

**Jet Propulsion Laboratory**  
California Institute of Technology

# Cloud Information Content in EPIC's O<sub>2</sub> A- and B-band channels (680, 688, 764, 780 nm): Two Approaches, Same Conclusions

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# Outline

- **Optimal estimation approach**

- A.B. Davis, G. Merlin, C. Cornet, L. C.-Labonnote, J. Riédi, N. Ferlay, P. Dubuisson, Q. Min, Y. Yang, and A. Marshak. Cloud information content in EPIC/DSCOVR's oxygen A- and B-band channels: An optimal estimation approach. J. Quant. Spectrosc. Rad. Transf., 216, 6-16 (2018).

<https://doi.org/10.1016/j.jqsrt.2018.05.007>

- **Physics-based approach**

- A.B. Davis, N. Ferlay, Q. Libois, A. Marshak, Y. Yang, and Q. Min. Cloud information content in EPIC/DSCOVR's oxygen A- and B-band channels: A physics-based approach. J. Quant. Spectrosc. Rad. Transf. (2018, in press).

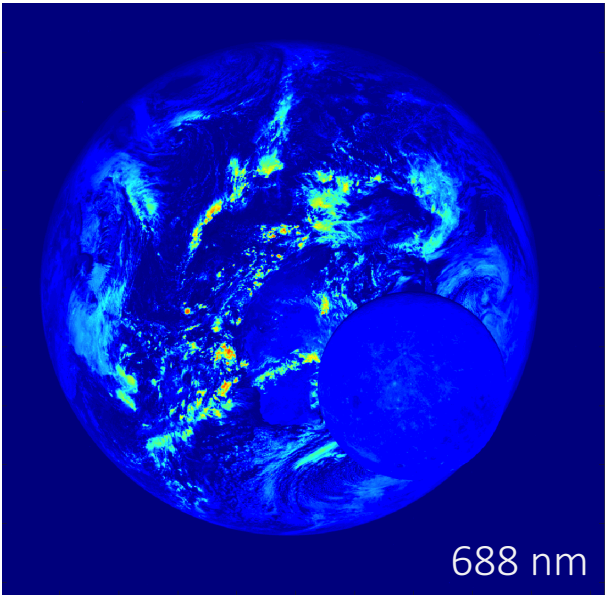
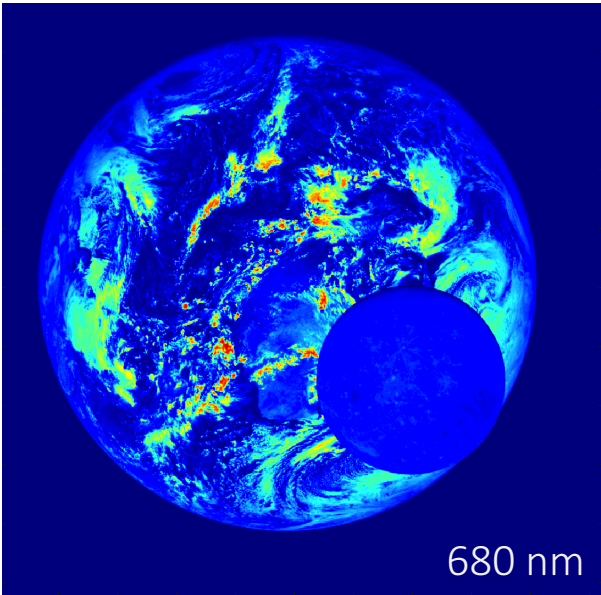
<https://doi.org/10.1016/j.jqsrt.2018.09.006>

