



# Partitioning the solar fluxes in vegetation Canopies from operational MODIS and MISR surface albedo products

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with contributions from

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FastOpt, Hamburg, Germany

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# Complex land-surface RT effects on short term climate: the snow case with ECMWF/NCEP

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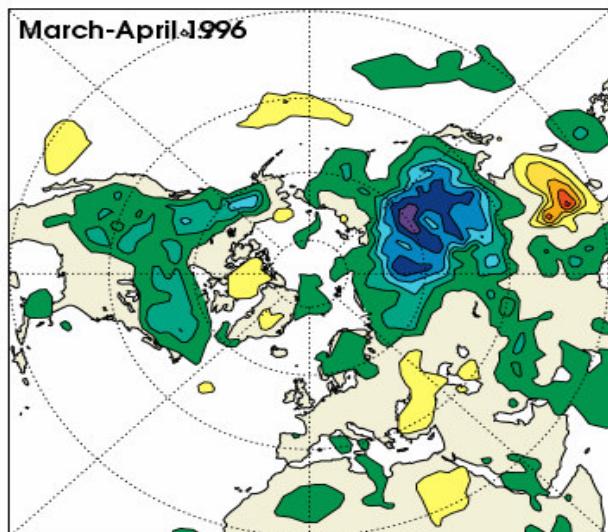


## FEATURES

1 ◀ ▶ 3

### Everyone Complains About the Weather...

Betts and his BOREAS colleagues observed that, in the spring, daily weather forecasts significantly underestimated air temperatures over the boreal forest, sometimes by as much as 10–15°C (18–27°F) (Viterbo and Betts, 1999). Additionally, the BOREAS team found that predictions of cloud cover over the boreal region were often far off the mark. Everyone complains about the weather, but how could the forecasts be so wrong so often?



This map shows the average errors in the European Centre for Medium-Range Weather Forecasts at 850mb (roughly equivalent to an altitude of 1500m) for March and April of 1996. The predictions, made five days in advance, were compared to actual measurements. The 1996 model did not include the adjustments to forest albedo.

(Figure from Viterbo, P. and A.K. Betts, 1999: The impact on ECMWF forecasts of changes to the albedo of the boreal forests in the presence of snow. *J. Geophys. Res.* (In press, BOREAS special issue). Courtesy A.K. Betts)



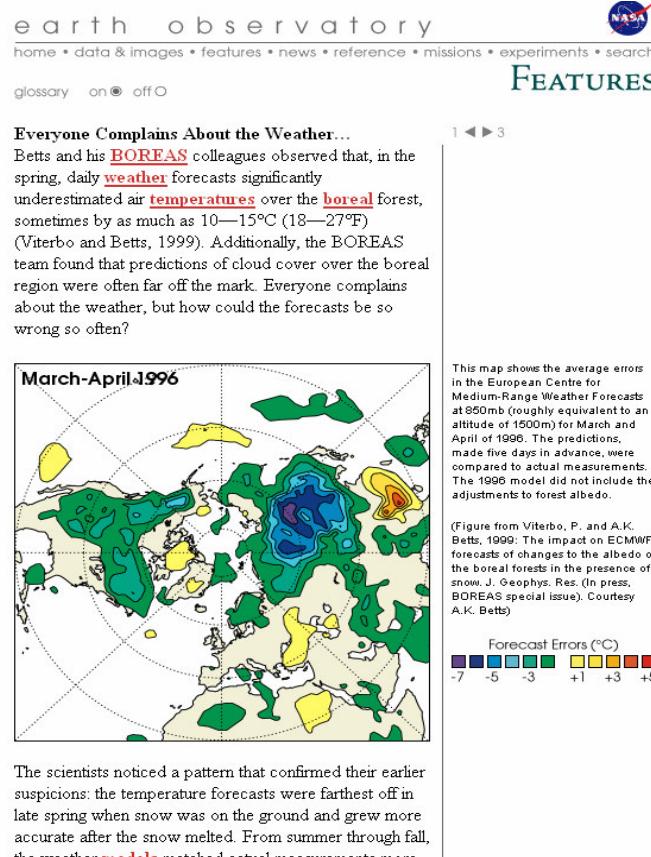
The scientists noticed a pattern that confirmed their earlier suspicions: the temperature forecasts were farthest off in late spring when snow was on the ground and grew more accurate after the snow melted. From summer through fall, the weather models matched actual measurements more

Ref: Viterbo and Betts, 1999, JGR

"...weather forecasts significantly underestimated air temperatures over boreal, sometimes by as much as 10-15 C..."

Ref: <http://eobglossary.gsfc.nasa.gov/>

# Complex land-surface RT effects on short term climate: the snow case with ECMWF/NCEP



"...—the BOREAS team found that the models were overestimating albedo (the amount of light reflected by the surface). ..."

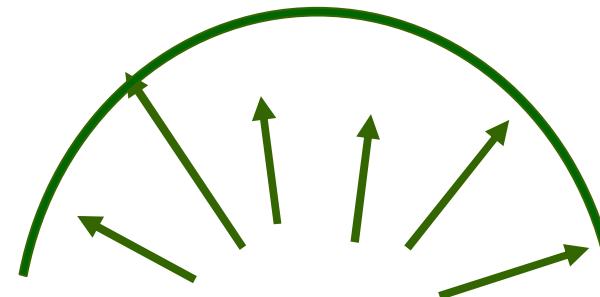
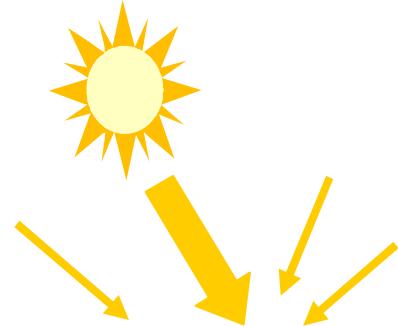


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# How does radiation redistribute energy between the atmosphere and the biosphere?

## Scattered Fluxes by the surface



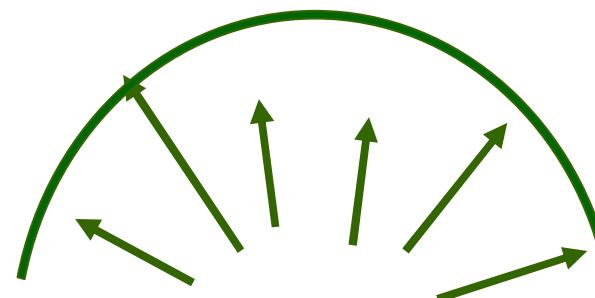
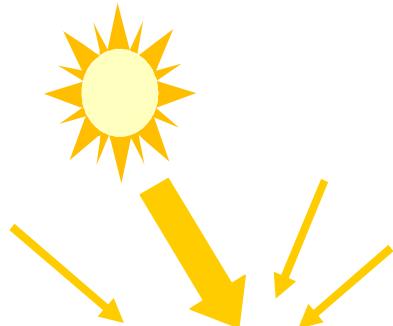
Absorbed Fluxes in Vegetation



Absorbed Fluxes in Soil

What do we measure at global scale that we should model as well?

Albedo of the surface in the VIS  
and NIR (MODIS and MISR)



# How do we model the absorbed fluxes in vegetation and soil ?

Correct partitioning between the flux that is absorbed :

1- in the **vegetation** layer

$$A_{\text{veg}} = \frac{\text{VIS}}{\text{VIS+NIR}} = 1 - \text{ALB}_{\text{sfc}} - A_{\text{ground}}$$

2- in the **background**

$$A_{\text{ground}} = T_{\text{veg}}(1 - \alpha_{\text{ground}})$$

Assessment of the fraction of solar radiant flux that is **scattered** (albedo) by, **transmitted** through and **absorbed** in the vegetation layer

# What are the needs?

- Update/improve the current Land Surface schemes describing the radiation transfer processes in vegetation canopies  
see 2-stream model by Pinty et al. JGR (2006).

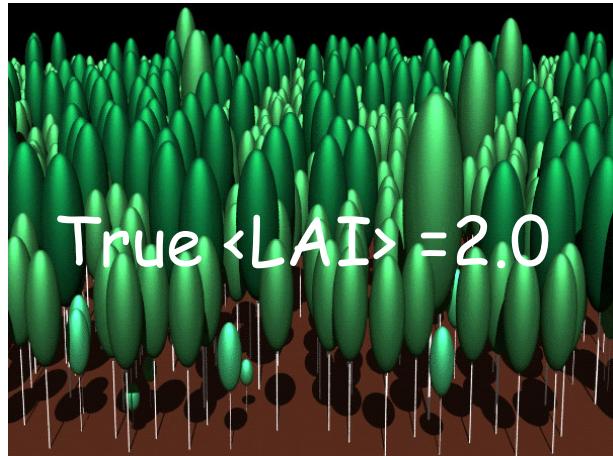
# Requirements from a 2-stream model

- 3 (effective) state variables:
  1. *Optical depth: LAI*      *amount of leaf material*
  2. *single scattering albedo :*  
*Leaf reflectance+ Leaf transmittance*      *leaf color*
  3. *asymmetry of the phase function*  
*Leaf reflectance/transmittance*
- 2 boundary conditions:
  1. *Top: Direct and Diffuse atmospheric fluxes (known)*
  2. *Bottom : Flux from background Albedo (unknown)*      *soil color*

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# The concept of effective LAI

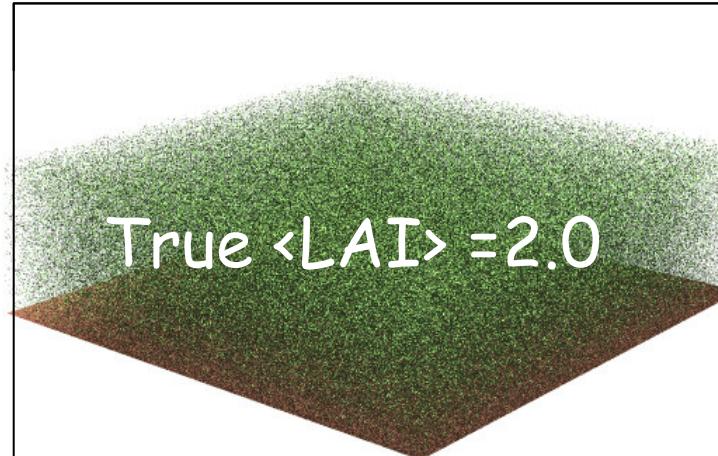


True  $\langle LAI \rangle = 2.0$

3-D heterogeneous system

Direct transmission at 30 degrees Sun zenith angle,

$$T_{3-D}^{direct}(\langle LAI \rangle) = 0.596$$



True  $\langle LAI \rangle = 2.0$

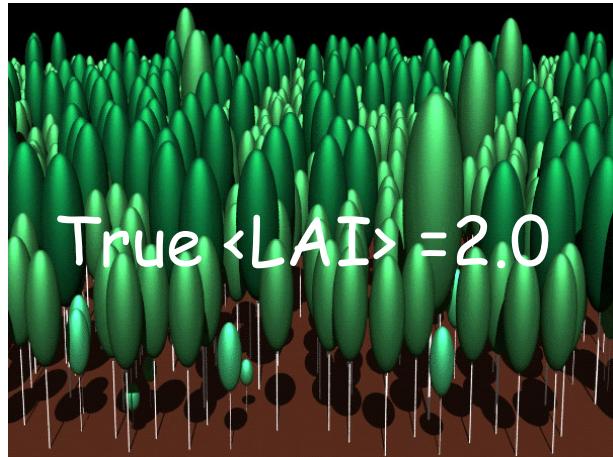
1-D system representation

Direct transmission at 30 degrees Sun zenith angle,

$$T_{1-D}^{direct}(\langle LAI \rangle) = \exp\left(-\frac{\langle LAI \rangle}{2\mu_0}\right) = 0.312$$

Effects induced by internal variability of LAI

# The concept of effective LAI

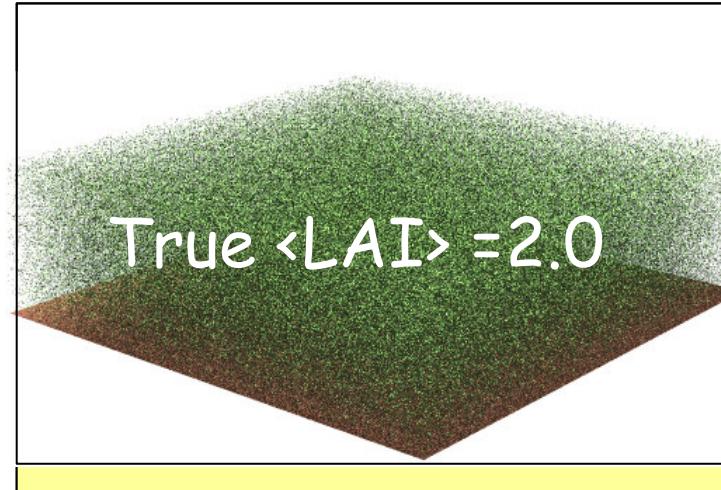


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$$T_{1-D}^{direct}(LAI^{eff}) = \exp\left(-\frac{LAI^{eff}}{2\mu_0}\right) = \exp\left(-\frac{\langle LAI \rangle \xi(\mu_0)}{2\mu_0}\right) = T_{3-D}^{direct}(\langle LAI \rangle)$$

Structure factor

# What are the needs?

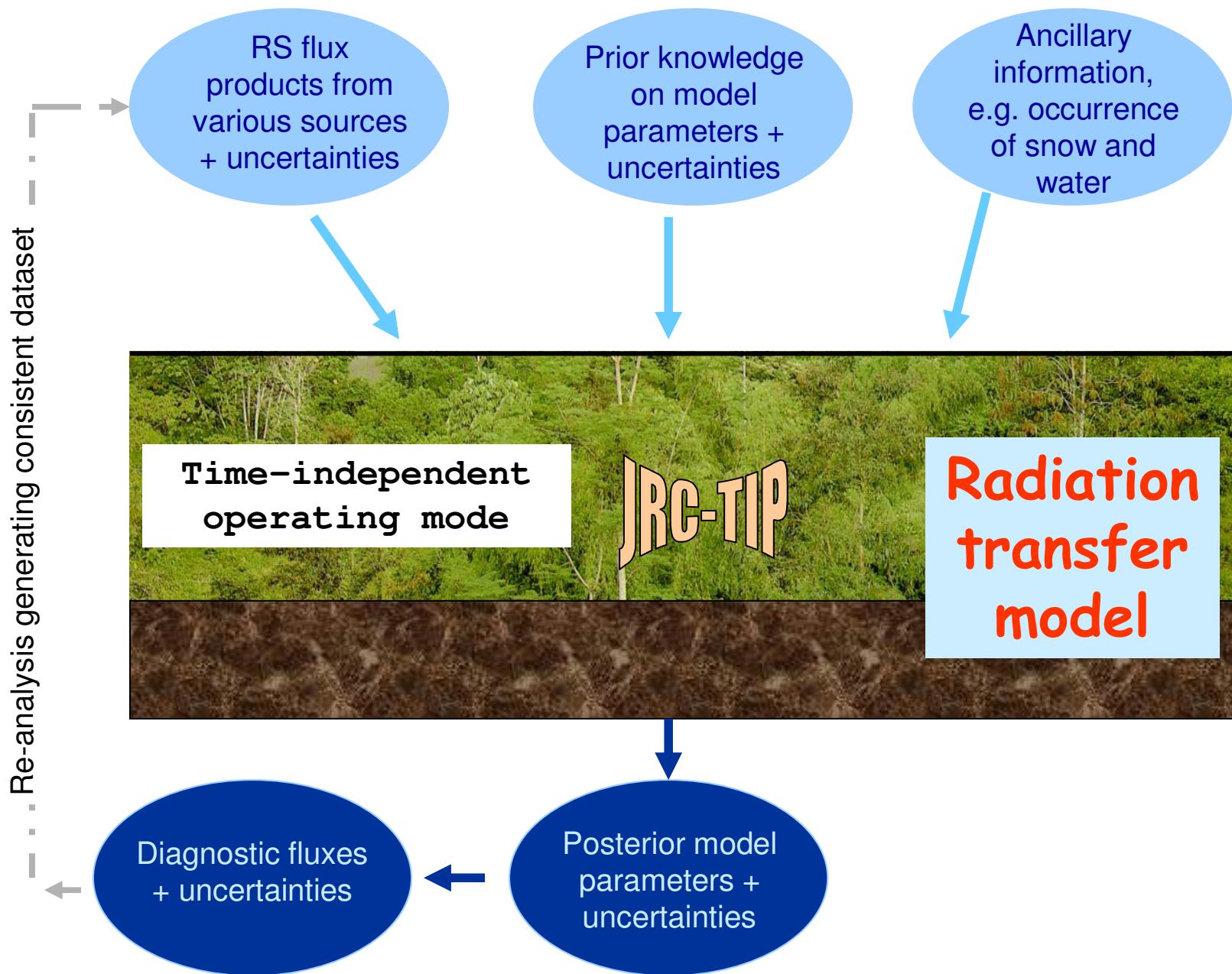
- Update/improve the current Land Surface schemes describing the radiation transfer processes in vegetation canopies  
see 2-stream model by Pinty et al. JGR (2006).
- Prepare for the ingestion/assimilation of RS flux products into Land Surface schemes  
Retrieve 2-stream model parameters from RS flux products

# Retrievals of model Parameters for Land surface schemes

The inverse problem can be formulated in order to find solutions **optimizing all the available information** i.e., inferring statistically the state of the system

Towards an **integrated system** for the optimal use of remote sensing flux products

# JRC-Two-stream Inversion Package: JRC-TIP



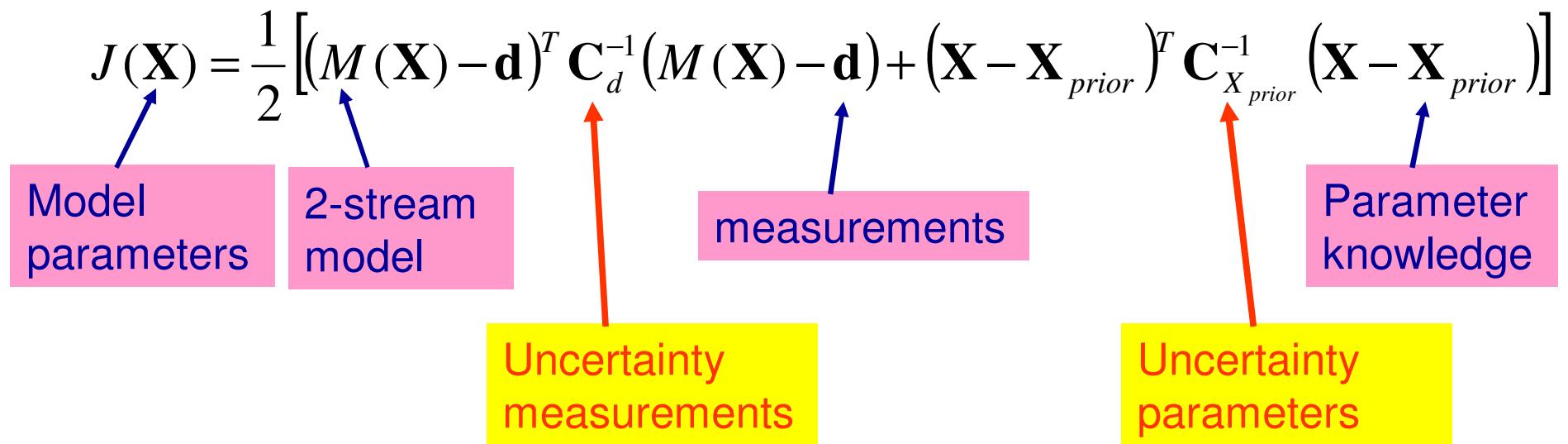
# INPUTS : prior knowledge

- RS Flux products, e.g., Albedo Vis/NIR and/or FAPAR noted  $\mathbf{d}$
- Updated/benchmarked 2-stream model from Pinty et al. JGR (2006) noted  $M(\mathbf{X})$
- A priori knowldege/guess on model parameters noted  $\mathbf{X}_{prior}$

uncertainty on the RS products is specified in the measurement set covariance matrix  $\mathbf{C}_d$

uncertainty associated the model parameter is specified via a covariance matrix  $\mathbf{C}_{X_{prior}}$

