.

- Produce reanalysis datasets by the data assimilation of Akatsuki obs.
- Estimate impacts of past real and future observations by EFSO.
- It would be possible to assimilate other obs., such as cloud opacity and radiance, by improvement of physical processes of AVES-Venus...

References

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- A. Yoshizawa, H. Kobayashi, <u>N. Sugimoto</u>, N. Yokoi, and Y. Shimomura, A Reynolds-averaged turbulence modeling approach to the maintenance of the Venus superrotation, *Geophysical and Astrophysical Fluid Dynamics*, Vol.107, No.6, (2013), p614-639.
- <u>N. Sugimoto</u>, M. Takagi, Y. Matsuda, Y. O. Takahashi, M. Ishiwatari, and Y.-Y. Hayashi, Baroclinic modes in the atmosphere on Venus simulated by AFES, *Theoretical and Applied Mechanics Japan*, Vol.61, (2013), p11-21.

Thermal tide (VMC/VEX)



Clear local minimum around noon. Morning and evening regions show faster.

Thermal tide (AFES-Venus; 70 km)

Takagi et al. (JGR2018)



Thermal tide (Akatsuki RO & AFES-Venus)



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Test orbit by two satellites (provided from Dr. Chi AO)

- ✓ Almost uniform horizontal coverage
- ✓ Time intervals are 2h or 4h alternately



30 days, two counter rotating s/c at 300 and 3000 km, 90 deg incl

We can estimate how much observations improve GCM forecasts



Yamazaki et al. (2018?)

Two types of ensemble runs are performed to estimate impacts of observations.

1. Why Venus?



Mystery of Venus's atmosphere "Super rotation" (fast zonal flow)



Venus spins in the opposite direction from Earth (retrograde, or backward, rotation)

Mechanism of the super rotation

- 1. Mean meridional circulation MMC (Gierasch 1975)
- 2. Thermal tide (Fels & Lindzen, 1986)



Venus GCM studies

Super rotation might be driven by both mechanism

- ✓ Mean meridional circulation (Yamamoto & Takahashi(YT), 2003...)
- ✓ Thermal tides (Takagi & Matsuda, 2007...)

Basically, starting from motionless state, <u>long time integration</u>, <u>low resolution</u>, <u>not realistic solar heating and static stability</u>

References	Horizontal reso	Vertical grid	
Yamamoto & Takahashi (2003)	T10 (~ 11° × 11°)	32×16 grids	50 levels
Lee et al. (2005)	5° × 5°	72×36 grids	32 levels
Kido & Wakata (2008)	T21 (~ 5.6° × 5.6°)	64 × 32 grids	60 levels
Takagi & Matsuda (2007)	≦T21 (~ 5.6° × 5.6°)	64 × 32 grids	60 levels
Lebonnois et al. (2010)	7.5° × 5.6°	48 × 32 grids	50 levels
Parish et al. (2011)	$1.2^{\circ} \times 0.9^{\circ}$	300 × 200 grids	50 levels

GCMs: large computational cost for high resolution run Obs.: difficulty to observe MMC and inside cloud layer

Hollingsworth et al. (GRL2007)



Figure 4. As in Figure 2 but for a simulation that uses a more realistic diabatic heating in the lower atmosphere (i.e., below 35 km).

With realistic diabatic heating, weak super rotation results.

Mean Meridional Circulation (i.e., Hadley circulation) consists of numerous cells.

Further Venus GCM studies

Intercomparison project

 Super rotations are quite different among the models

Multiple equilibrium? Waves or Missing processes?

More realistic GCM

- Radiation (Ikeda2011, Lebonnois2015)
- Gravity wave parameterization
- ✓ Microphysics (YT2006)
- ✓ Topography (*Lebonnois et al., 2010*)
- ✓ Middle atmosphere (*YT2011, Gilli2015*)
- ✓ Non-hydrostatic (*Mingalev et al., 2012*)



Lebonnois et al. (2013)

Akatsuki

20th, May, 2010. Launched aboard an H-IIA rocket.
6th, Dec, 2010. Failed to enter orbit around Venus. Trouble for main engines.
7th, Dec, 2015. Enter an alternative elliptical Venusian orbit by firing its attitude control thrusters.