- **Conclusions/outlooks**

# EPIC's A- and B-band channels ... at 11/17 new Moon

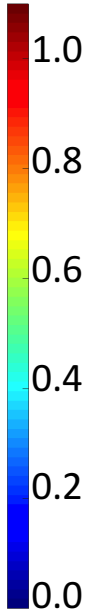
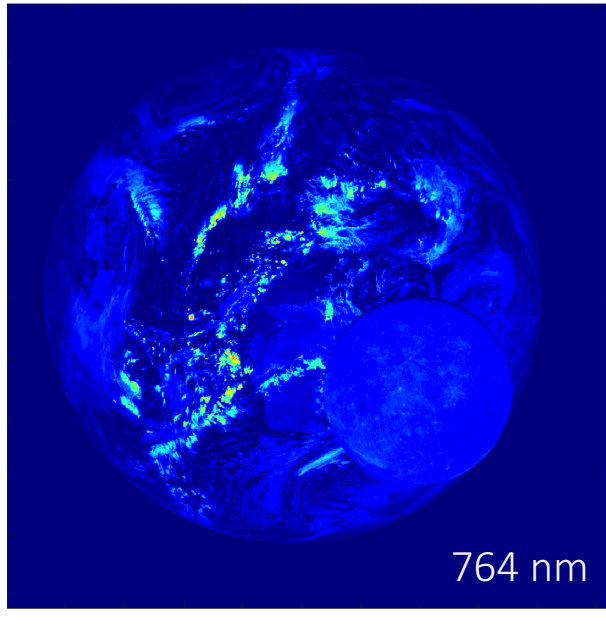
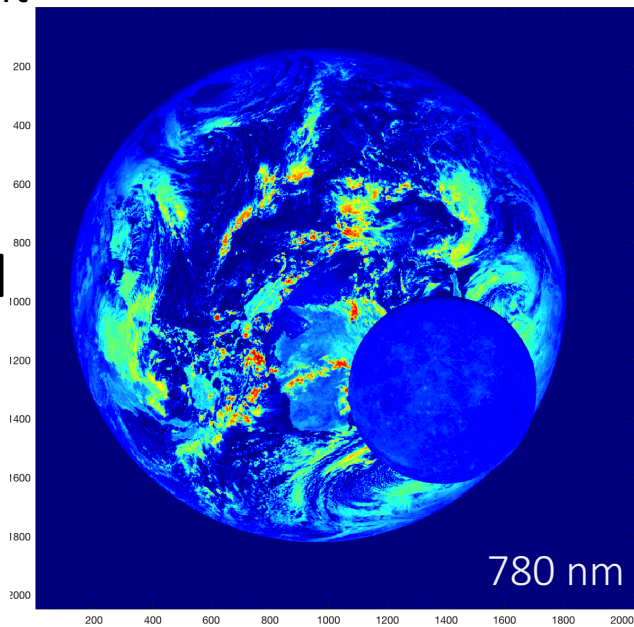
EPIC/DSCOVR  
O<sub>2</sub> channels:

**B-band**  
 $\tau_{O_2} \approx 0.3$



Reference on left  
( $\tau_{O_2} = 0$ )

**A-band**  
 $\tau_{O_2} \approx 0.6$



2017-11-19

# EPIC/DSCOVR O<sub>2</sub> channels ... at 11/17 new Moon

EPIC/DSCOVR  
O<sub>2</sub> channels:

**B-band**

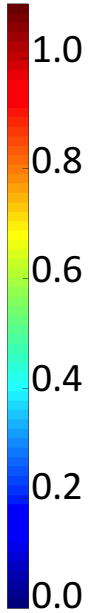
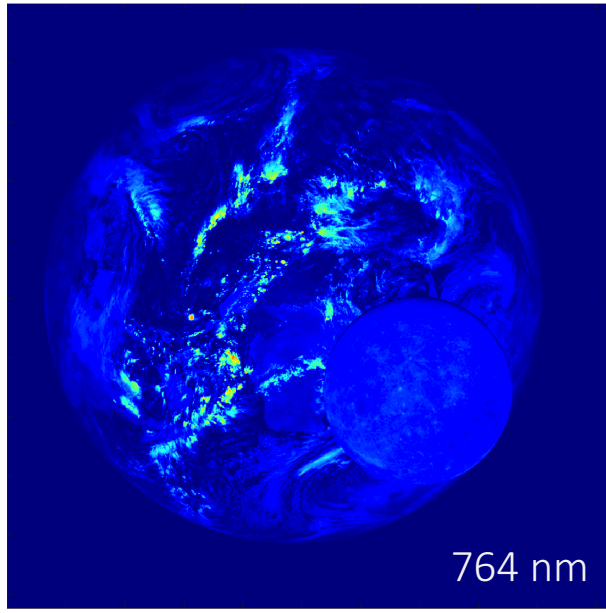
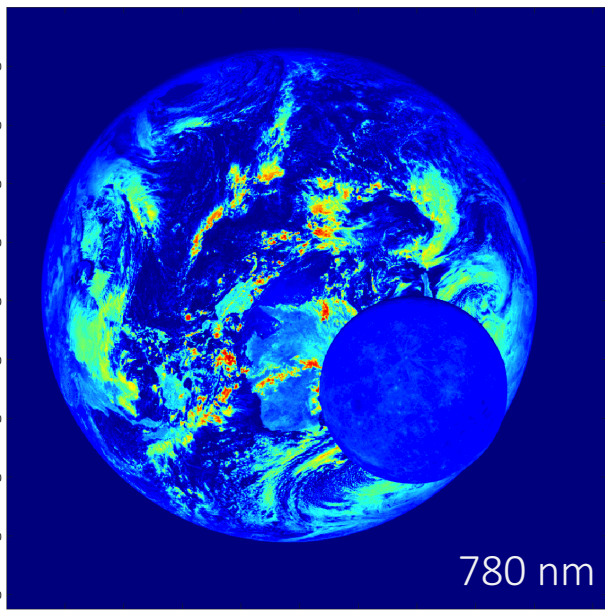
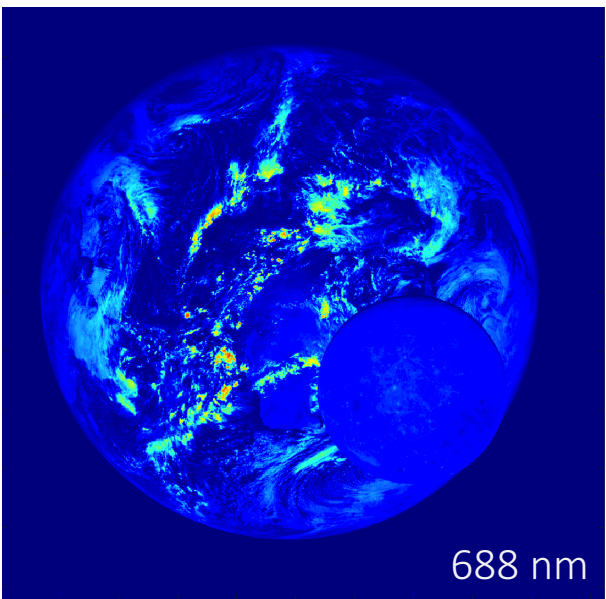
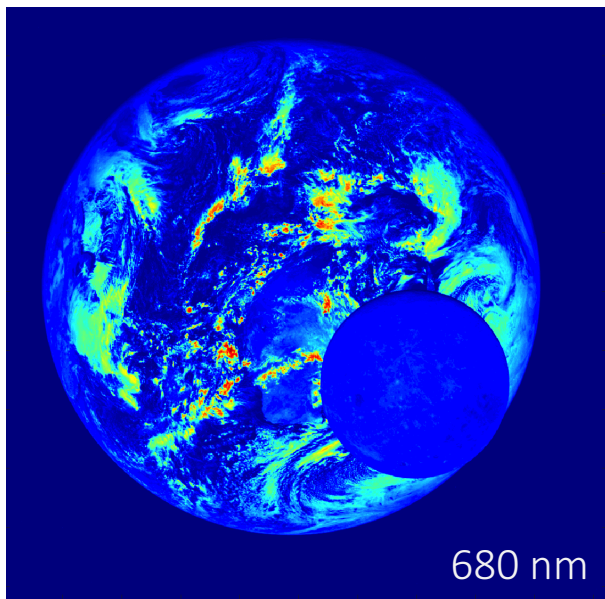
$\tau_{O_2} \approx 0.3$