# The core of the JRC-TIP



- Computer optimized **Adjoint** and **Hessian** model of cost function from automatic differentiation technique
- Assume **Gaussian** theory
- Posterior **uncertainties** on retrieved parameters are estimated from the curvature of  $J(\mathbf{X})$

# OUTPUTS: posterior knowledge

- PDFs of all 2-stream model parameters:

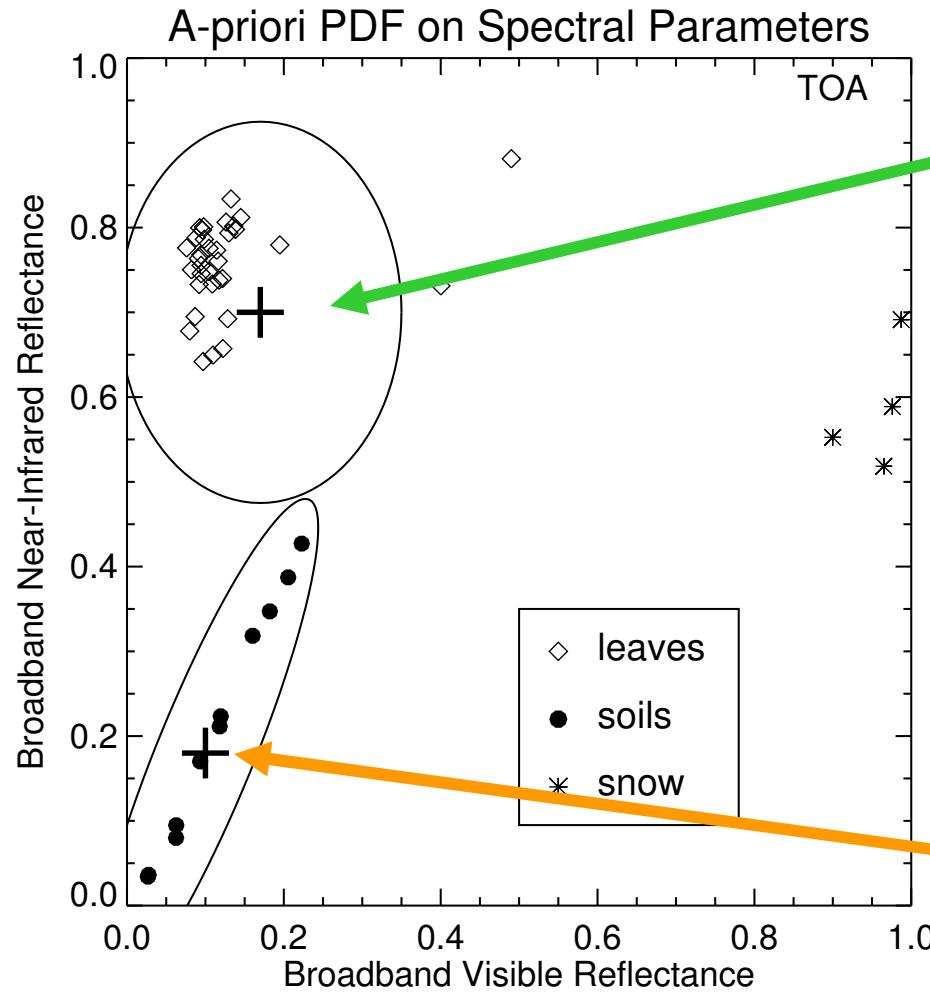
$$PDF(\mathbf{X}) \approx \exp\left(-\frac{1}{2}(\mathbf{X} - \mathbf{X}_{post})^T \mathbf{C}_{X_{post}}^{-1} (\mathbf{X} - \mathbf{X}_{post})\right)$$

a posteriori uncertainty covariance matrix

- Assessment of all fluxes predicted by the 2-stream model and their associated uncertainty:

$$\mathbf{C}_{post}^{Flux} = \mathbf{G} \mathbf{C}_{X_{post}} \mathbf{G}^T$$

# *prior knowledge on model parameters*

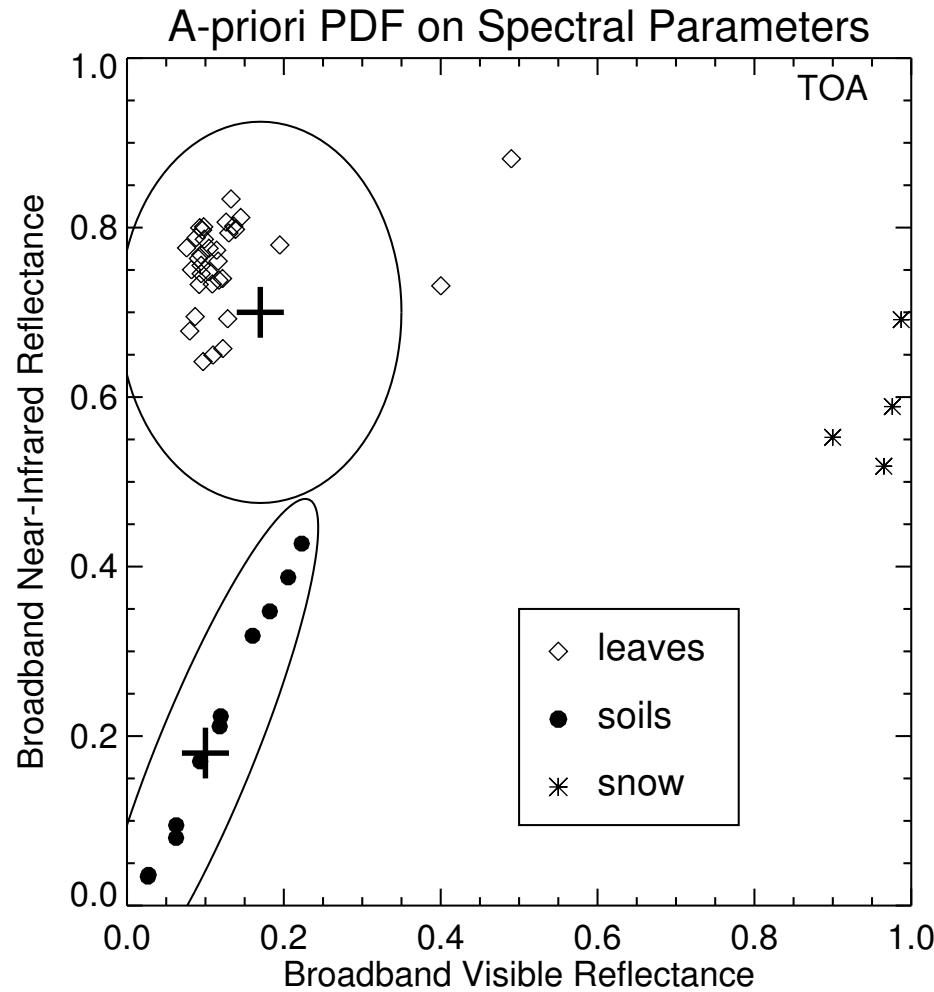


$$LAI_{prior} = 1.5$$

$$\sigma_{prior}(LAI) = 5.0$$



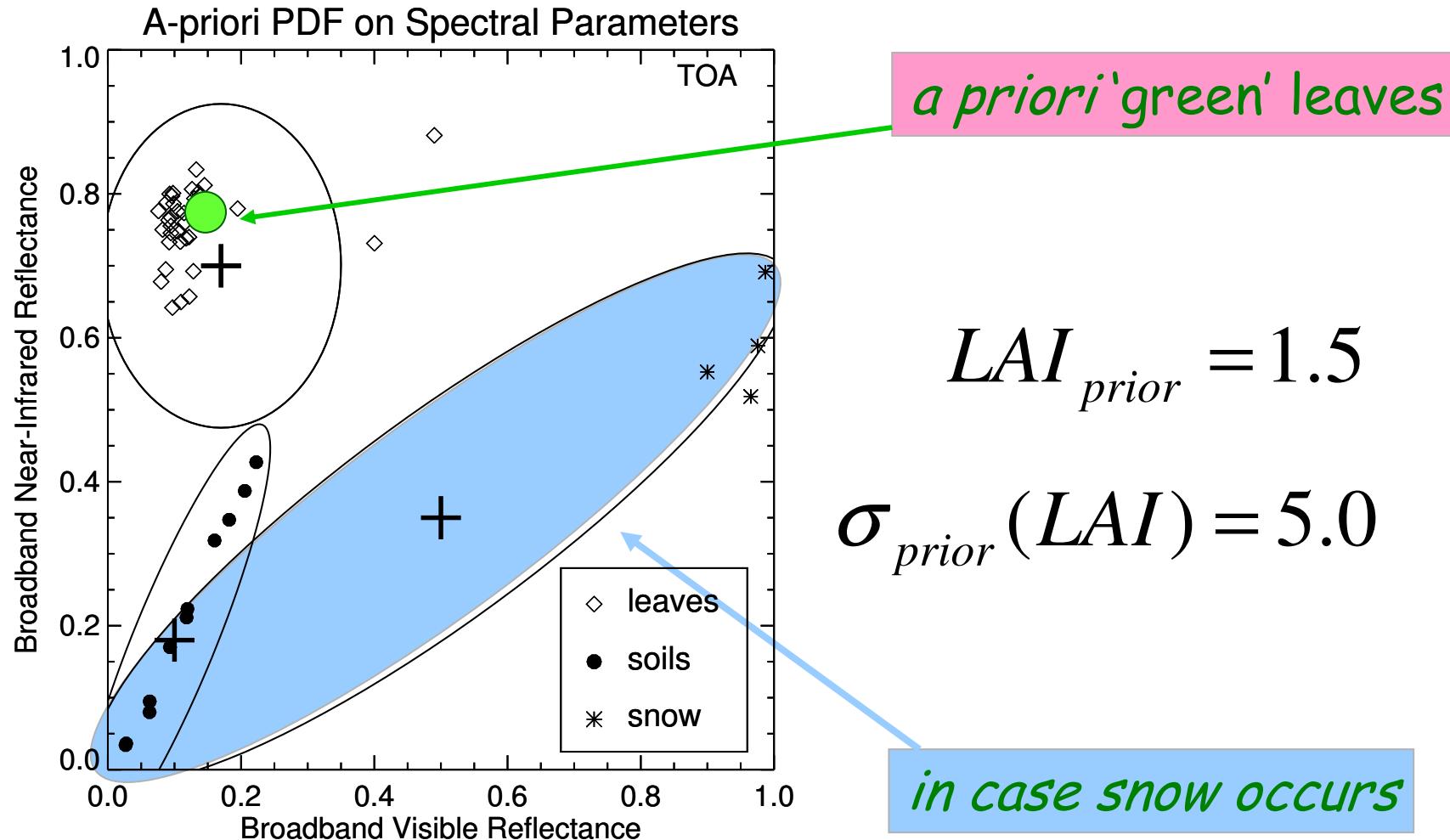
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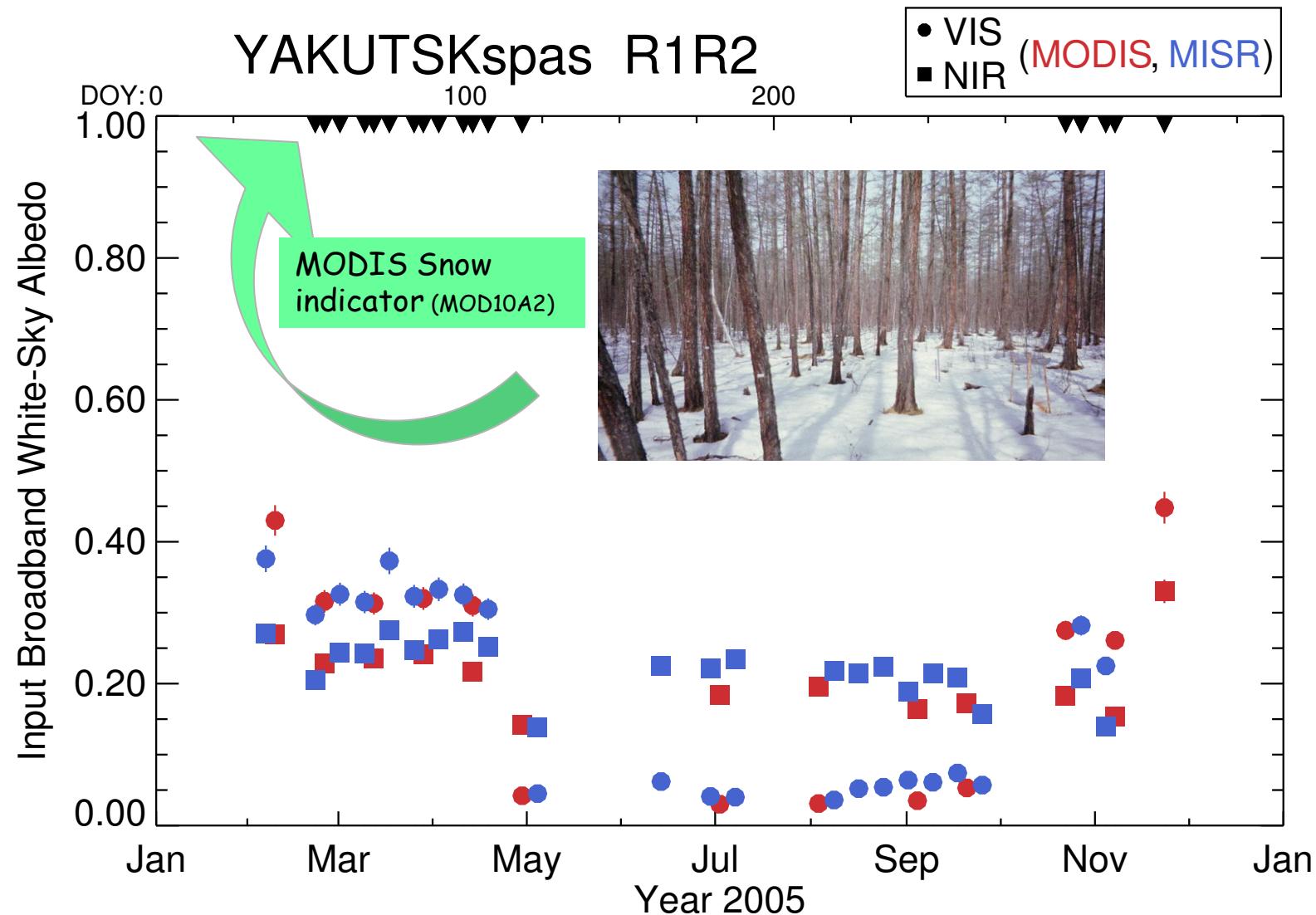