A. Gunto

VCO (Venus <u>Climate</u> Orbiter)

To understand Venus climate

Satellite observation



Venus Climate Orbiter (Akatsuki from 2016)

Numerical simulation



Super computing system (Earth simulator) (https://www.jamstec.go.jp/j/kids/press_release/20101117/)

Observe temperature, wind, cloud and constituents distribution, and lightning...

Elucidate generation and maintenance mechanisms for observed phenomena
High resolution AFES-Venus run on the Earth Simulator

Our strategy

Start from idealized super rotation

✓ Saving computational cost for high resolution run

Maintain super rotation with realistic setting

 \checkmark under the realistic solar heating and static stability without artificial forcing

Targets

Focus on atmospheric motions near the cloud level

- ✓ Baroclinic instability; Not observed but predicted theoretically (Sugimoto et al., JGR2014)
- ✓ Neutral waves; Observed by cloud images but unexplained (Sugimoto et al., GRL2014)
- ✓ Thermal tide; Elucidate its role, horizontal and vertical structures (*Takagi et al., JGR2018*)
- ✓ Energy spectra; Traditional analysis on Earth but no Venus case (Kashimura et al., in prep.)
- ✓ Polar vortex; "Axi-asymmetric" structure observed in VIRTIS (Ando et al., JGR2017)
- ✓ Cold collar; Cold latitudinal band not reproduced in GCMs (Ando et al., Nature Com.2016)

Now we perform T42L60 ~ T319L240, T639L260 run

2. AFES-Venus see Sugimoto et al. (JGR2014a)

Model description

- ✓ 3-D Primitive equation on sphere (hydro static balance) without moist processes
- ✓ Resolution: T42L60, T63 to T639L120 ($\Delta x \sim 20 \text{km} \Delta z \sim 1 \text{km}$), T319L240...
- ✓ Specific heat: Cp is constant (1000 Jkg⁻¹k⁻¹)
- ✓ Horizontal hyper-viscosity: 0.1(T42) to 0.003(T639) Earth days for 1/e
- ✓ Vertical eddy viscosity: $0.15m^2s^{-1}$
- ✓ Rayleigh friction: lowest and above 80km(sponge layer except for zonal flow)
- No topography and planetary boundary layer

Solar heating

- ✓ Zonal and diurnal component of realistic heating
- Based on Tomasko et al. (1980) and Crisp (1986)

Infrared radiative process

- ✓ Simplified by <u>Newtonian cooling</u>: $dT/dt = -\kappa (T-T_{ref}(z))$ κ : based on Crisp (1986)
 - T_{ref}(z): horizontally uniform field



Initial condition: Super-rotation

- Zonal flow increases with height linearly from ground to 70 km. 100 m/s above 70 km (const.).
- ✓ Meridional distribution: solid-body rotation.
- Temperature field is in balance with zonal flow field (gradient wind balance).
- Static stability: $\Gamma(z) = dT/dz + g/Cp$

Mimic observed realistic static stability.





Summary results

- **Realistic super-rotation is reproduced** (more than 10 Earth years).
 - \checkmark Acceleration in equatorial region by thermal tides (120m/s).
 - ✓ Temperature difference between equator and pole; more than 25 K.



Super-rotation near the cloud

- Constant velocity at equatorial region with weakly mid-latitude jets.
- ✓ Close agreement with observations. (for the first time in GCM)

AFES results

Observations: Doppler measurements



Machado et al. (2014)

Thermal tide transports angular momentum equatorward

MMC and thermal tide mechanisms



Takagi et al. (in prep)



Y-shape would be caused by baroclinic wave (Sugimoto et al., JGR2014 & GRL2014)



Ando, H., <u>N. Sugimoto</u>, M. Takagi, H. Kashimura, T. Imamura, and Y. Matsuda, **The puzzling Venusian polar atmospheric structure reproduced by a general circulation model,** *Nature Communications*, Vol. 7, (2016), 10398, p1-8.