Reference on left  
( $\tau_{O_2} = 0$ )

**A-band**

$\tau_{O_2} \approx 0.6$

effective optical thicknesses



2017-11-19

# EPIC's A- and B-band channels ... at 11/17 new Moon

EPIC/DSCOVER  
O<sub>2</sub> channels:

**B-band**

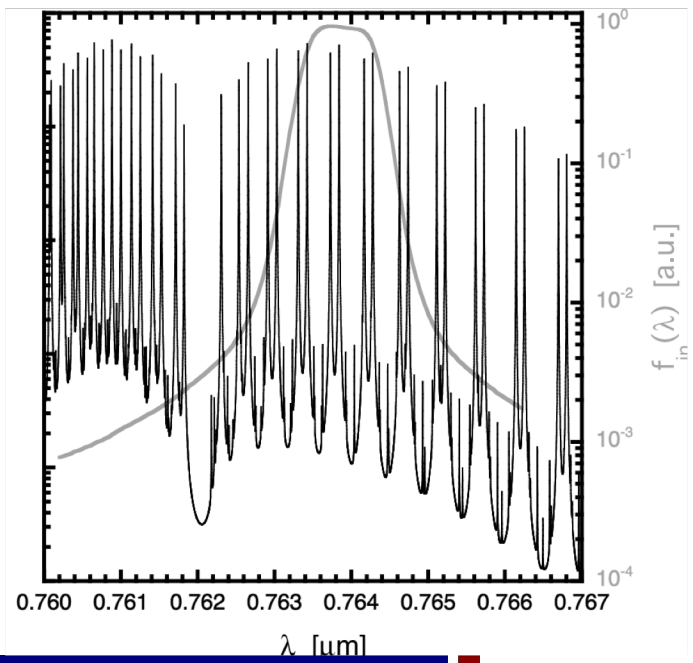
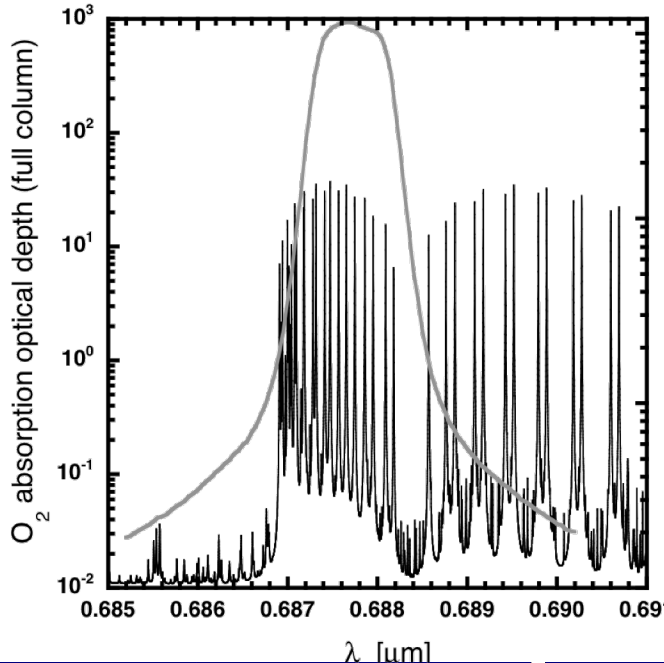
$\tau_{O_2} \approx 0.3$