# Application over Yakustk Forest: a deciduous needle-leaf larch forest



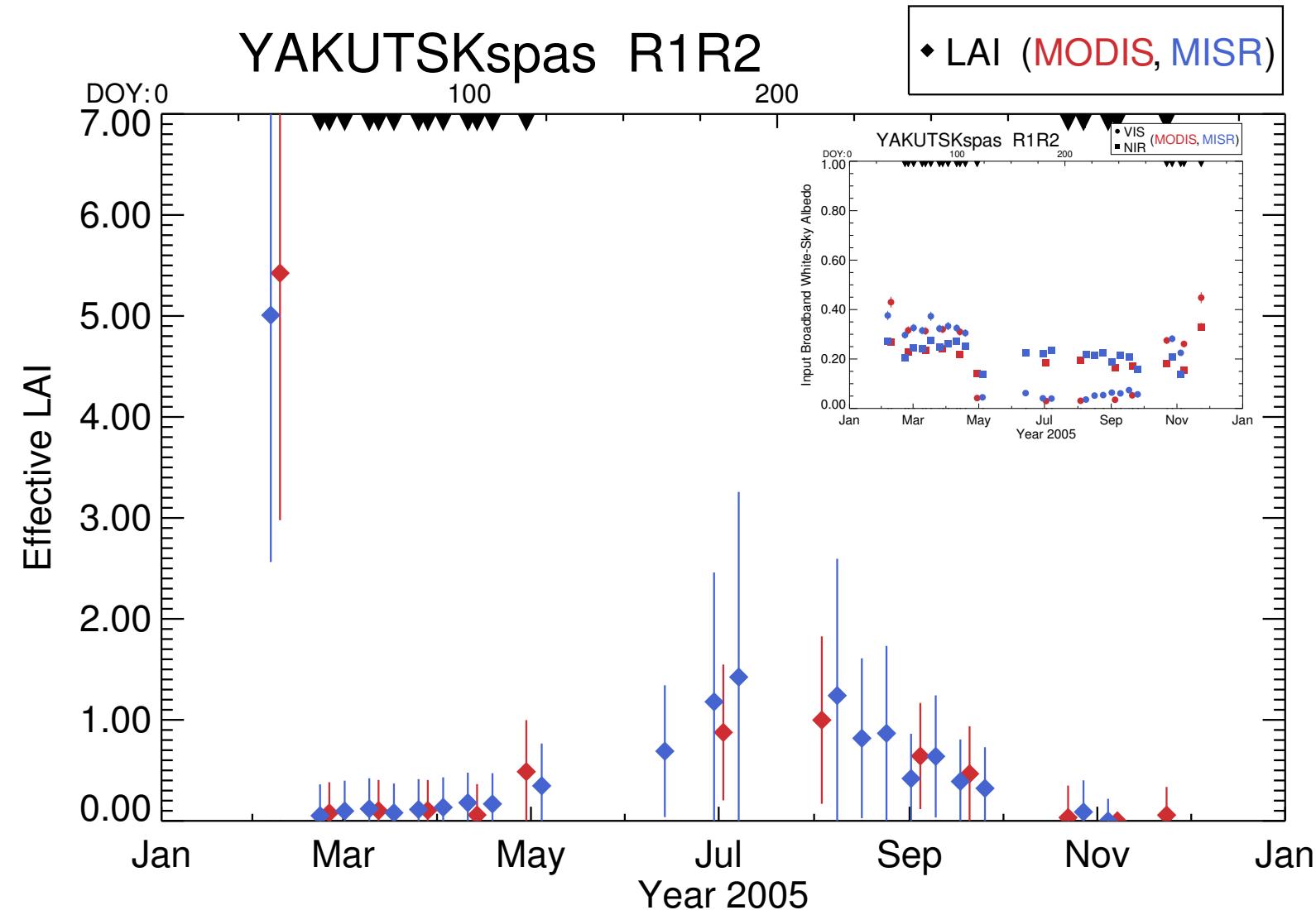
Courtesy of Dr. R. Suzuki

# Application over Yakutsk: Measurements

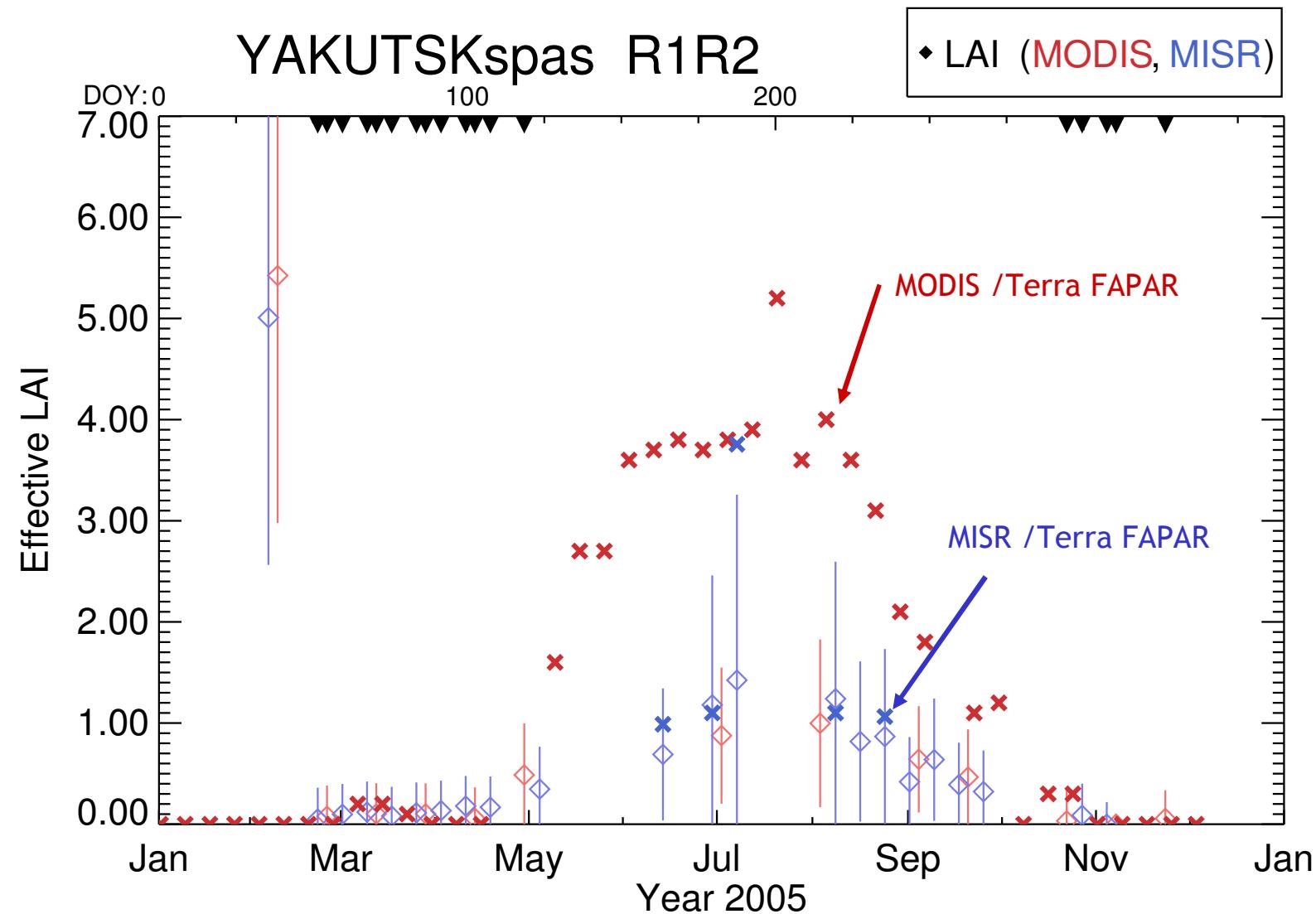


Specified uncertainty on BHRs is 5% relative

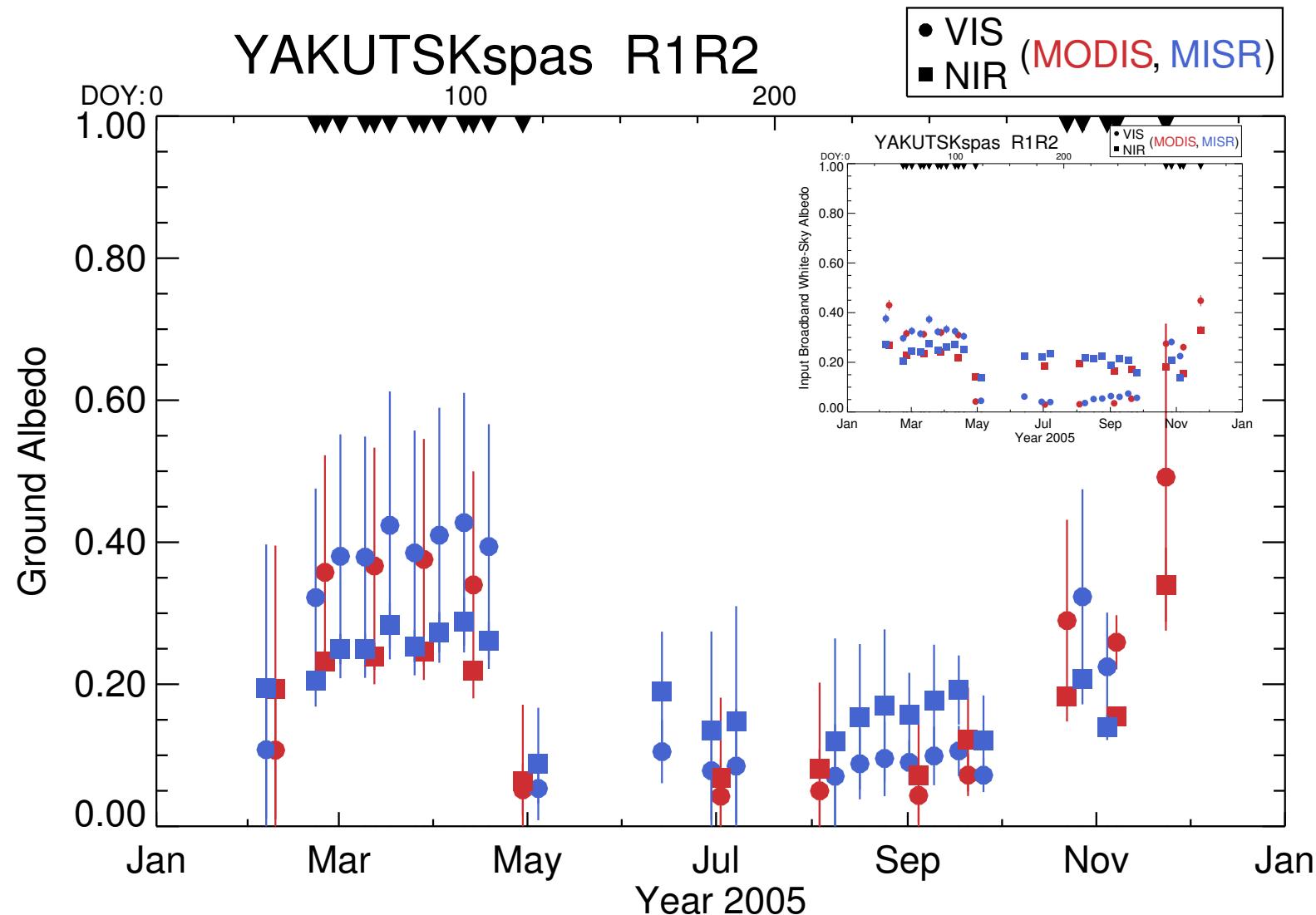
# Application over Yakutsk: model parameters



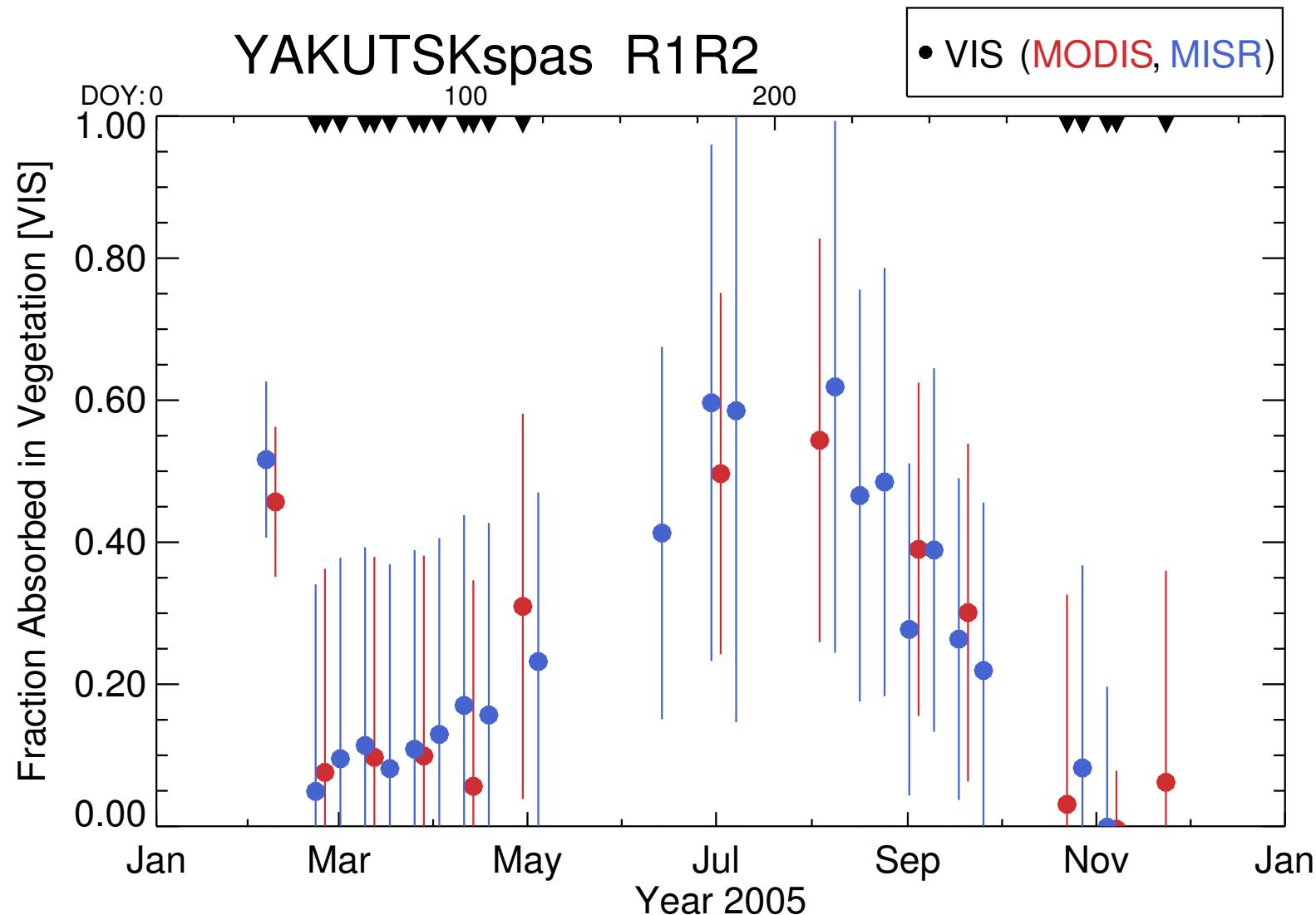
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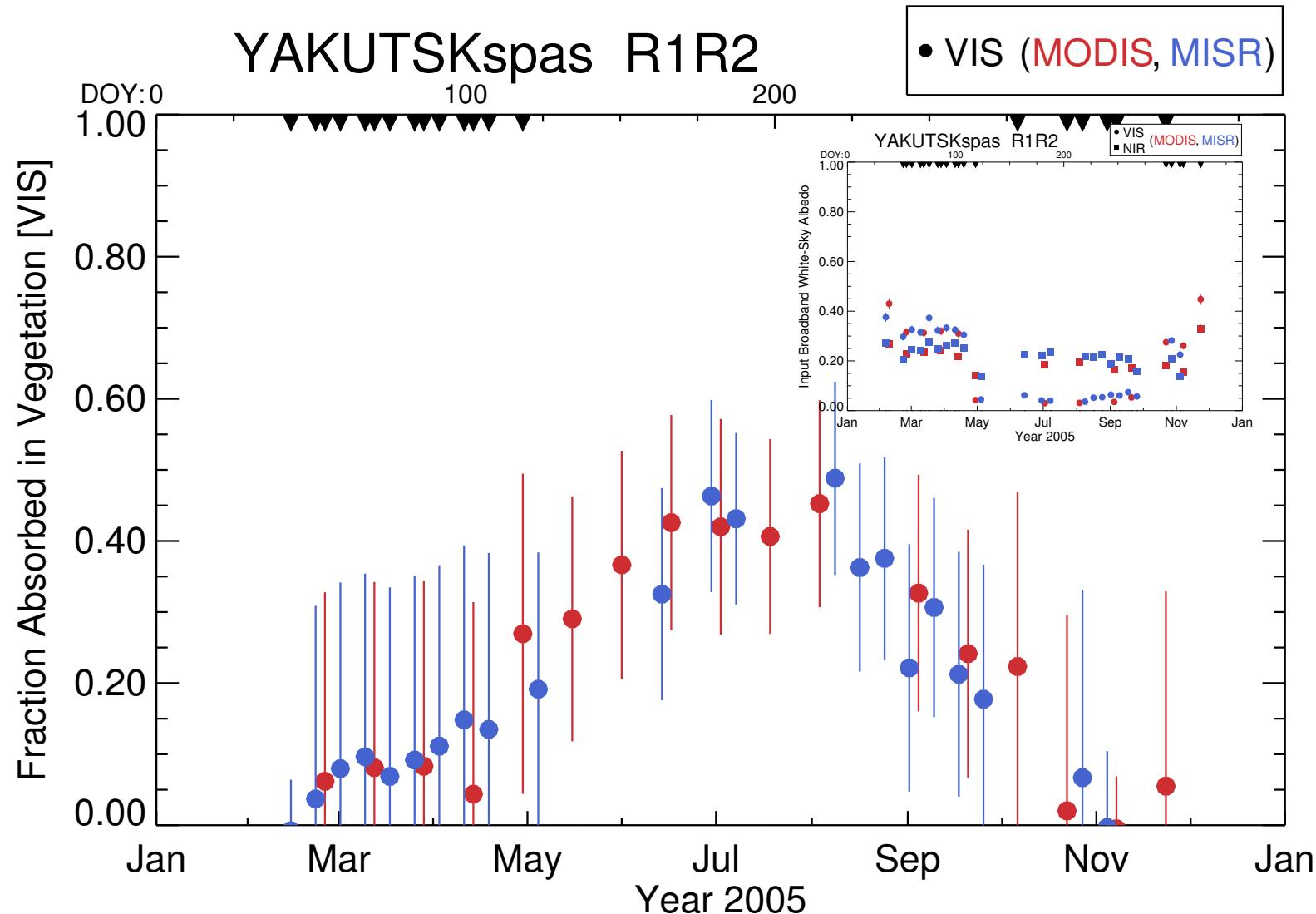
# Application over Yakutsk: model parameters



# Application over Yakutsk: radiant fluxes



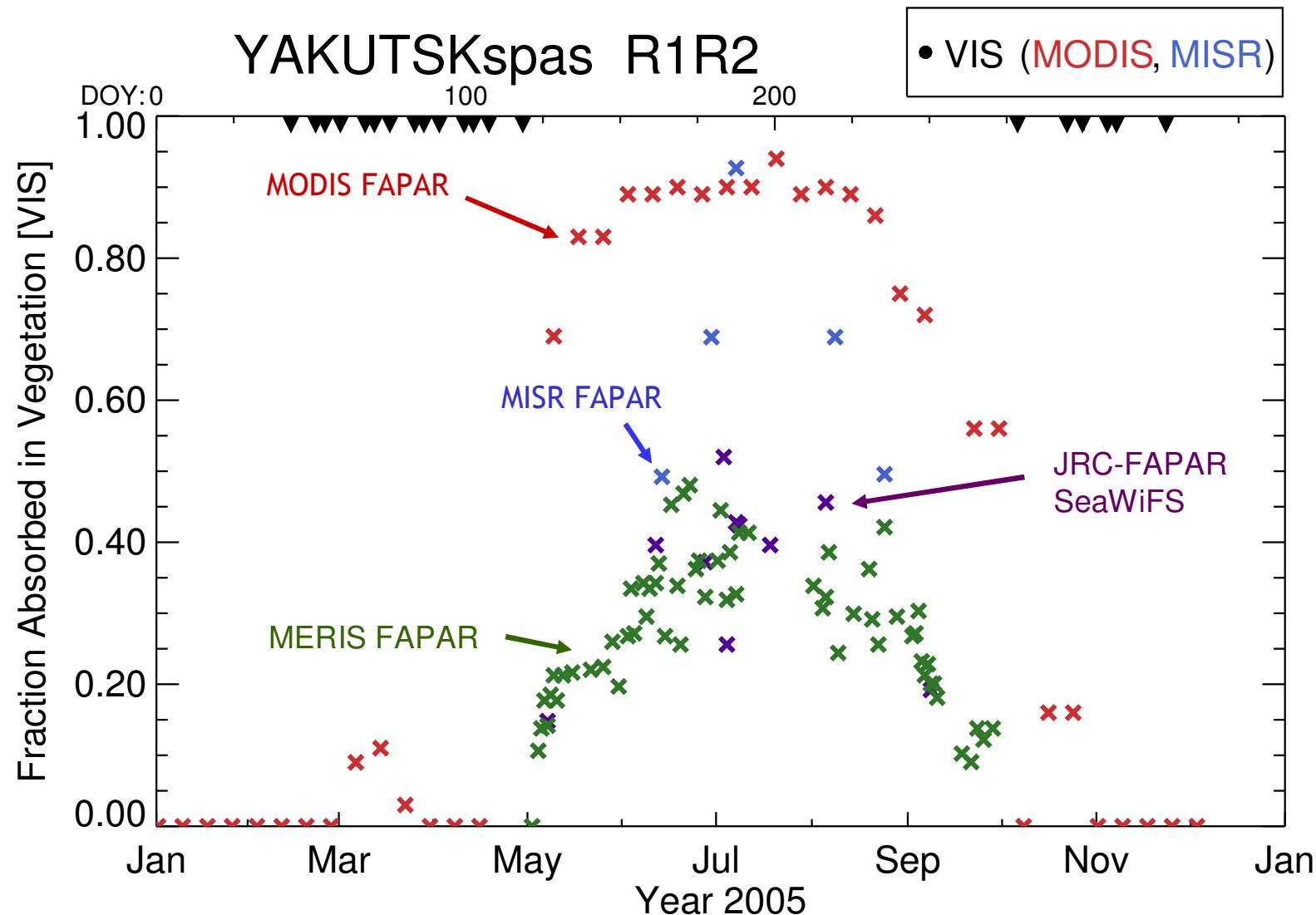
# Application over Yakutsk: radiant fluxes