2016/02/02 Press release

[プレスリリース] 金星極域の高温の生成・維持メカニズムを理論的に解明

Asahi newspaper

研究

2016/02/01 国立研究開発法人 宇宙航空研究開発機構 慶應義塾大学 京都産業大学

国立研究開発法人宇宙航空研究開発機構(JAXA)の安藤紘基宇宙航空プロジェクト研究員および慶應義塾 大学の杉本憲彦准教授らによる研究チームは、大規模なコンピュータシミュレーションから、金星の極域上 空の大気に生じている特異な気温分布を世界で初めて再現し、その生成・維持メカニズムを理論的に解明す ることに成功しました。

Morning newspaper 2016/02/02

192 198 204 210 216 CONTOUR INTERVAL = 2.000E+00





Thermal tide (70 km)

Takagi et al. (JGR2018)





Dark region observed by UV



The UV dark regions have been observed in the subsolar and early afternoon regions in the observations and might be produced by the dark material transported from the lower cloud layer by upward motions. This is consistent with AFES-Venus results and indicates that the upward motions are caused by SS-AS circulation (of diurnal tide).

he atmosphere rotates from right to tours of the Earth's continents are

Titov et al. (2012)

Data used in this study

- Venus Express open-loop data obtained in 2006–2010
- Akatsuki open-loop data obtained in 2016–2017



Latitude-height distribution of the zonally and temporally averaged temperature



Temperature distributions obtained by RO and AFES-Venus are qualitatively consistent with each other.

Latitude-height distribution of the zonally and temporally averaged static stability



Static stability distributions obtained by RO and AFES-Venus are also qualitatively consistent with each other.

Akatsuki IR2 images and AFES-Venus (T159L120 run)





A synthesized false color image of Venus using 1.735-µm and 2.26-µm images taken by IR2 camera. Images are colorized as follows: 1.735 µm → red; 2.26 µm → blue; average of both → green. At 1.735 µm, dayside brightness is strong and considerable amounts of light are running into the nightside. This is why the border between dayside and nightside looks orangeish in color. The slight color variations on the nightside are believed to indicate the difference in size of cloud particles.

http://akatsuki.isas.jaxa.jp/en/gallery/data/001056.html

T159L120 run: vertical p-velocity

Results

Root-mean-square error (U, V, T) at 70 km



Red: Frf Blue: H24 Green: H6 Yellow: H1

Cases H1 and H6 converge quickly. Assimilation cycle can be seen in Case H24 (once per day). Temperature field does not converge.

Horizontal structures (Cases Qz, Qt, H24) at 70 km



Qz; zonal mean only ~ Frf Qt; including diurnal variation \sim Obs.

H24; result of VALEDAS

Thermal tide appears in Case H24 (once per day) not only for the horizontal flows but <u>temperature field</u>.

Vertical structures (Cases Qz, Qt, H24) at the equator



Thermal tide <u>propagates in the vertical direction</u> in Case H24 (once per day only for horizontal flows) even for the temperature field.

Horizontal and vertical structures for Case Vmc



Thermal tide appears in Case VMC even though horizontal flows in dayside region once per day *but amplitude is small*.

Latitude-height cross sections (Cases Qz, Qt, H24, Vmc)



Contour: zonal mean zonal flow Color : temperature deviations from the horizontally averaged temperature

Zonal mean zonal flow *does not change largely* for both Cases Vmc and H24 because of **Qz forcing**.

Latitude-height cross sections (Cases Frf, H1, Vmc)



Left red shade: Spread of V Right red shade: Spread of T Left contour: zonal mean zonal flow Right contour: temperature deviations from the horizontally averaged temperature Line plots (right panel): horizontal average of these spread

- Mid-latitudes:
 Baroclinic instability (Rossby-type waves)
- High-latitudes:Barotropic instability
- Low-latitudes:Thermal tides (H1)

Zonal mean zonal flow changes significantly for Case H1. General circulation could be changed by frequent observations.

Impact of dropsondes on a Typhoon (example of the Earth)

Estimated observation impact



Test of EFSO (Case H1)

✓ Correlation 80.64%; EFSO works well *but overestimates a little*



Test of EFSO (Case H1+T; Case H1 with temperature obs.)

✓ EFSO values divided into U, V, and T components.



Test of EFSO (Case H1+T; Case H1 with temperature obs.)

✓ EFSO values at the area of low-, mid-, and high-latitudes.



Summary

Data assimilation system for the Venusian atmosphere has been developed (VALEDAS; VAFES-LETKF data assimilation system).