Reference on left  
( $\tau_{O_2} = 0$ )

**A-band**

$\tau_{O_2} \approx 0.6$

effective optical thicknesses



$$\tau_{O_2}^{(\Delta\lambda)}(M) = -\frac{1}{M} \log \left( \int_{\Delta\lambda} \exp[-M\tau_{O_2}(\lambda; 0)] f_{in}^*(\lambda) d\lambda \right)$$

so-called "airmass" factor

$$M = \frac{1}{\cos \theta_0} + \frac{1}{\cos \theta} = \frac{1}{\mu_0} + \frac{1}{\mu}$$



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200 400 600 800 1000 1200 1400 1600 1800 2000

# Statistical (optimal estimation) approach



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errors

sensor ↓  
model ↓

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Anthony B. Davis<sup>a,\*</sup>, Guillaume Merlin<sup>b</sup>, Céline Cornet<sup>b</sup>, Laurent C. Labonnote<sup>b</sup>, Jérôme Riédi<sup>b</sup>, Nicolas Ferlay<sup>b</sup>, Philippe Dubuisson<sup>b</sup>, Qilong Min<sup>c</sup>, Yuekui Yang<sup>d</sup>, Alexander Marshak<sup>d</sup>

not shown here:  $S_y = S_\epsilon + S_b$

## Bayes' theorem:

PDF of total cost function =

PDF of forward model prediction error on  $\mathbf{y}$

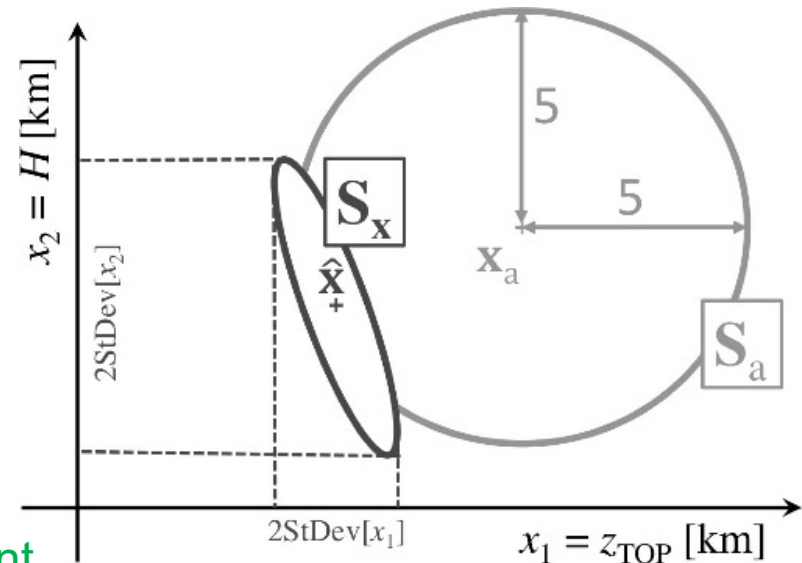
x PDF of prior uncertainty on state vector  $\mathbf{x}$

likelihood of  $\mathbf{y}$ , given  $\mathbf{x}$     prior uncertainty on  $\mathbf{x}$

$$p(\mathbf{x}|\mathbf{y}) = \underbrace{p(\mathbf{y}|\mathbf{x})}_{\text{likelihood}} \underbrace{p(\mathbf{x})}_{\text{prior uncertainty}} / \underbrace{p(\mathbf{y})}_{\text{unimportant}}$$