*a priori* 'green' leaves

Pinty et al., (2008): Journal of Geophysical Research, doi:10.1029/2007JD009096

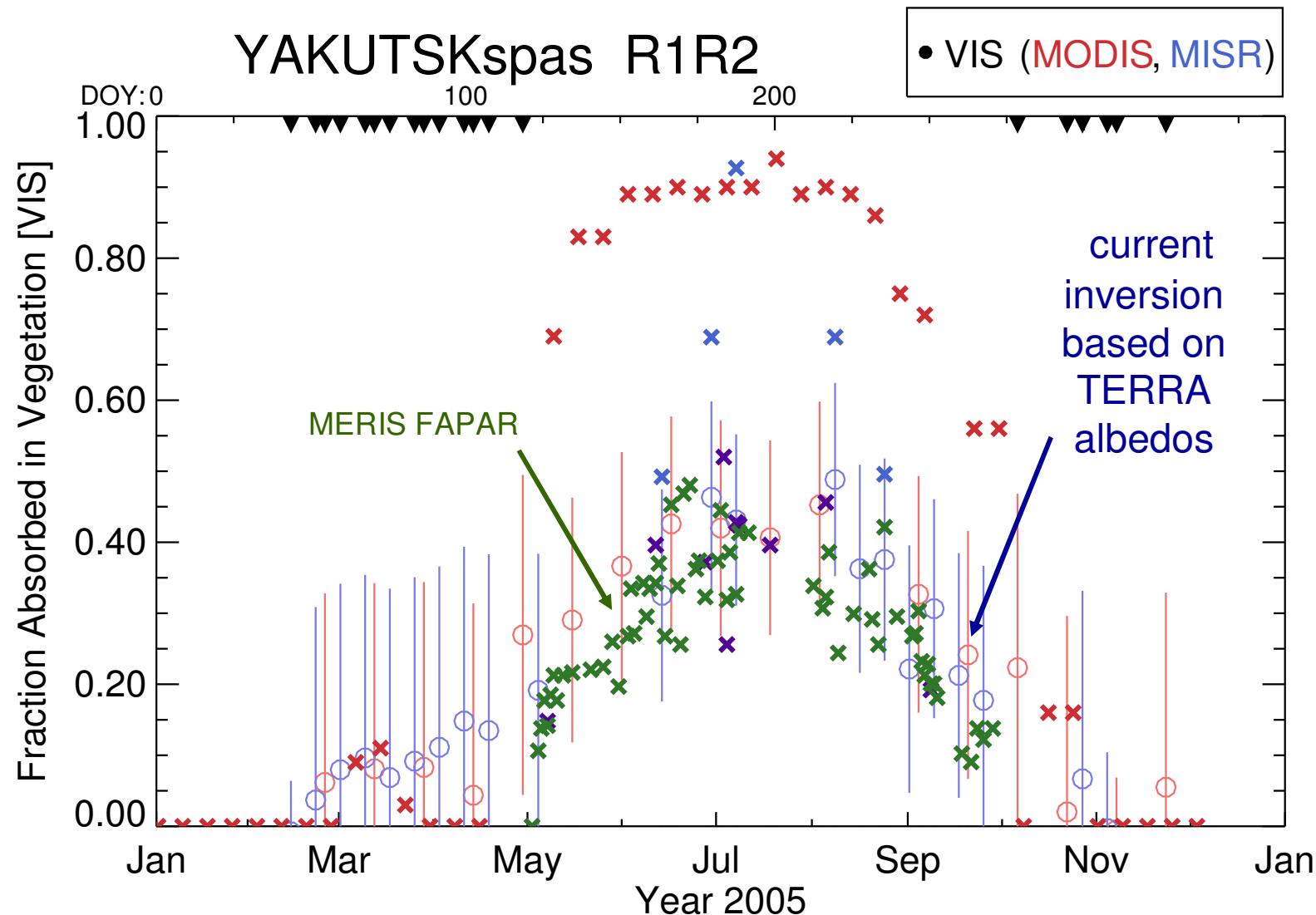
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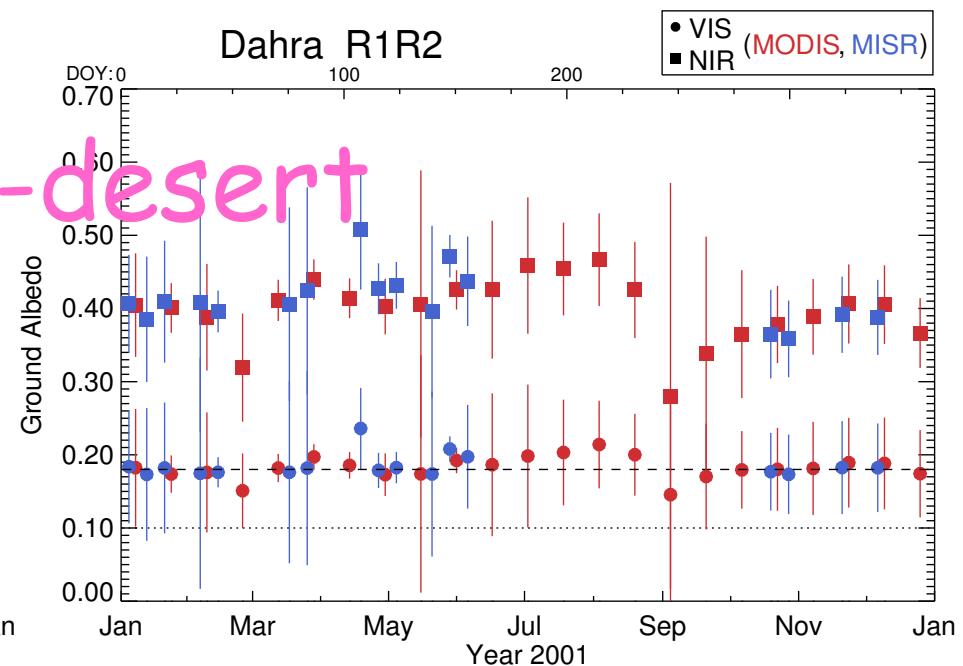
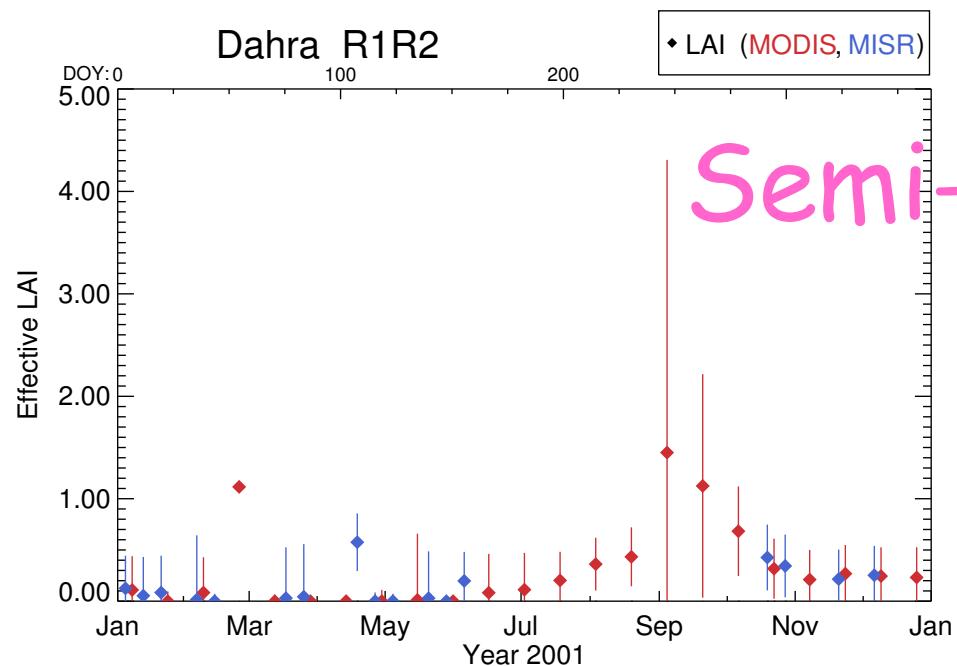
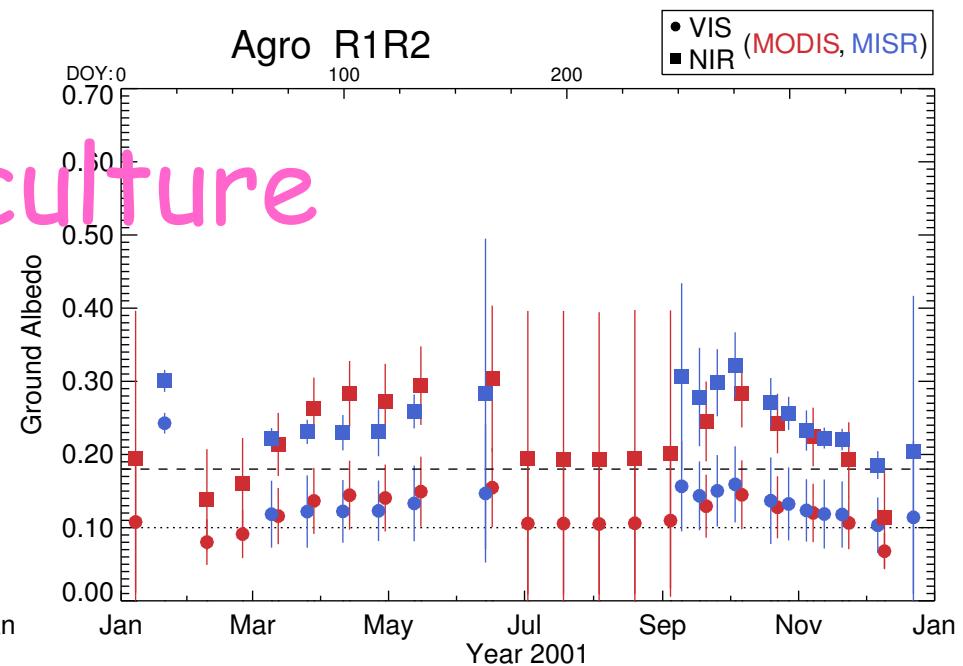
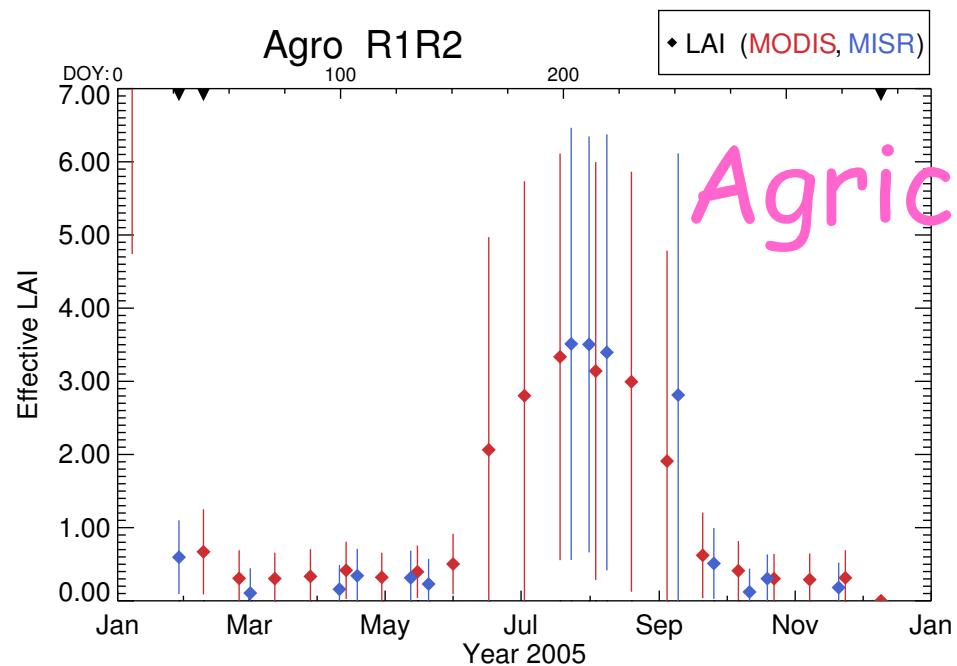
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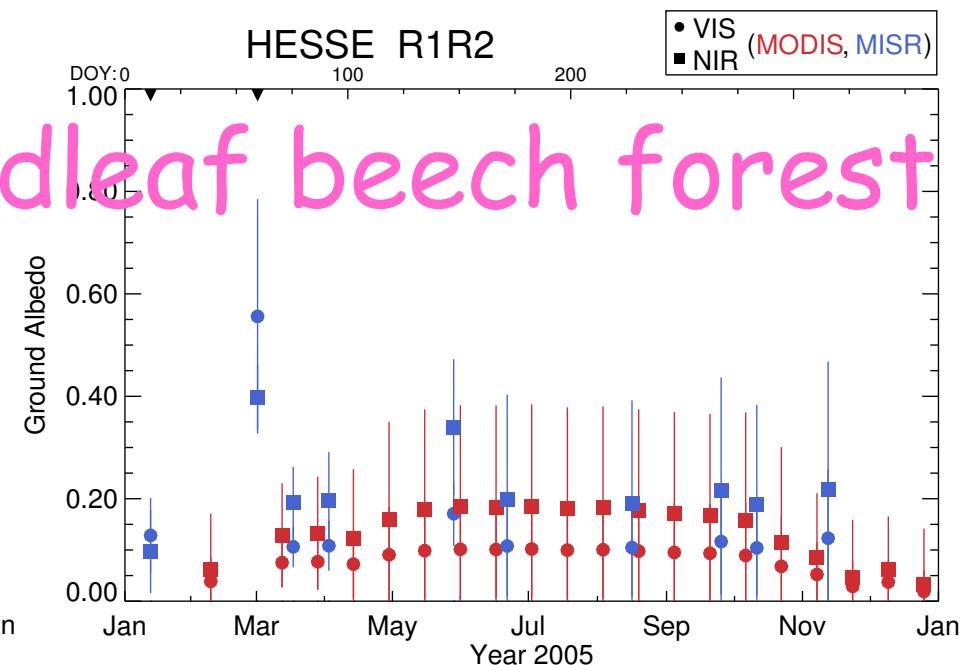
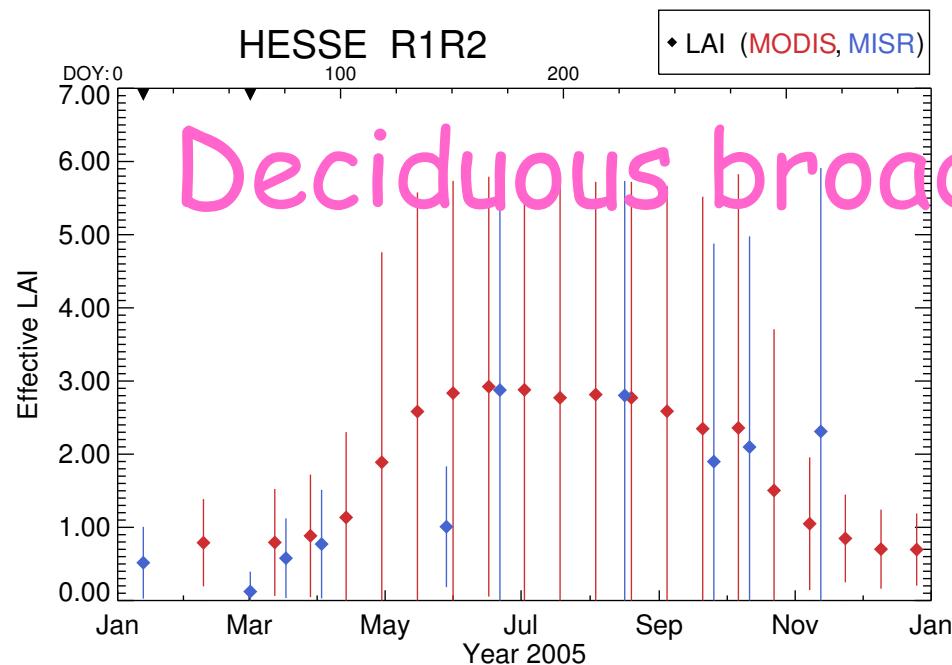