> Test observations; horizontal flows at the cloud top level

(1)Idealized: AFES-Venus runs (1, 6, 24-hourly)

(2)Real: VMC/VEX (~24-hourly and dayside region only)

Both observations include thermal tide but **AFES-Venus forecasts forced with solar heating exclude thermal tide.**

 \Rightarrow Thermal tide appears and propagates vertically in temperature field

We also perform sensitivity experiments: ensemble size of 63-member (to confirm convergence), localization and observation error (to confirm that the effect is small), Qt (solar heating Including diurnal variation) run, data assimilation for temperature observation data...

➢EFSO (Ensemble Forecast Sensitivity to Observations) has been implemented.
Impacts of specific observations can be estimated diagnostically and automatically without OSSE (Observation System Simulation Exp.).

(VAFES; Venus AFES = AFES-Venus) 2. VALEDAS (VAFES-LETKF data assimilation system)

Data assimilation system for Akatsuki obs.

Frequent meteorological observations at multiple altitudes (Nakamura et al., 2011, 2014...)





Yamazaki et al. (2018?)

Two types of ensemble runs are performed to estimate impacts of observations.

Test assimilation of idealized temperature by Radio-Oc.

- ✓ Cases T15; 1-hourly temperature data for 15 points
- ✓ Cases UVT15; 1-hourly temperature data for 15 points with horizontal flows at the cloud top level (70 km)

Red: Frf Blue: H24 Green: H6 Yellow: H1 Right Blue: UVT15 Black: T15

Error of the temperature field reduces gradually.



1. Introduction Data assimilation Data assimilation fills in the gaps by integrating actual observation data into simulations, which enhances a simulation's accuracy.



Data assimilation is like a bridge between observation and simulations. In the case of weather forecasting, observations from radiosondes (weather balloons) and weather-observation satellites, for example, are integrated into numerical weather prediction simulations. As a result, we obtain more accurate weather forecasts.

We have to reproduce phenomena in a model similar to observations.

http://www.data-assimilation.riken.jp/jp/research/research.html

For Earth: NCEP-Reanalysis, ERA-interim, JRA-55 ...

Data assimilation for Mars

Assimilate observations of the Mars mission
Oxford Univ./Open Univ./LMD/Caltech/Maryland Univ...
✓ More observations than Venus.
✓ Good reproducibility of Mars GCM.



Temp. and dust by MGS are assimilated into Mars GCM: Temp. (top) and Mass stream function (bottom). (Montabonne et al., 05)

https://lmontabon.wixsite.com/marsdaworkshop Mars Atmosphere Data Assimilation workshop on August 29-31, 2018, at Savoie, France.

Data assimilation of planetary atmosphere has become realistic

Schematic of LETKF



LETKF: Simulation from initial analysis with variation (orange) produce large ensemble forecasts (blue). Assimilation of observations (red) makes these forecasts confined and produces new balanced (i.e., dynamically consistent) analysis for next forecast (green).

http://www.data-assimilation.riken.jp/jp/research/research.html

Test assimilation of idealized temperature by Radio-Oc.

✓ EFSO is small because of a limited number of observations; T15



Test assimilation of idealized temperature by Radio-Oc.

- ✓ Cases TE3; 1-hourly temperature data for 3 points at the eq.
- ✓ Cases TL5; 1-hourly temperature data for 5 points at lon=0

Red: Frf Blue: H24 Green: H6 Yellow: H1 Right Blue: TE3 Black: TL5

Error of the temperature field reduces gradually


Table 1. Definition of Epochs

Observations by VMC/VEX

Epoch	Period	Orbit No.	of Orbits
1	20 May 2006 to 3 Jul. 2006	30-74	13
2	15 Nov. 2006 to 13 Feb. 2007	208-298	30
3	30 Jun. 2007 to 17 Sep. 2007	436-515	62
4	28 Jan, 2008 to 1 May 2008	648-741	77
5	6 Sep. 2008 to 16 Nov. 2008	869-940	74
6	6 Apr. 2009 to 22 Jul. 2009	1082-1189	64
7	30 Nov. 2009 to 11 Mar, 2010	1320-1420	61



Kouyama et al. (JGR2013)