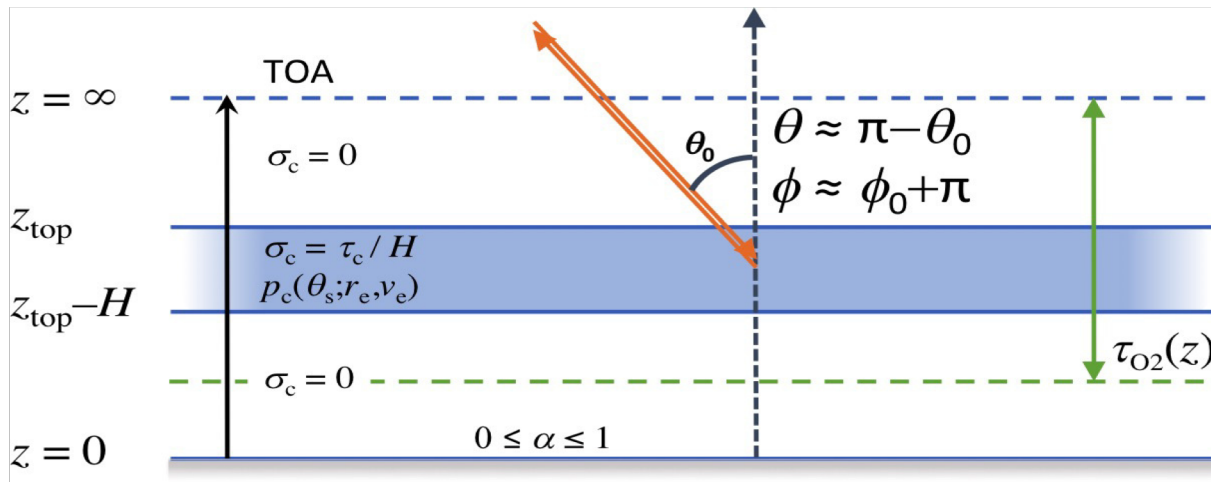
posterior uncertainty on  $\mathbf{x}$ , given  $\mathbf{y}$     unimportant

observations ↓



# (Partial) Shannon information content / gain

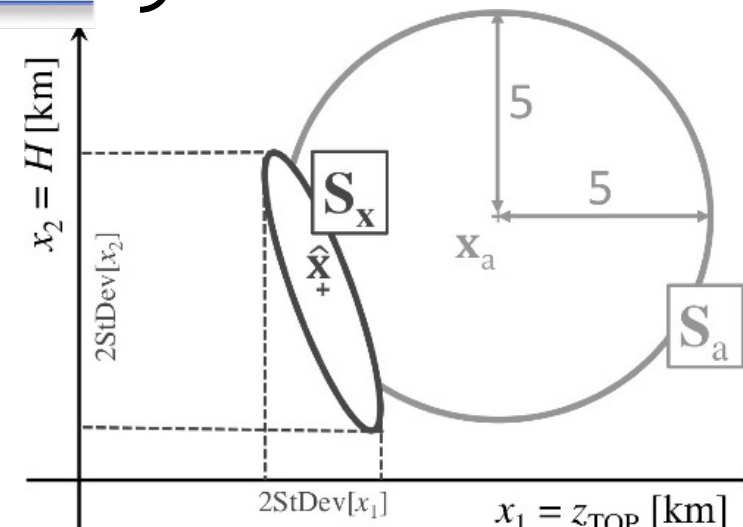
Information Content (IC) gain or Degrees-Of-Freedom (DOF) per cloud property = ratio of the areas of  $S_a$  and  $S_x$ , projected onto one of the state/ $\mathbf{x}$ -space axes



$$\mathbf{x}^T = (z_{\text{top}}, H)$$

$$\mathbf{y}^T = (I_{\text{abs},\lambda} / I_{\text{ref},\lambda}, \lambda = \text{A-, B-bands})$$

Total information content/gain = Ratios of ellipses areas  $|S|$ , i.e., of products of minor and major axes of the prior-to-posterior PDFs



# Posterior uncertainty of the retrieved cloud properties

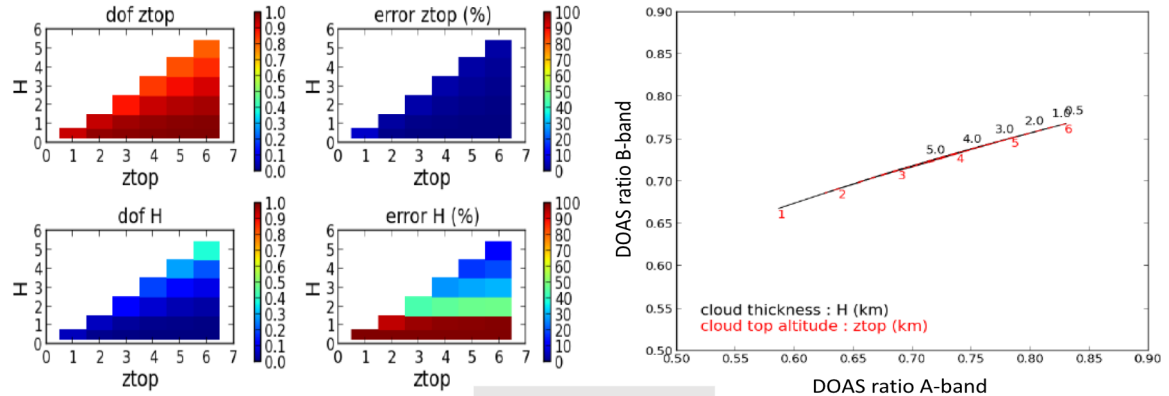
$0 \leq \text{pDOF}_i \leq 1$ , for  $i = 1, 2$  ( $z_{\text{top}}, H$ ) and  $\sigma_{pi} = \sigma_{ai}(1 - \text{DOF}_i)^{1/2}$  for the standard deviations.