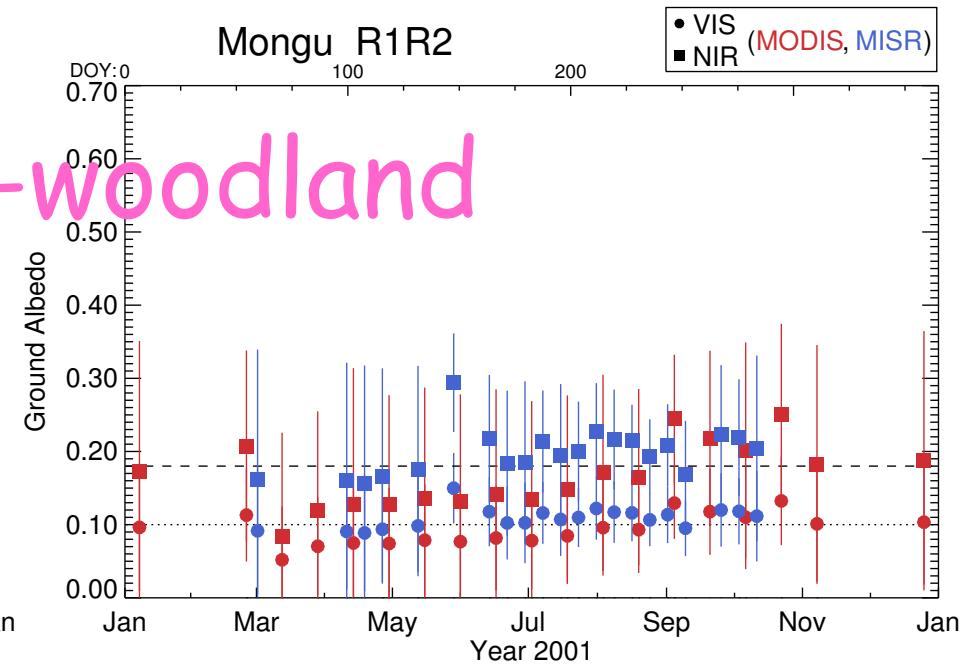
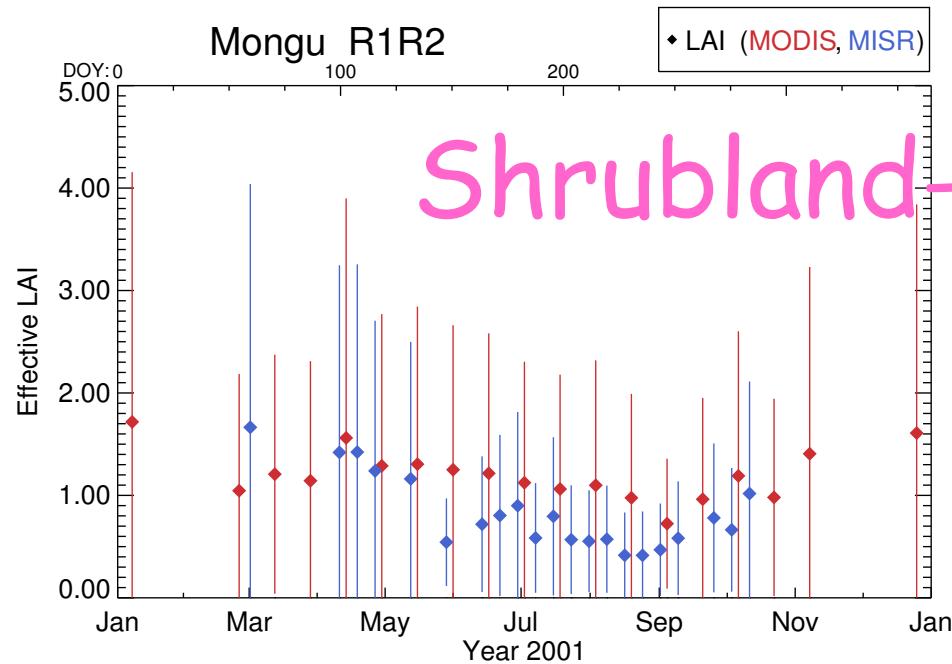
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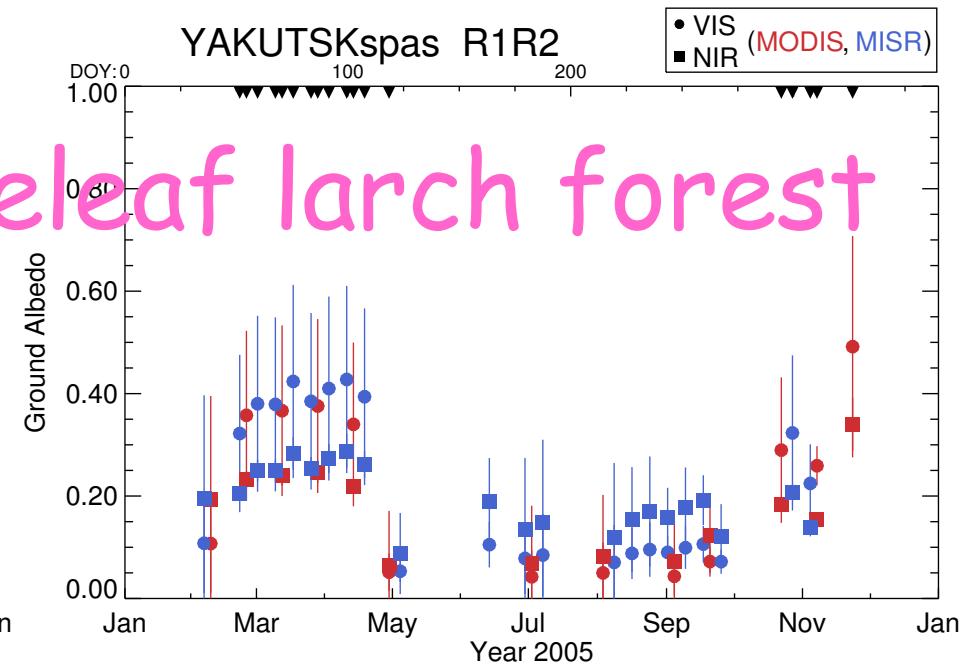
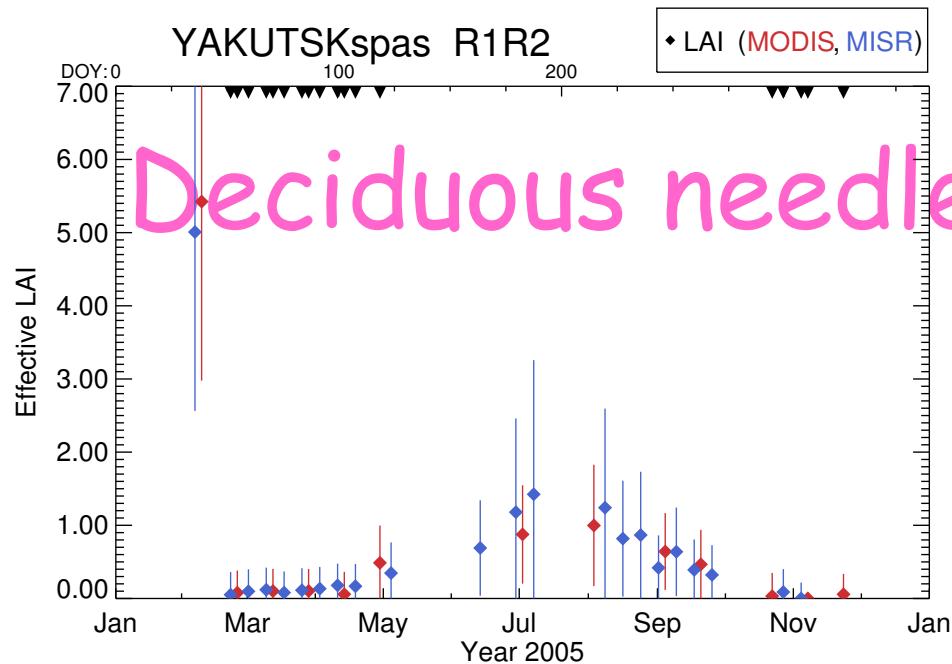
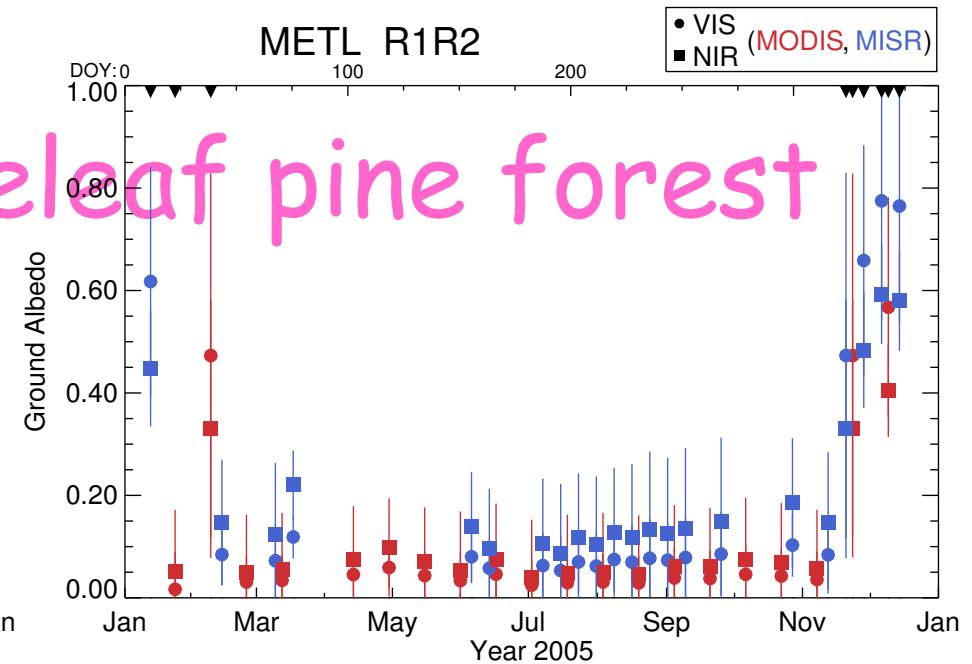
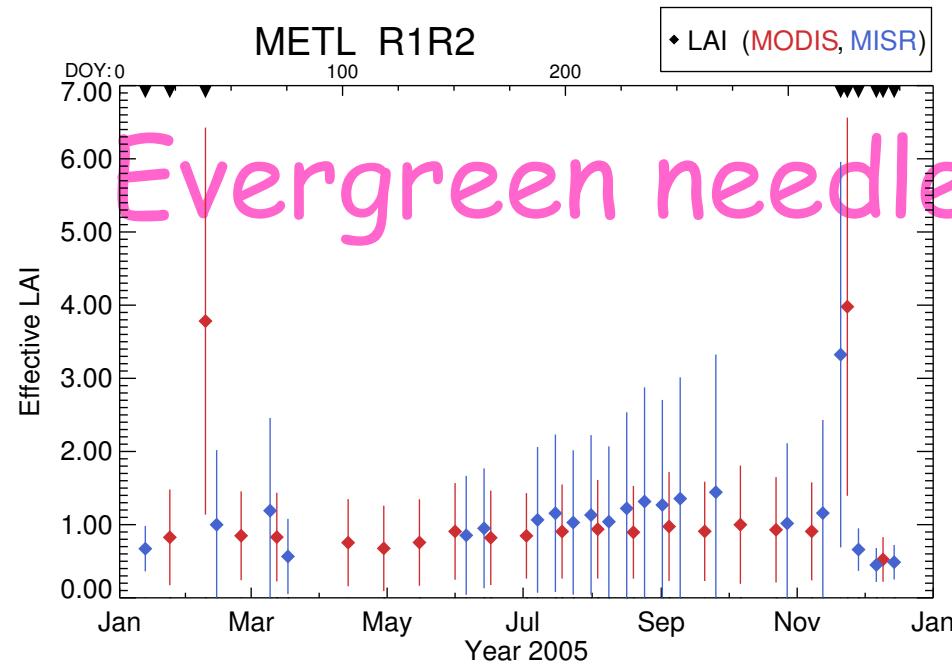
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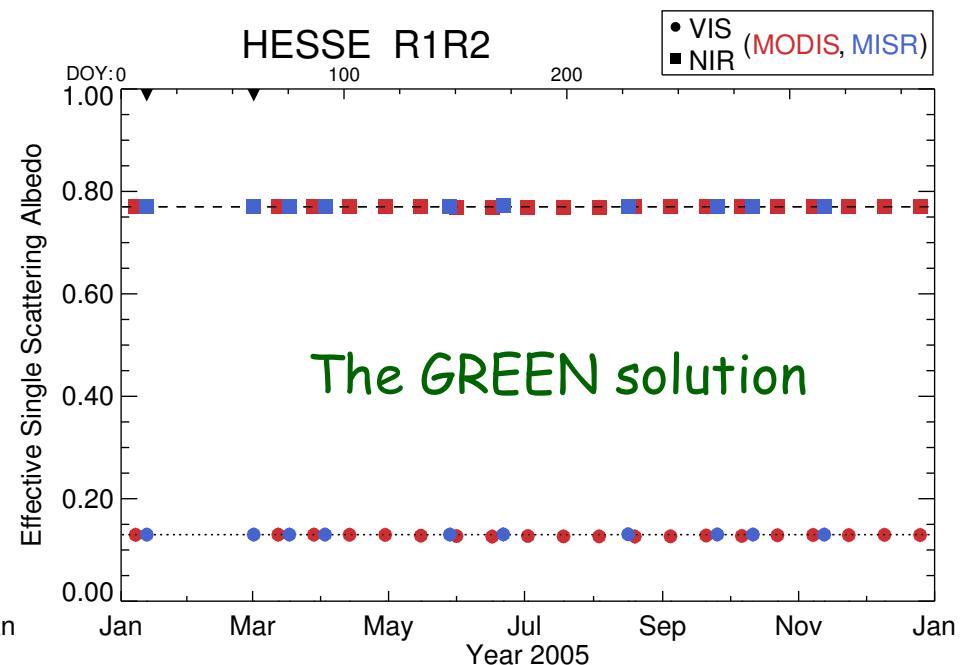
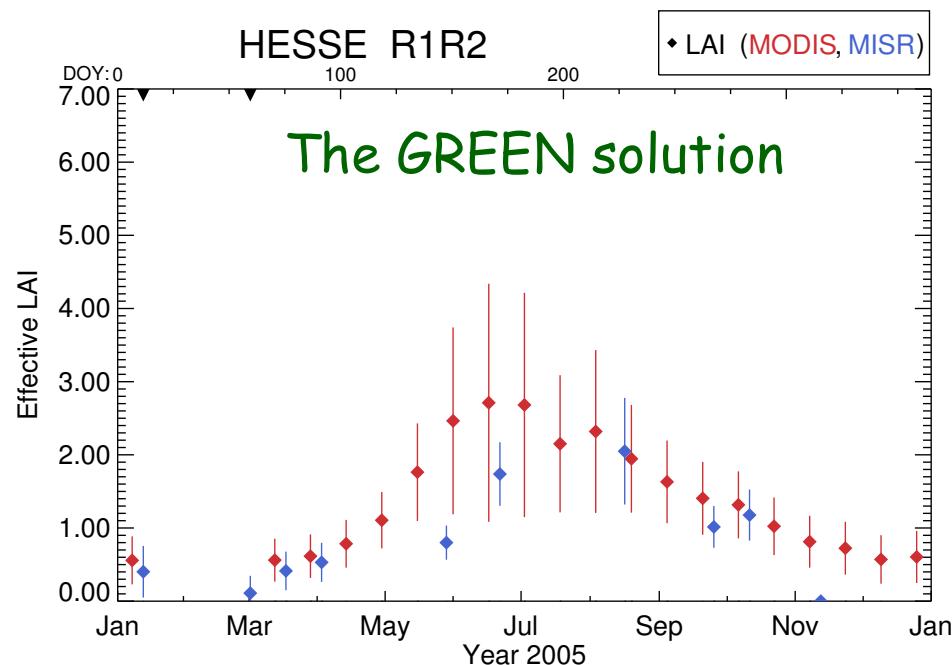
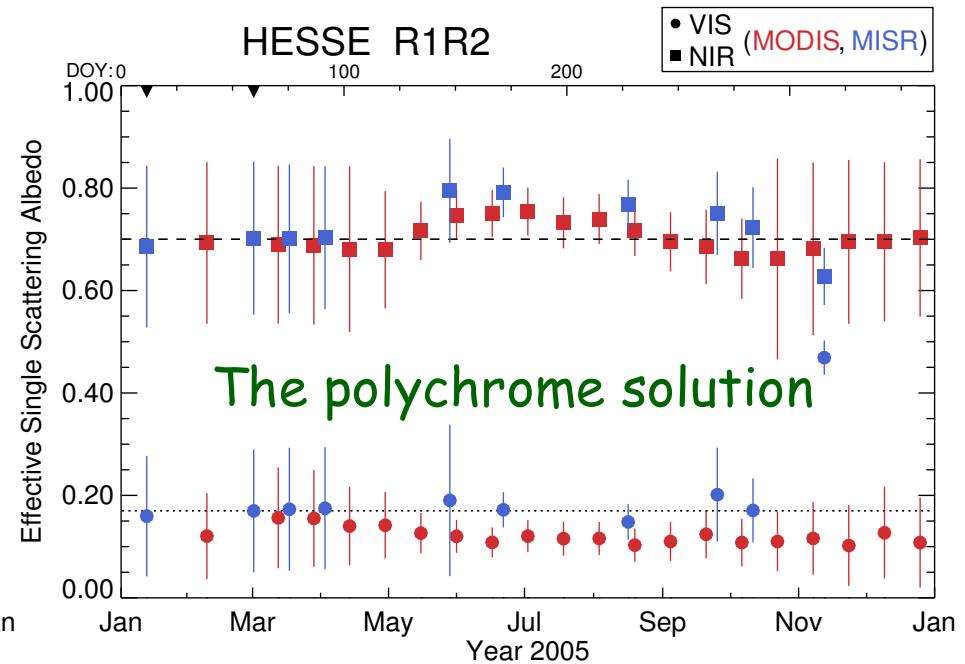
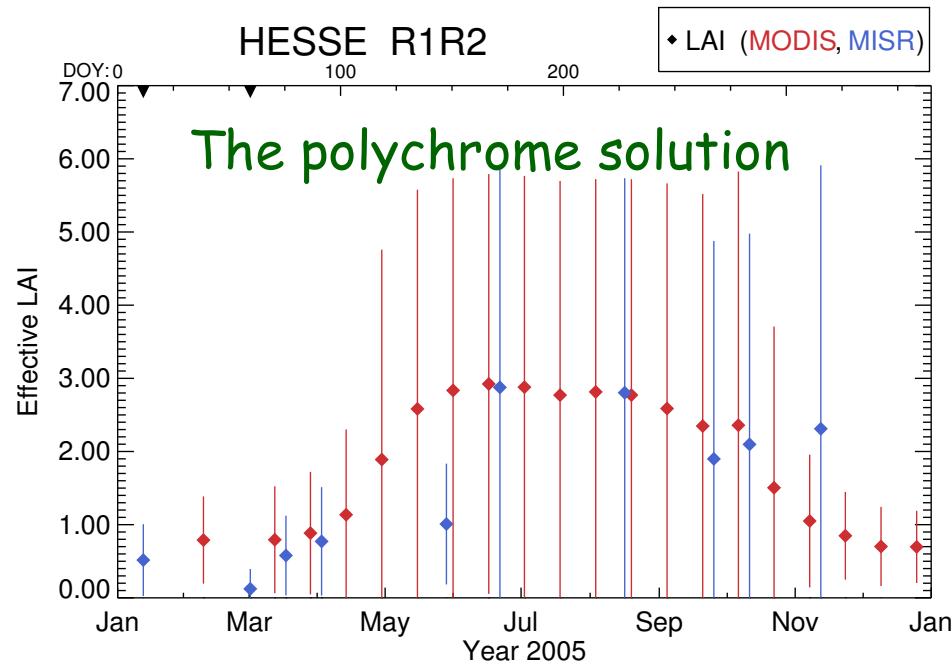