Errors expressed here in %:  $100 \sigma_i/x_i$

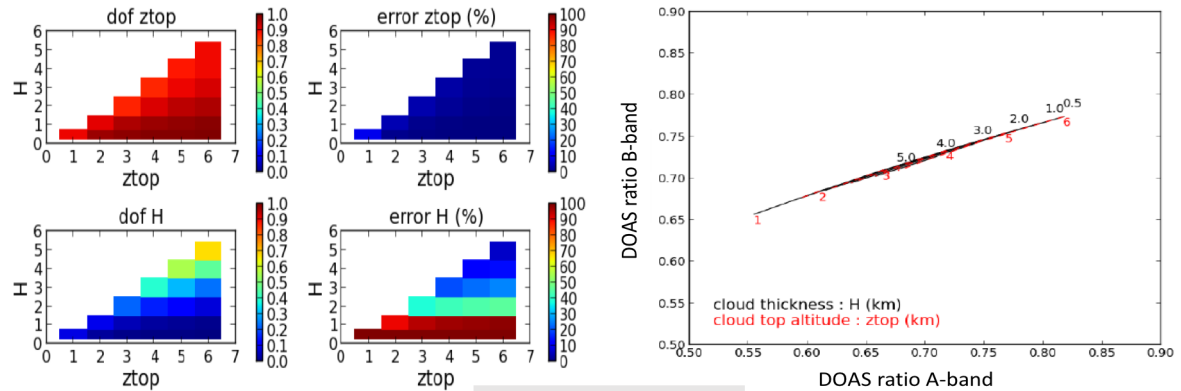
“Nakajima-King” plots of DOAS ratios

DOAS: Differential Optical Absorption Spectroscopy

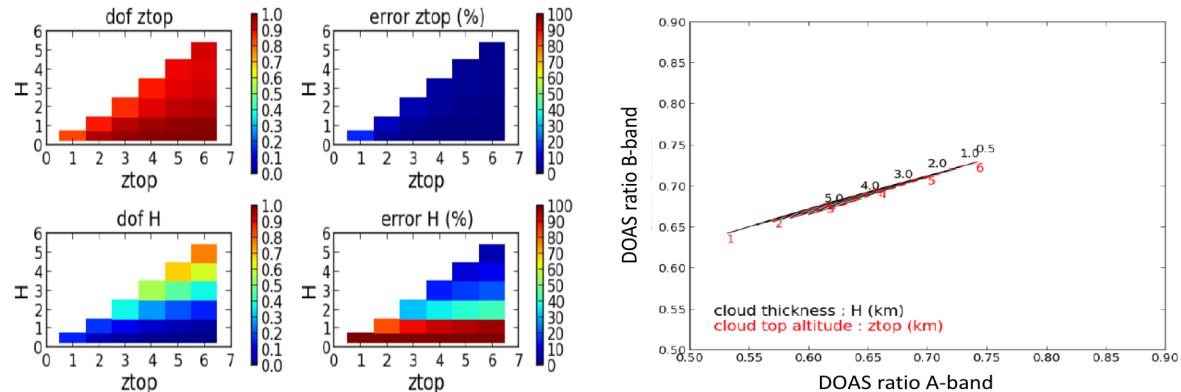
$\tau_c = 1, \alpha = 0$



$\tau_c = 32, \alpha = 0$



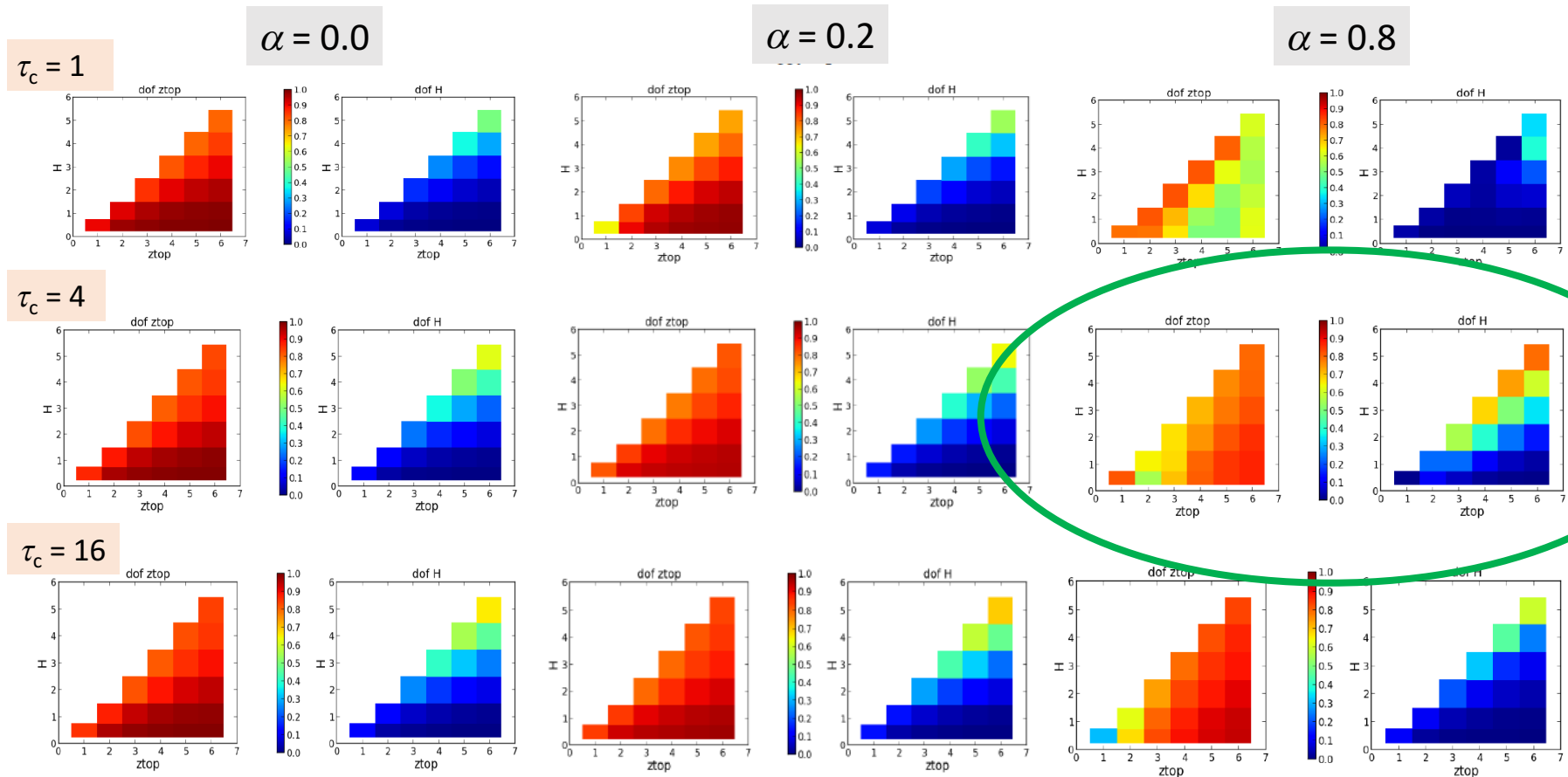
$\tau_c = 32, \alpha = 0.8$





# A sweet spot for $z_{\text{top}}$ and $H$ retrieval?

→ moderately opaque clouds over bright surfaces ...



... a possible application to arctic clouds?

# Conflict with Yang et al. (2013)?

cloud optical thickness (COT)  $\tau_c = 30$

→ not really ...

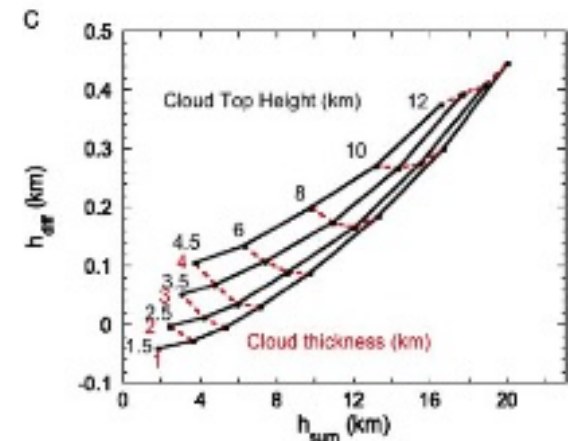
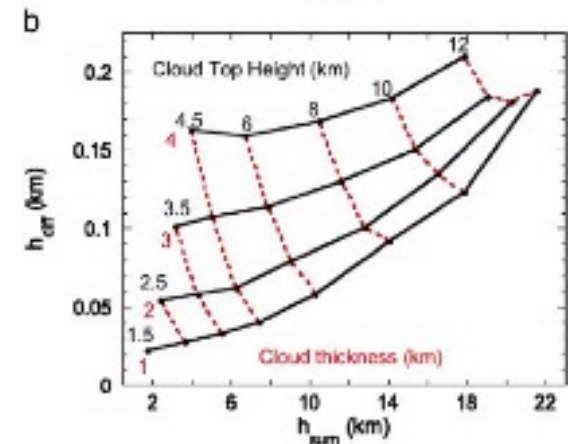
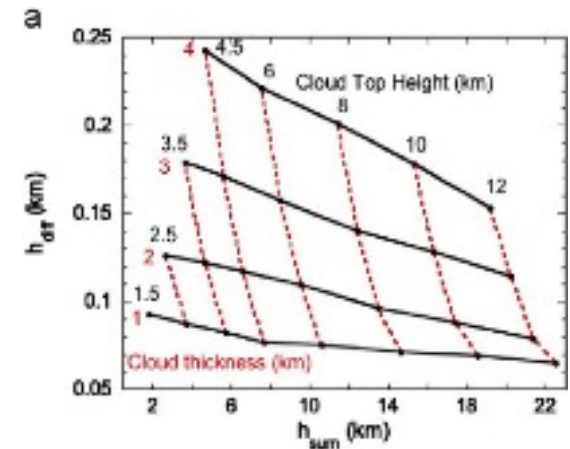
ECH: “effective” cloud height

$$h_{\text{diff, sum}} = \text{CEH}_A \pm \text{CEH}_B$$

Factoring in sensor error,  
uncertainty on  $h_{\text{diff}}$  is  $\sim$  vertical axes  
uncertainty on  $h_{\text{sum}}$  is  $\ll$  horizontal axes