# Agriculture

# Semi-desert

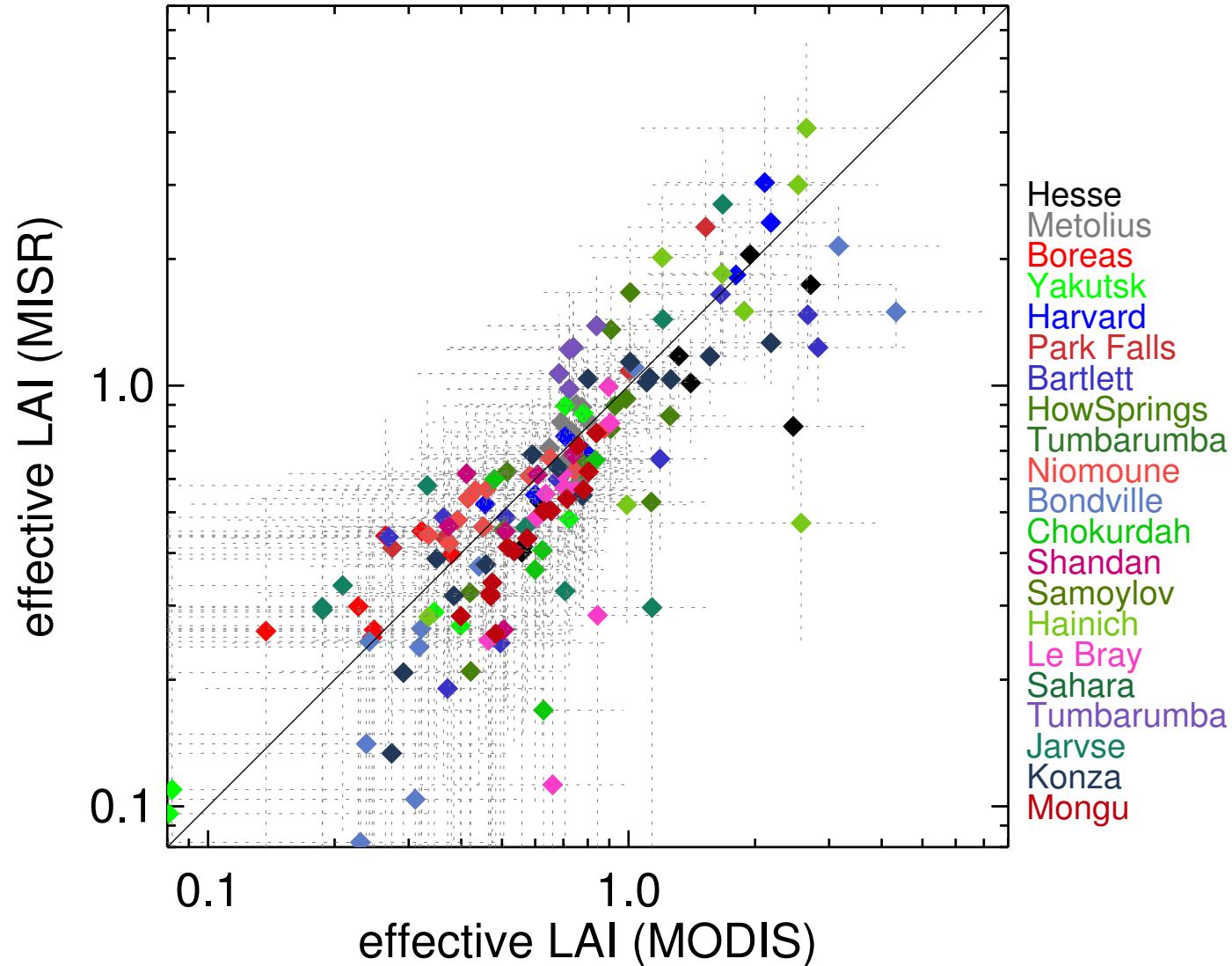






# Statistics over FIFE – like sites

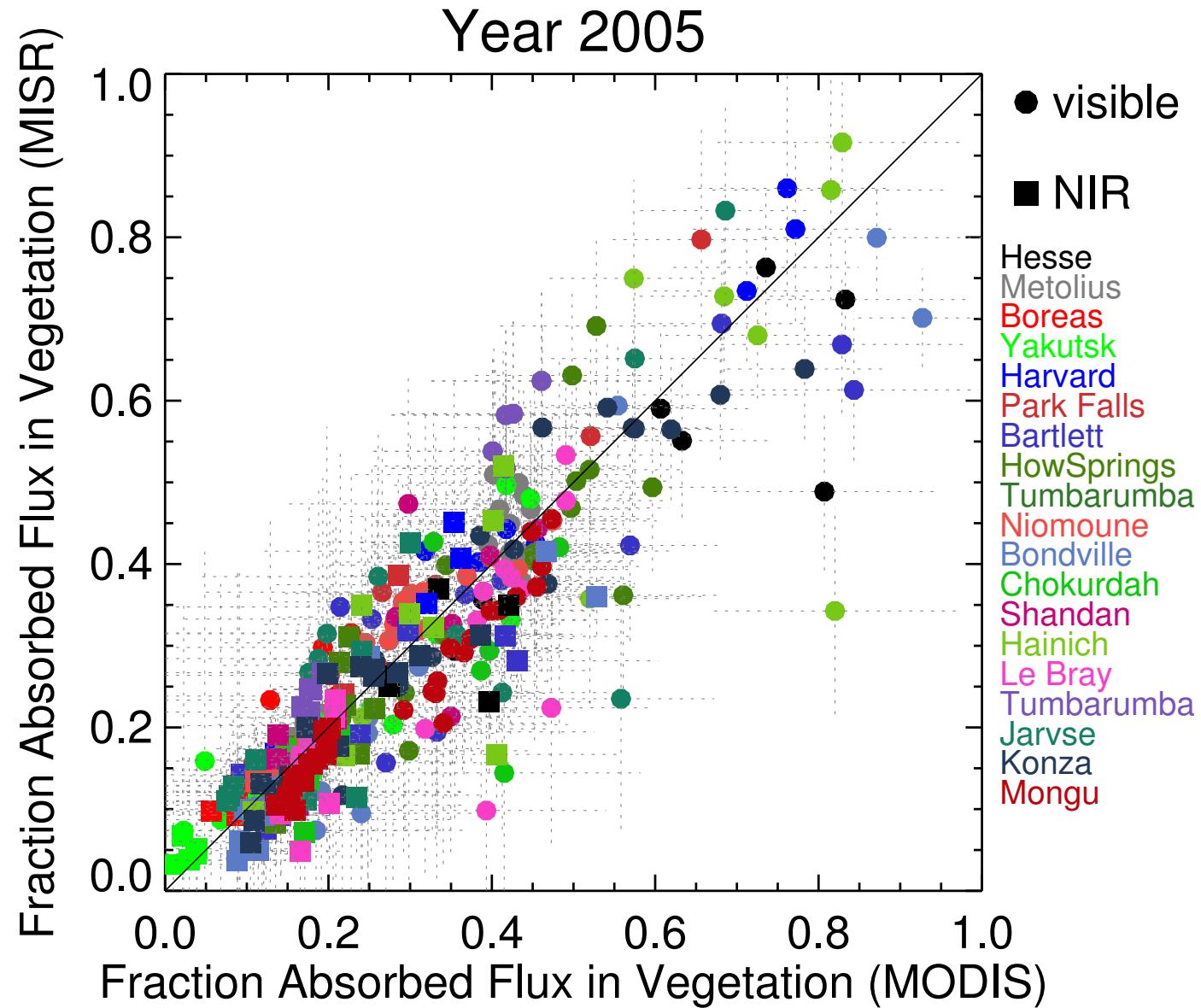
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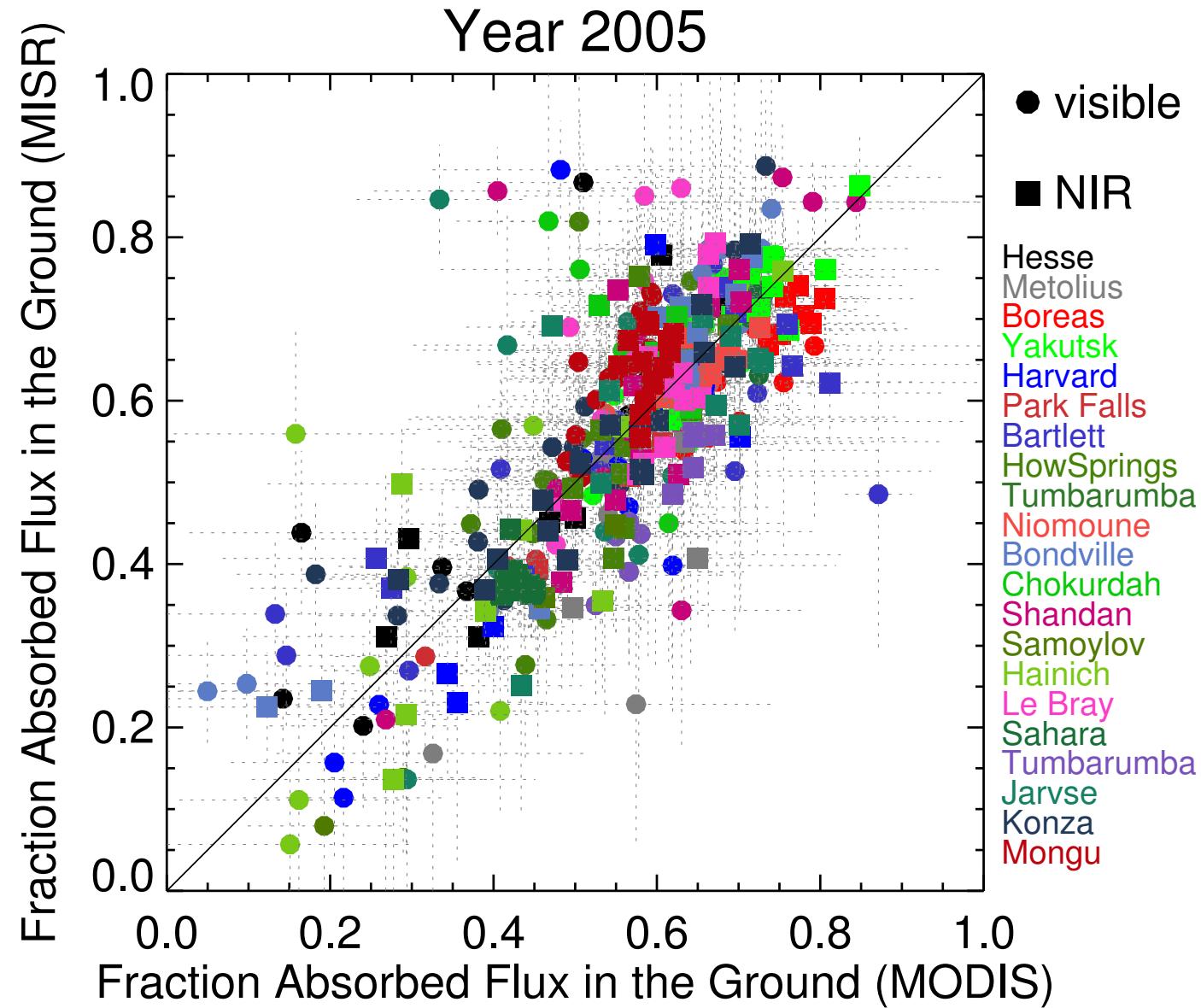
*a priori* 'green' leaves

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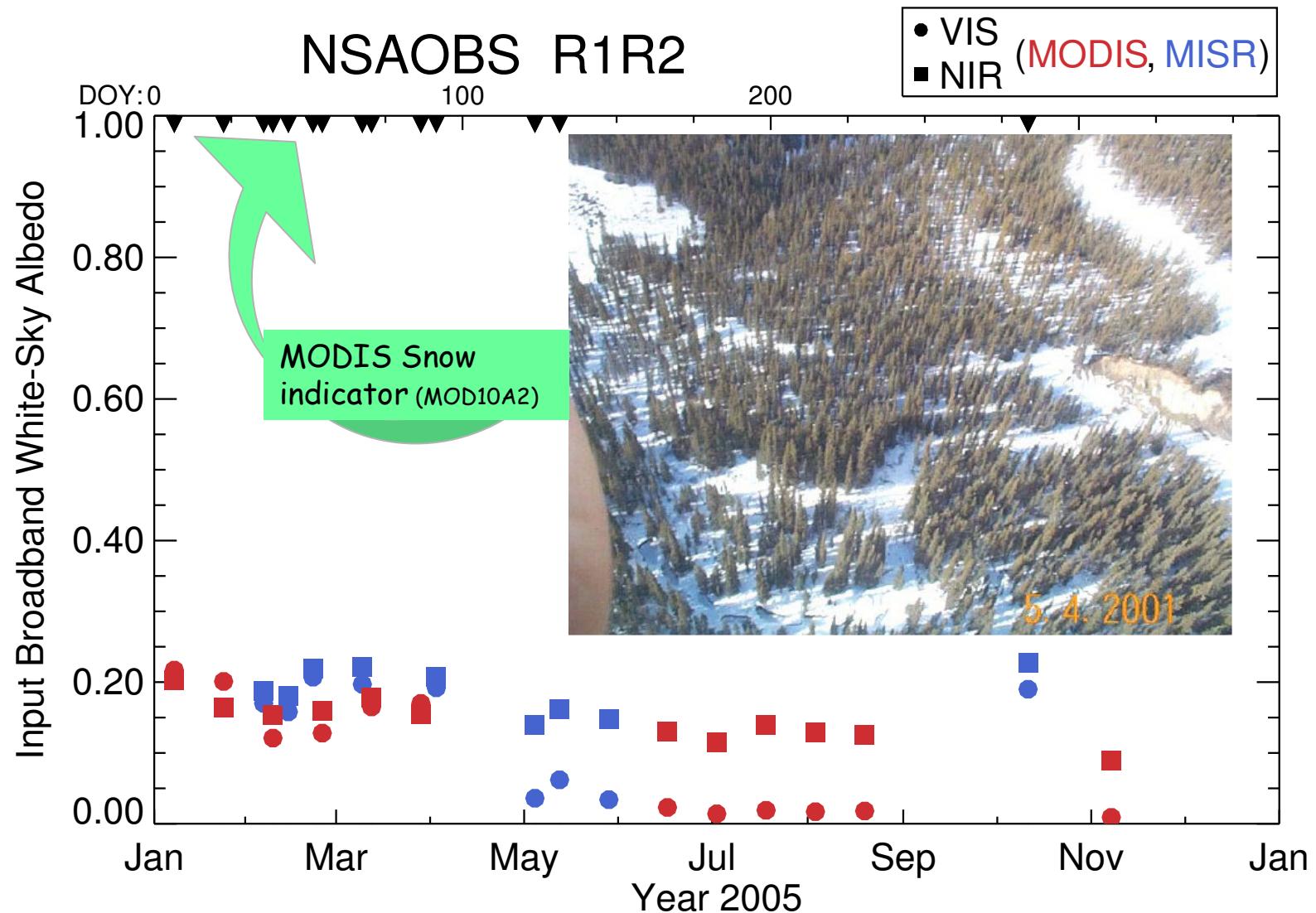
# Concluding remarks

1. Computer efficient **inversion package** has been designed and tested : estimate of uncertainty on all retrievals
2. This integrated package can be used for various purposes : **retrieval** of parameters from RS products, **validation** of RS products, **assimilation** of RS products into Land surface schemes.
3. Capability to generate global surface model parameters ensuring **full consistency** with measured (uncorrelated) fluxes from various sources: **spectral albedos** from MODIS-MISR (and any other sources).
4. Estimating radiant fluxes and surface parameters in the presence of snow .

# Application over BOREAS NSA-OBS

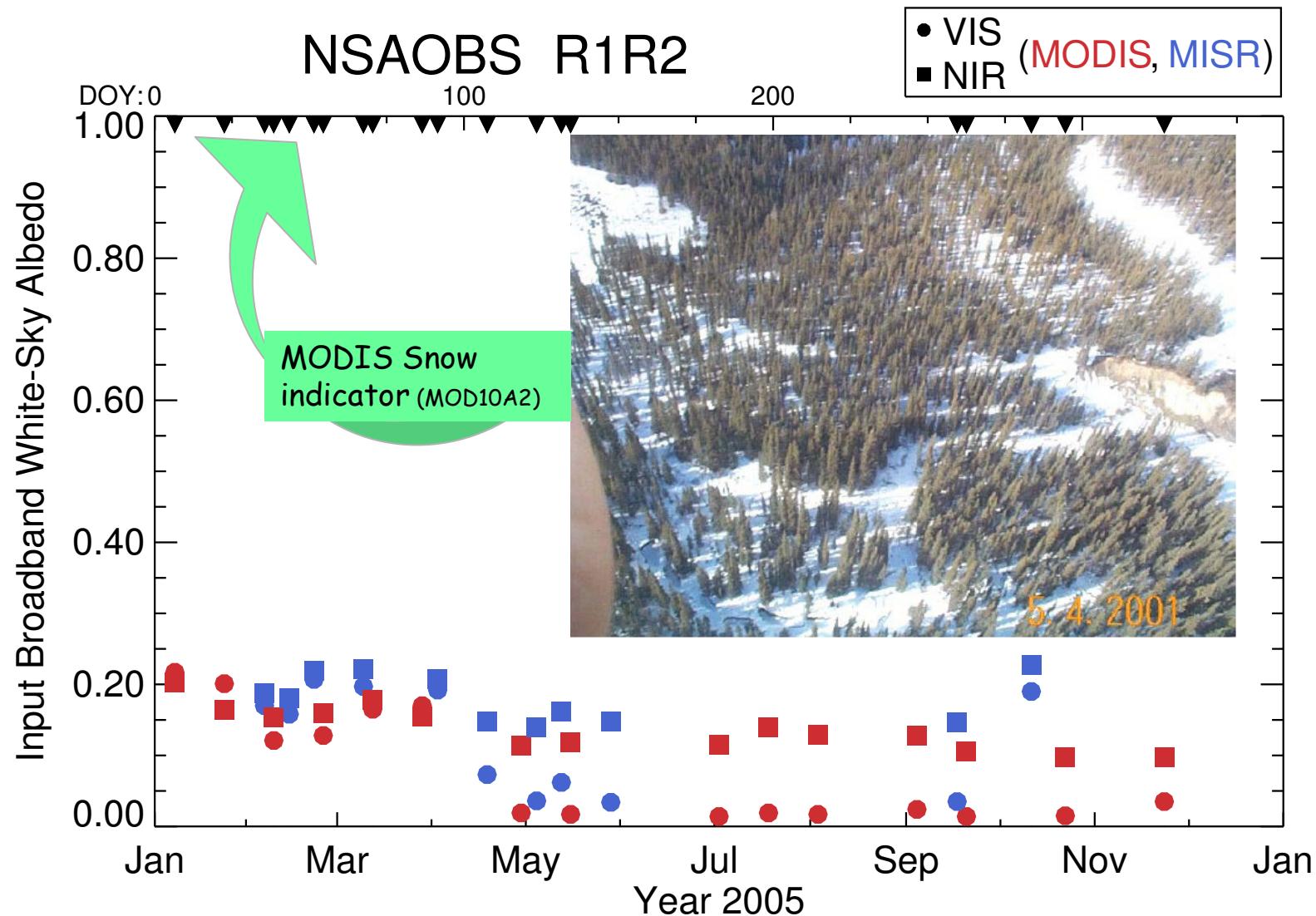


# Application over BOREAS: Measurements



Specified uncertainty on BHRs is 5% relative

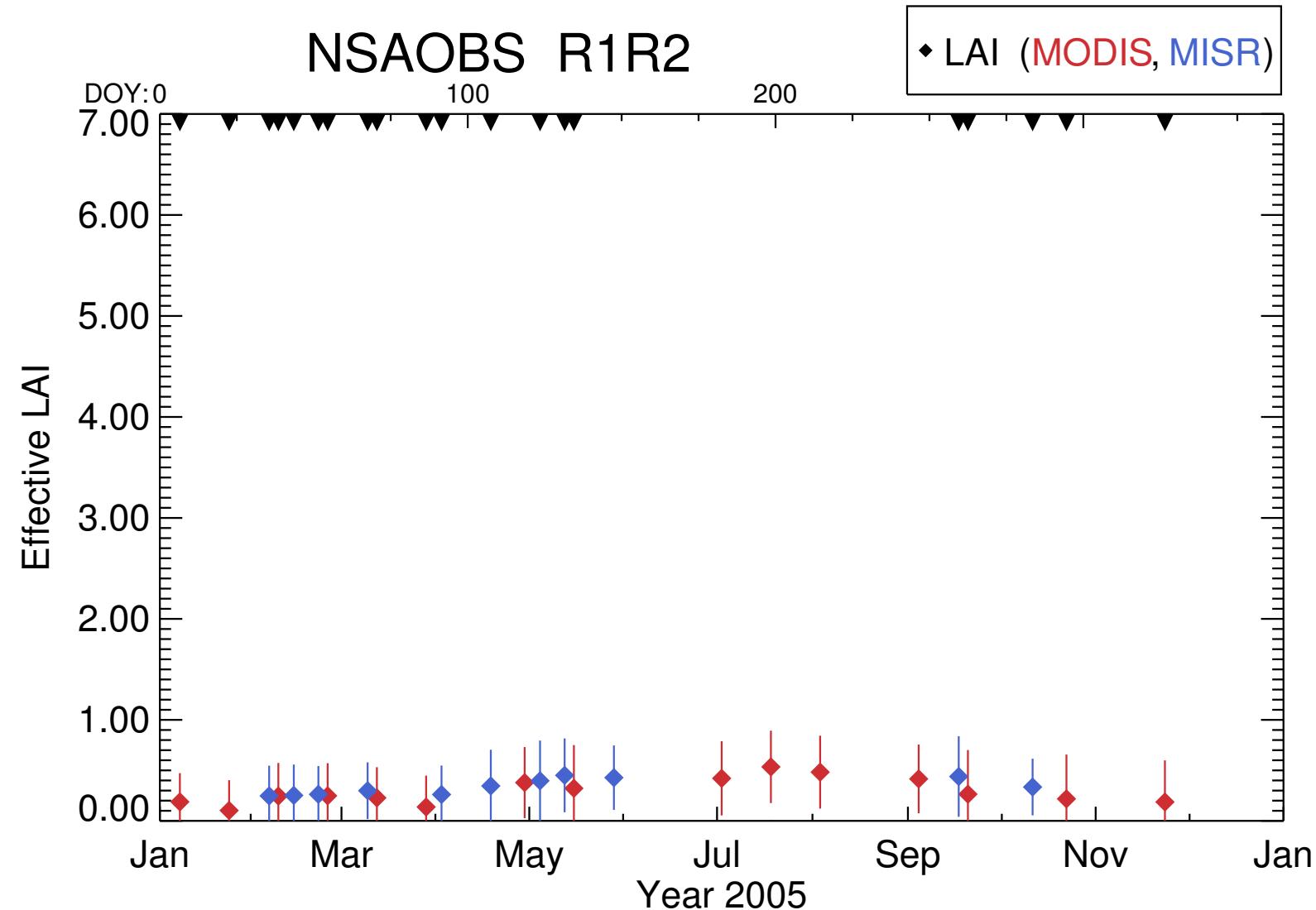
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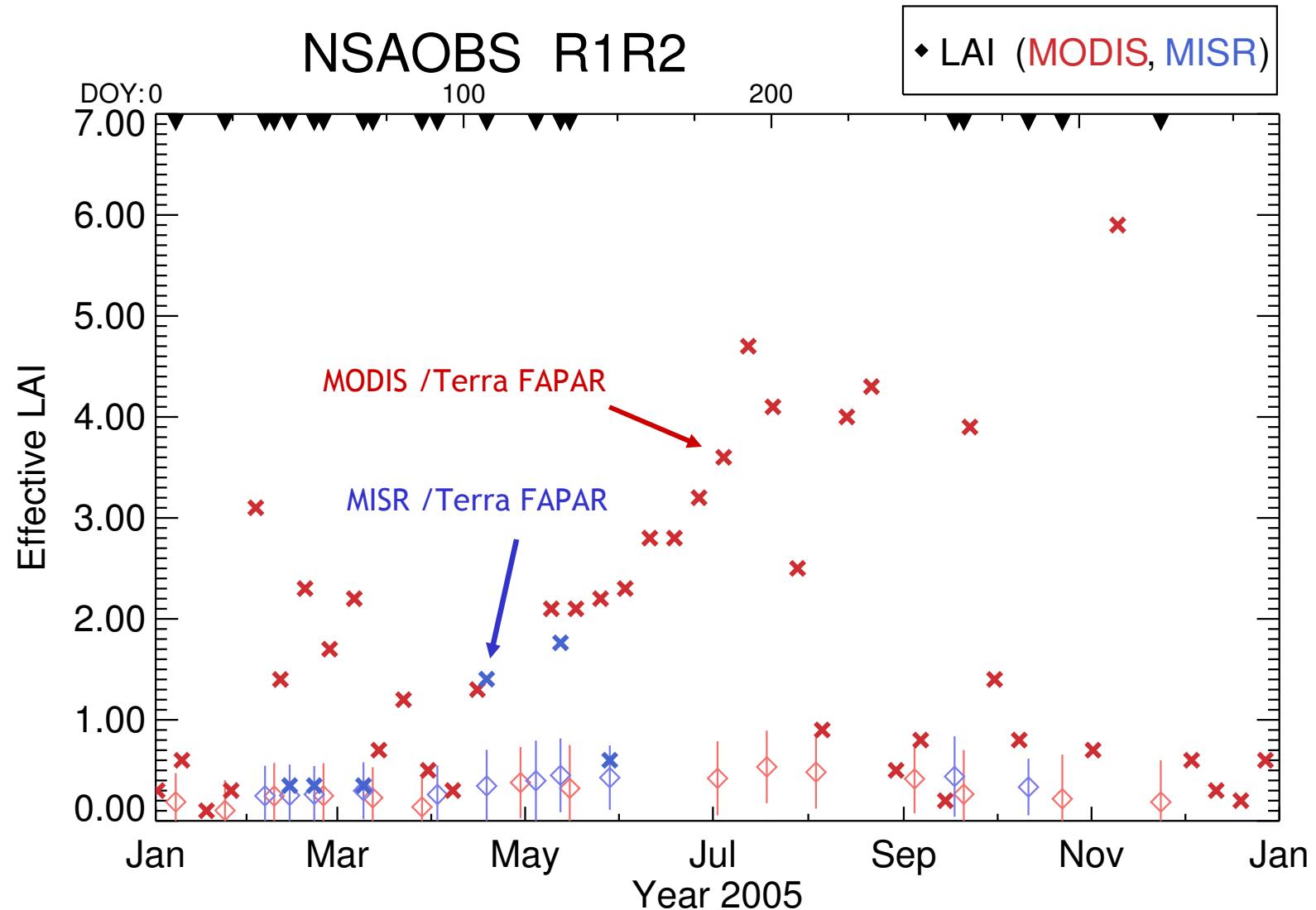
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# Application over NSAOBS: model parameters



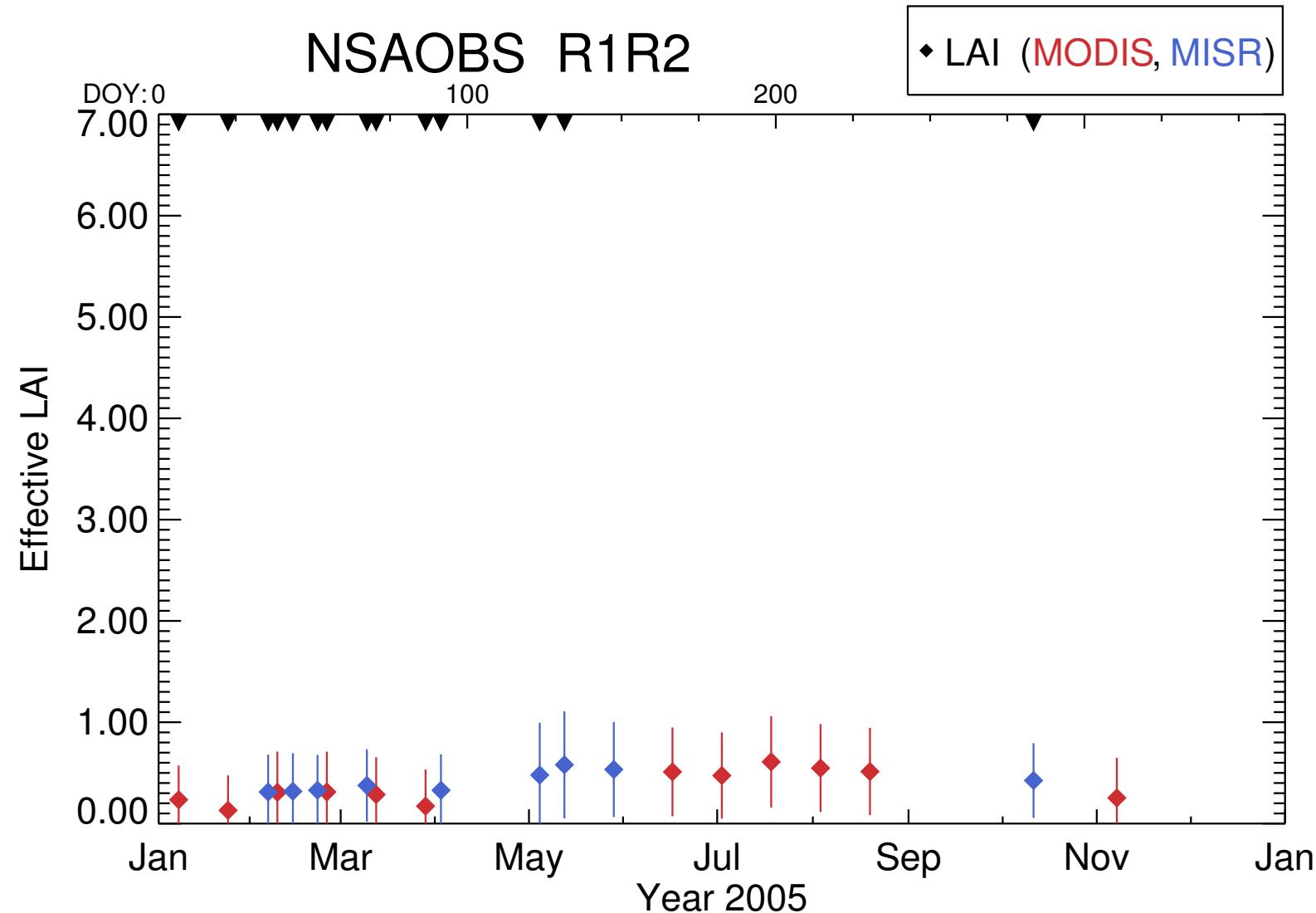
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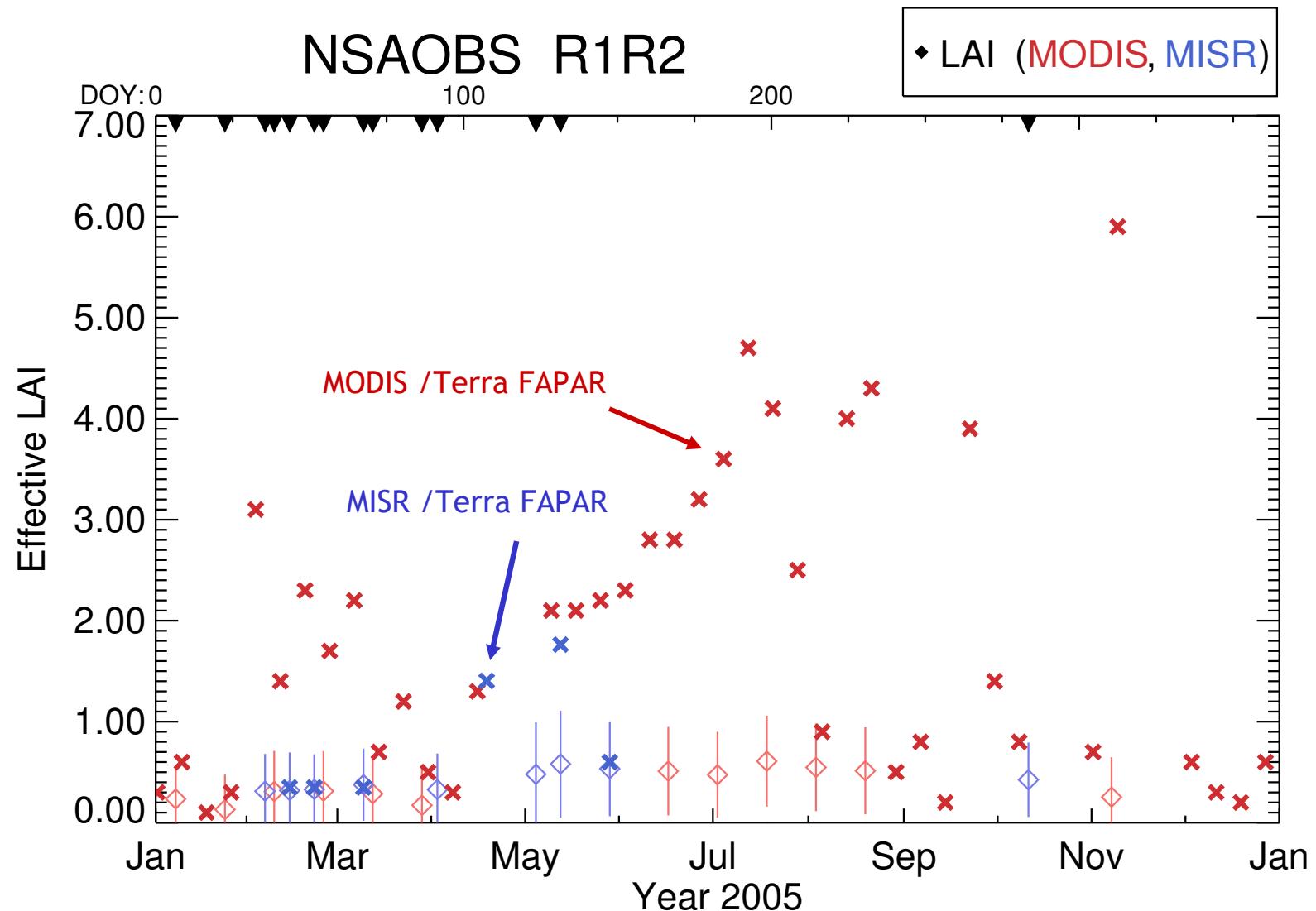


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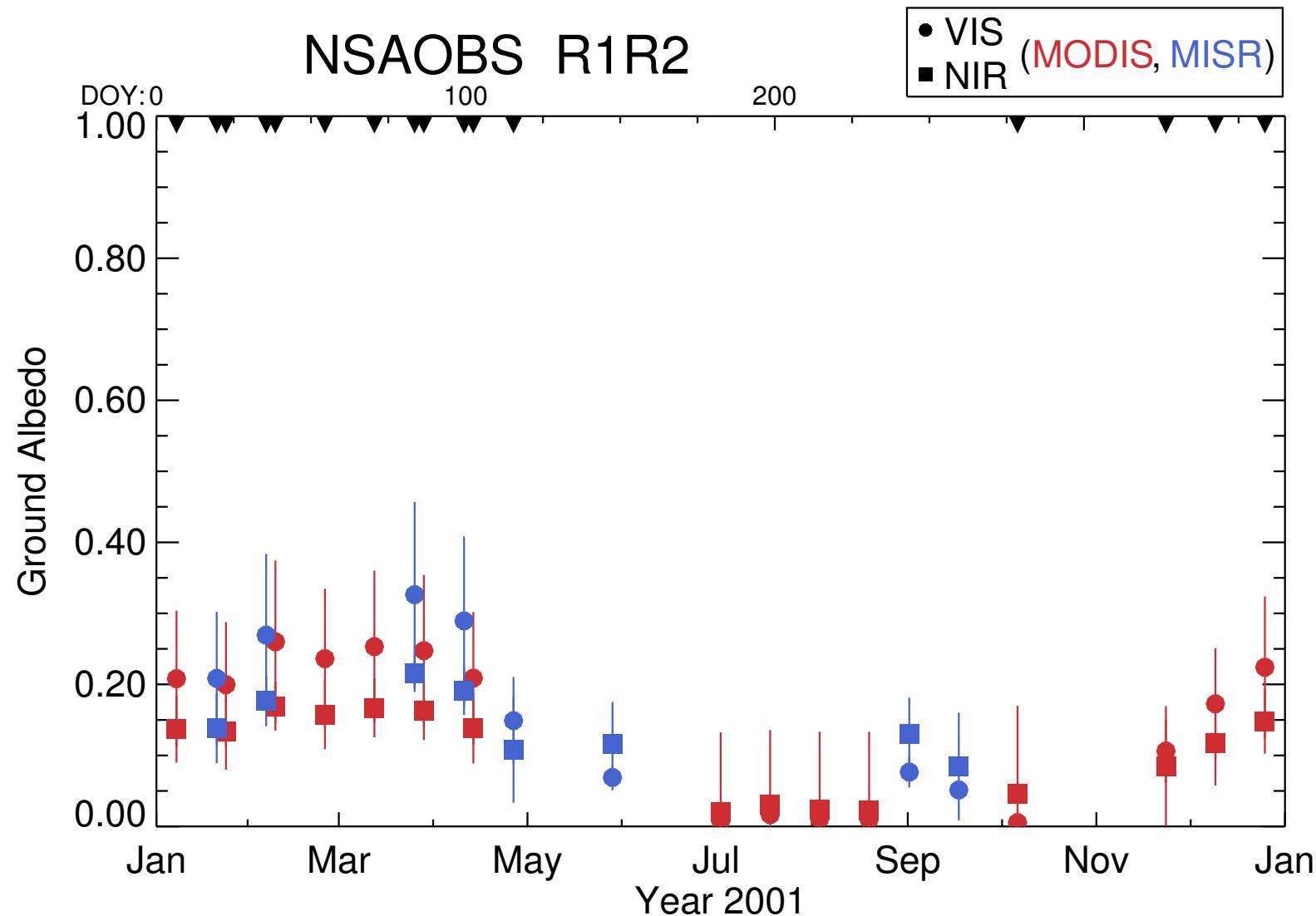
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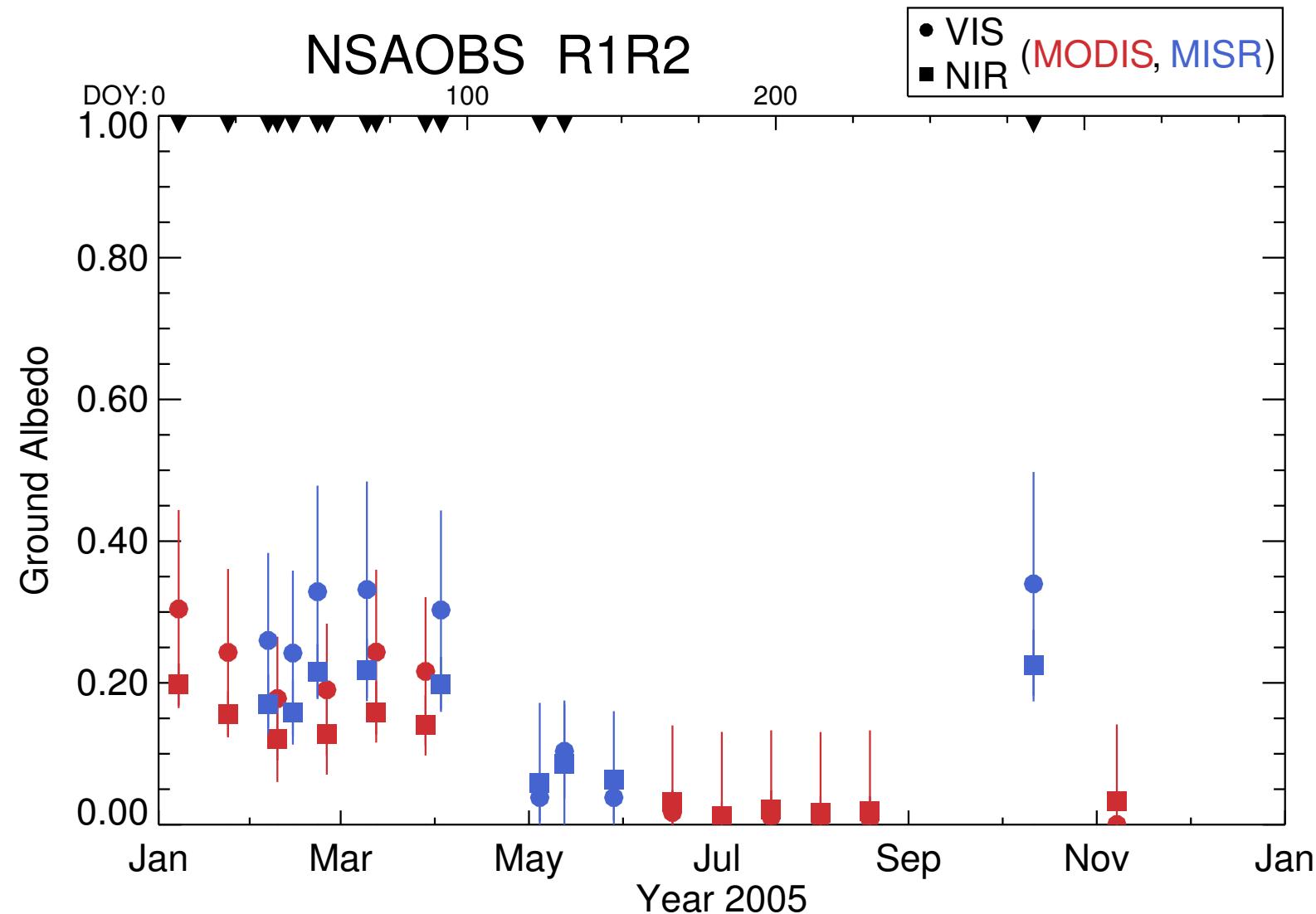


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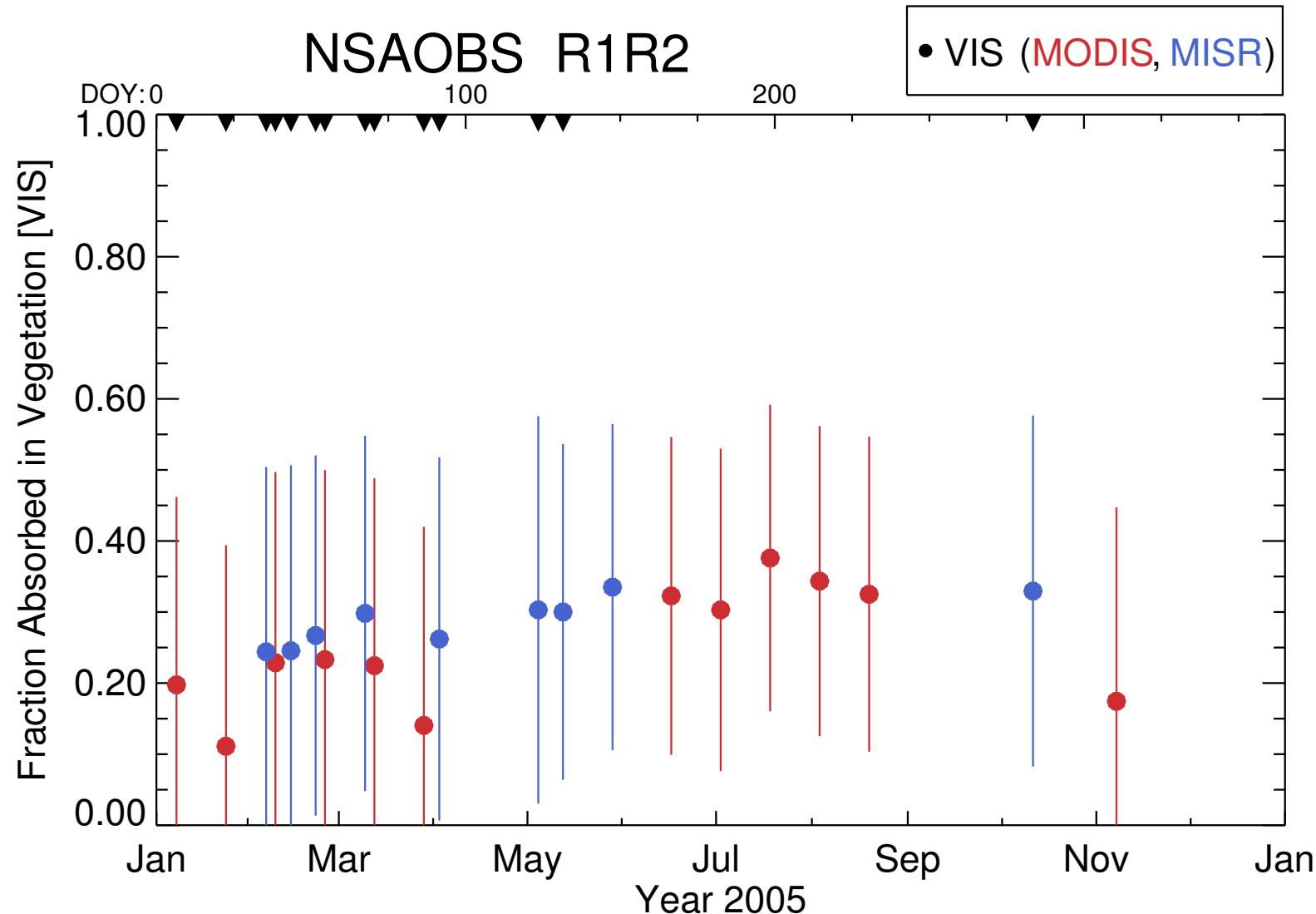


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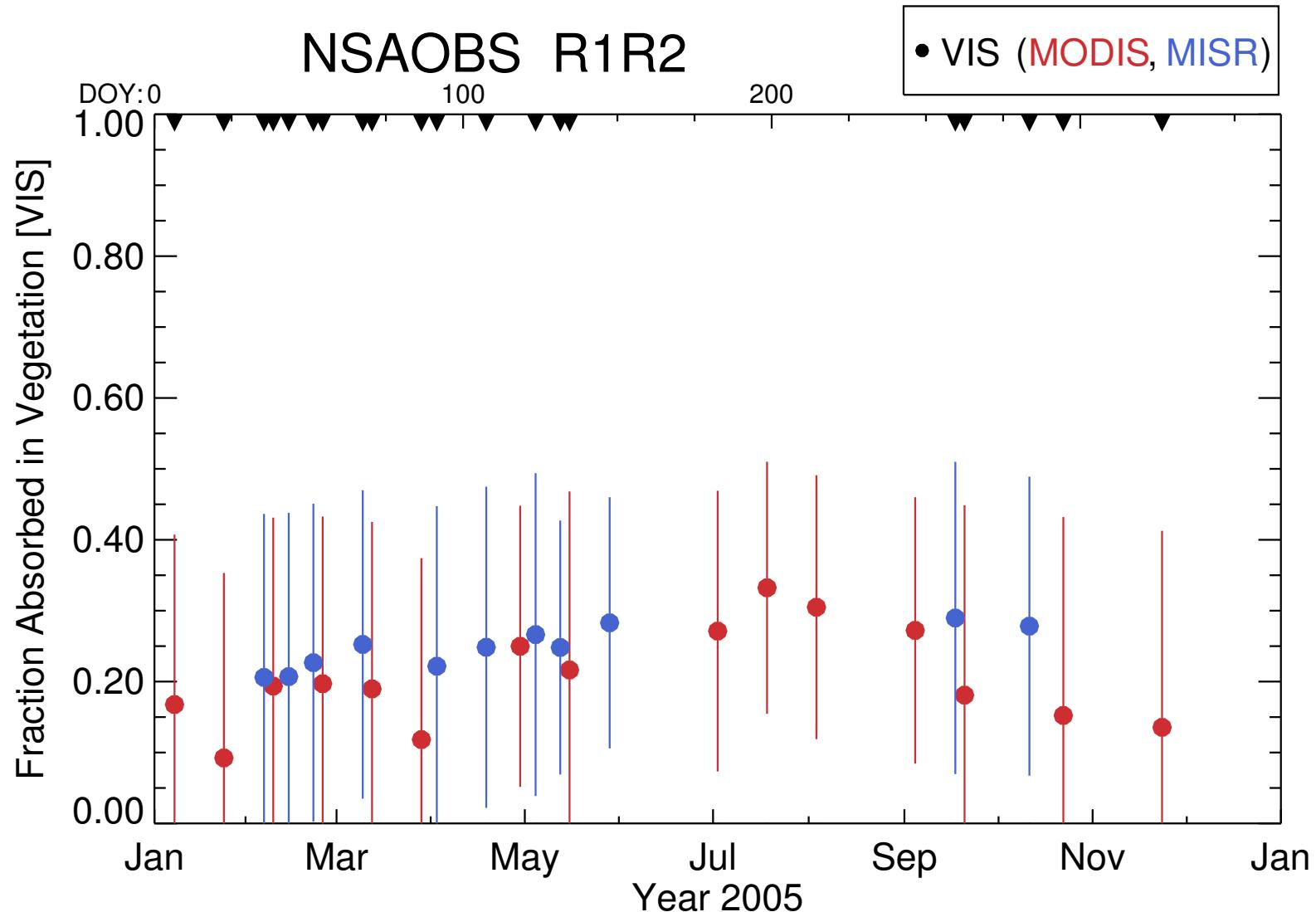
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# Application over NSAOBS: radiant fluxes

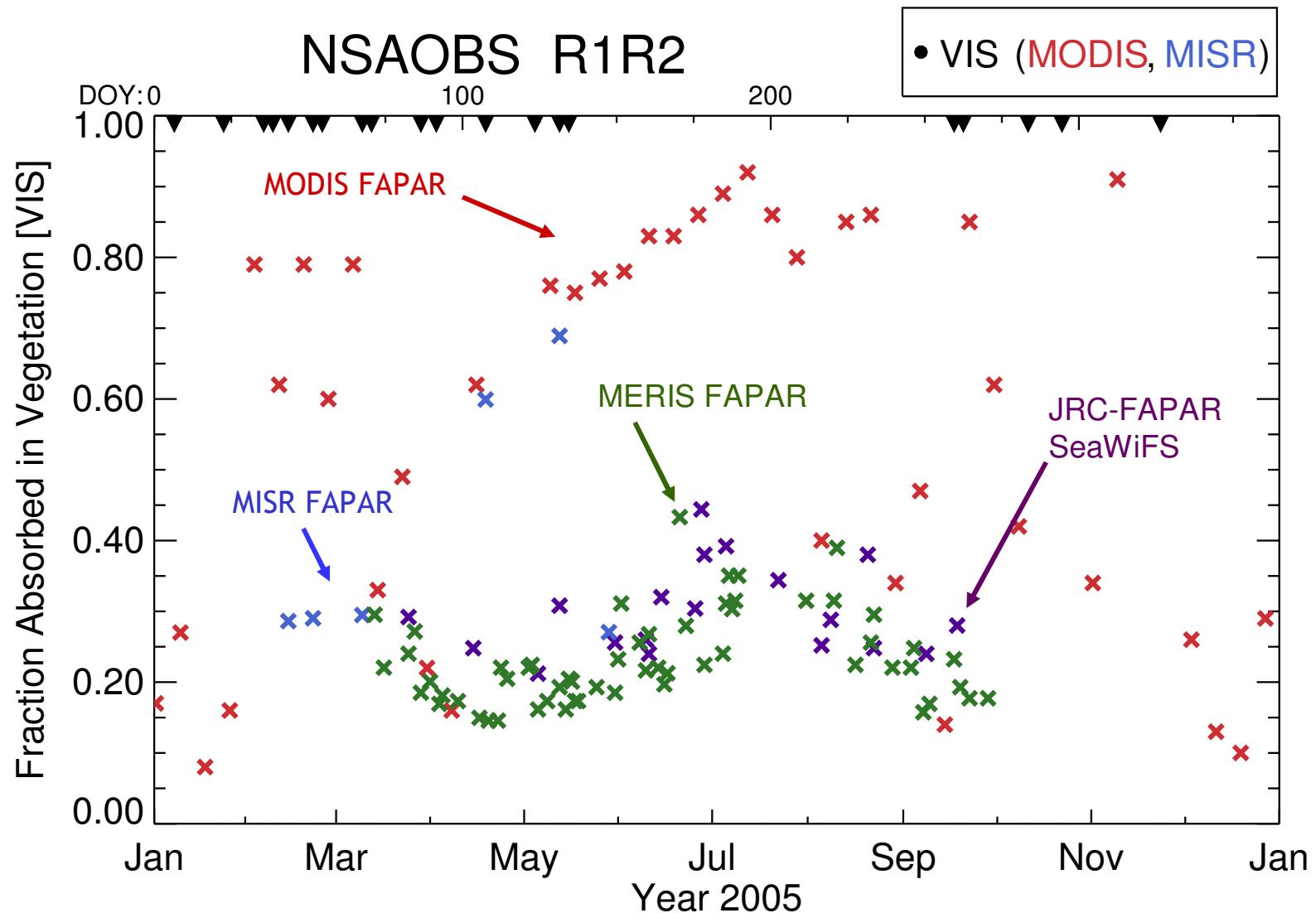


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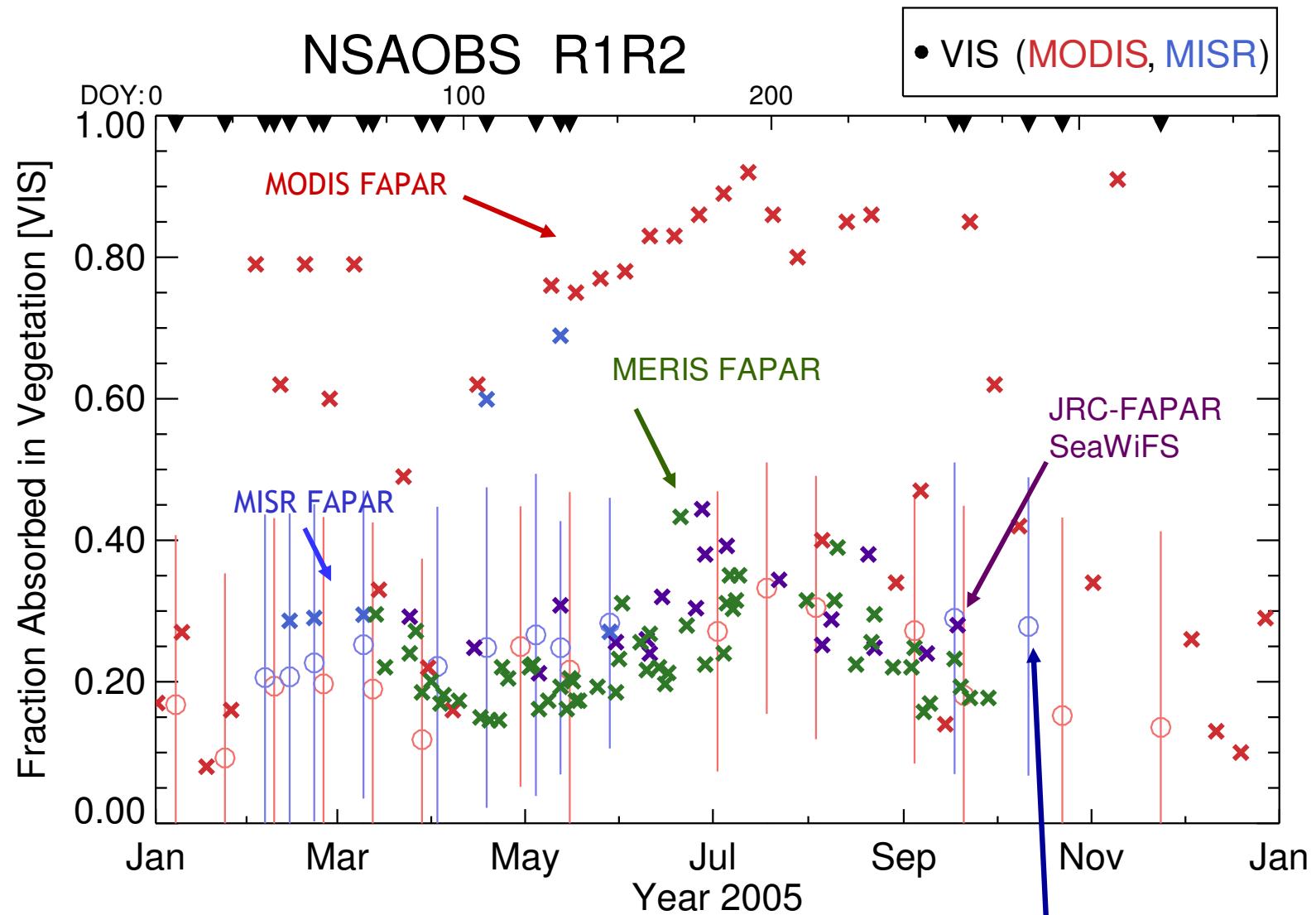
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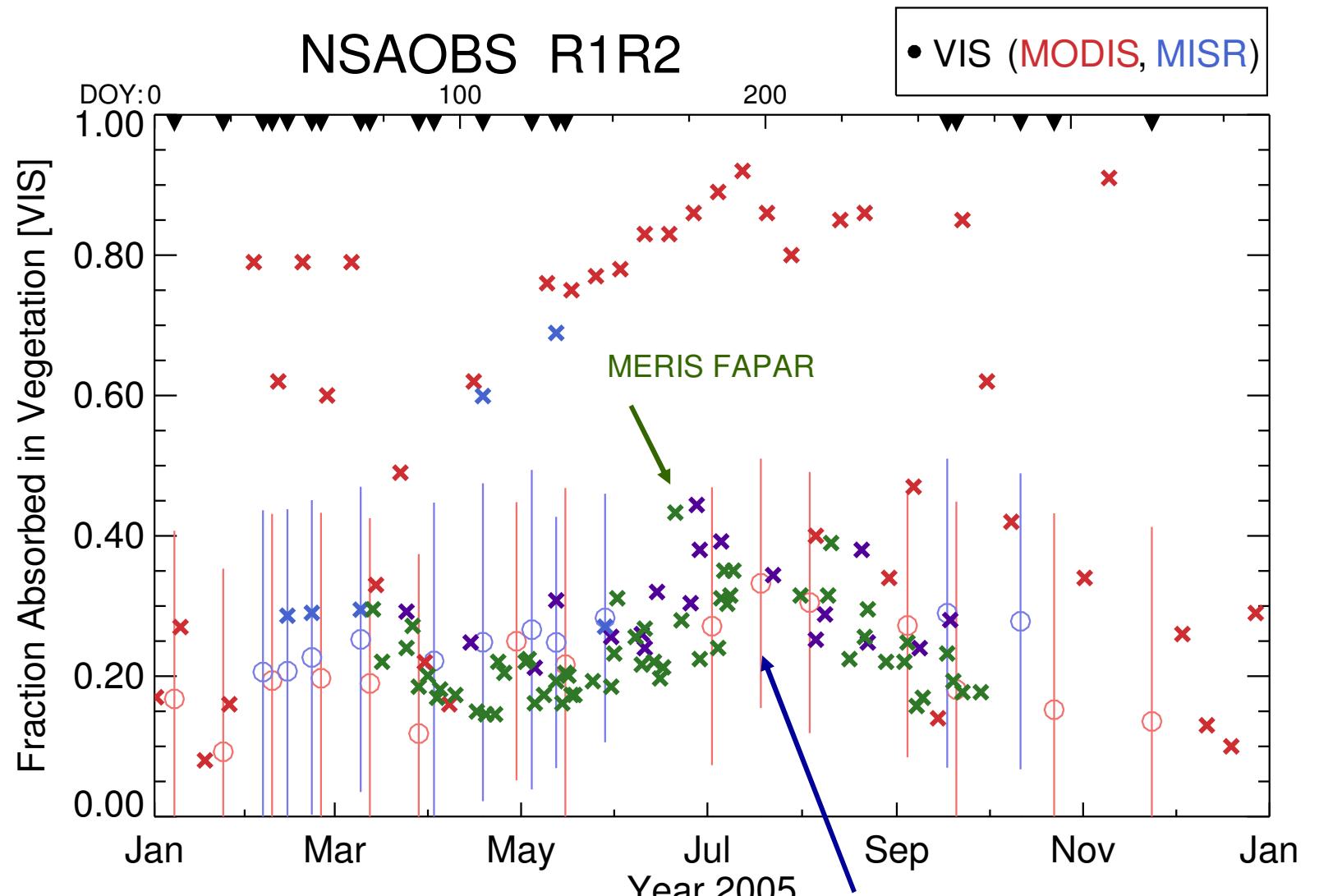
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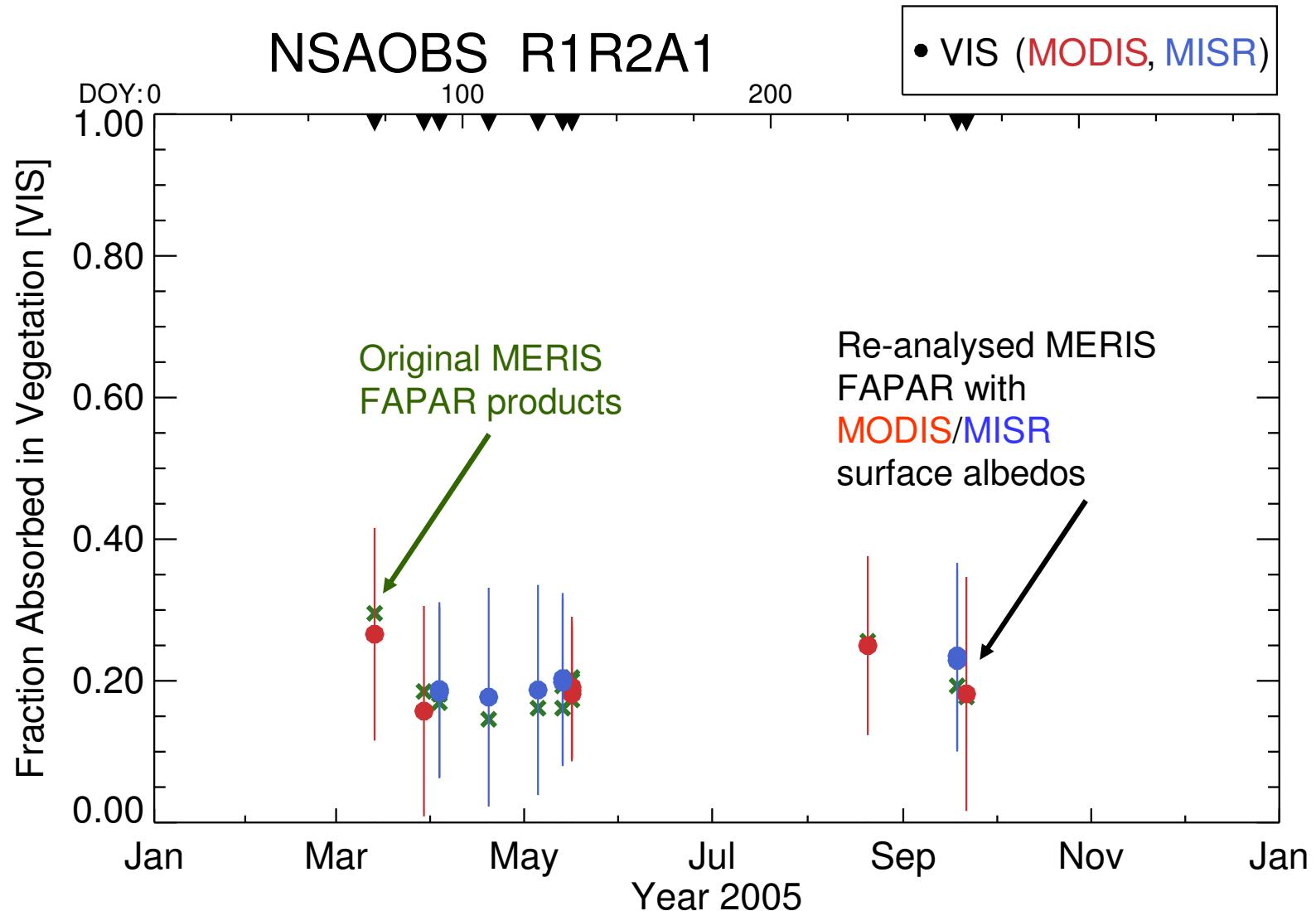
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# Application over NSAOBS: radiant fluxes



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# Application over NSAOBS: radiant fluxes



*Assimilation of the MODIS and MISR surface albedos*