$\tau_c = 10$

$\tau_c = 5$



# Physical modeling approach

## Assumptions:

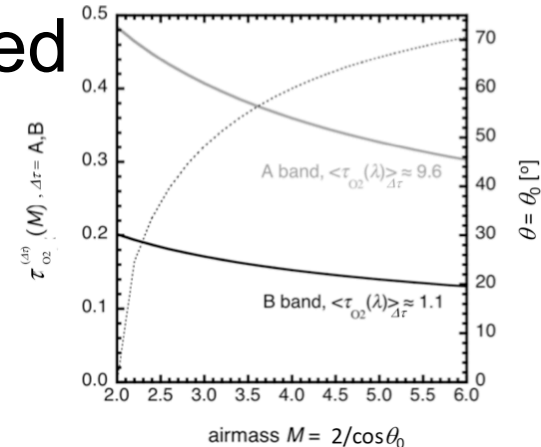
- plane-parallel geometry (1D RT is OK)
- optical thick clouds (asymptotic/diffusion theory)
- dark surface (water)
- “effective” O<sub>2</sub> optical depth for each band ↓
- exponential pressure profile, as needed

... i.e., it's OK to use  $\tau_{O_2}^{(\Delta\lambda)}(M)$  here

$$\begin{aligned}
 -\log r_\lambda(\Omega; \Omega_0, \tau_c) &\approx (1/\mu_0 + 1/\mu) \tau_{O_2}(\lambda; z_{\text{top}}) \\
 &\quad + (\mu + \mu_0) \underbrace{[\tau_{O_2}(\lambda; z)]_{z_{\text{top}}-H}^{z_{\text{top}}}}_{\dots \text{ and here}} \times \underbrace{(1 + C(\tau_c, g, \mu_0))}_{\text{a pre-asymptotic correction term}}
 \end{aligned}$$

DOAS ratio

... and here



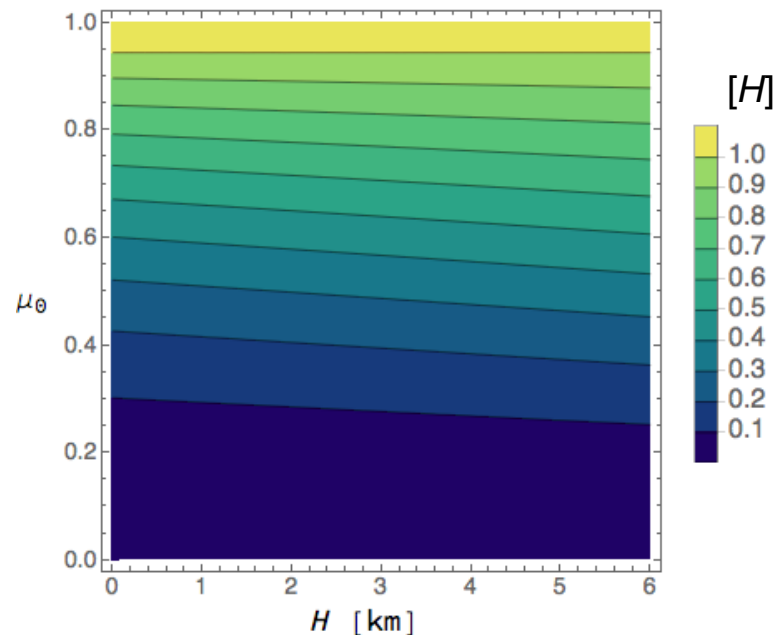
a pre-asymptotic correction term

# Physical insights ...

retrieval bias from ignoring in-cloud path length

$$z_{\text{top}}^{(\text{app})} \approx z_{\text{top}} - \overbrace{H_{\text{mol}} \log \left[ 1 + \mu_0 \mu \left( e^{H/H_{\text{mol}}} - 1 \right) \times \left( 1 + C(\tau_c, g, \mu_0) \right) \right]}^{\text{retrieval bias from ignoring in-cloud path length}}$$
$$\approx -\mu_0 \mu H \times \left( 1 + C(\tau_c, g, \mu_0) \right)$$

Normalized CTH bias  $\left( z_{\text{top}} - z_{\text{top}}^{(\text{app})} \right) / H$  from (19) for EPIC  
( $\mu_0 = \mu$ ), and  $H_{\text{mol}} = 8$  km.

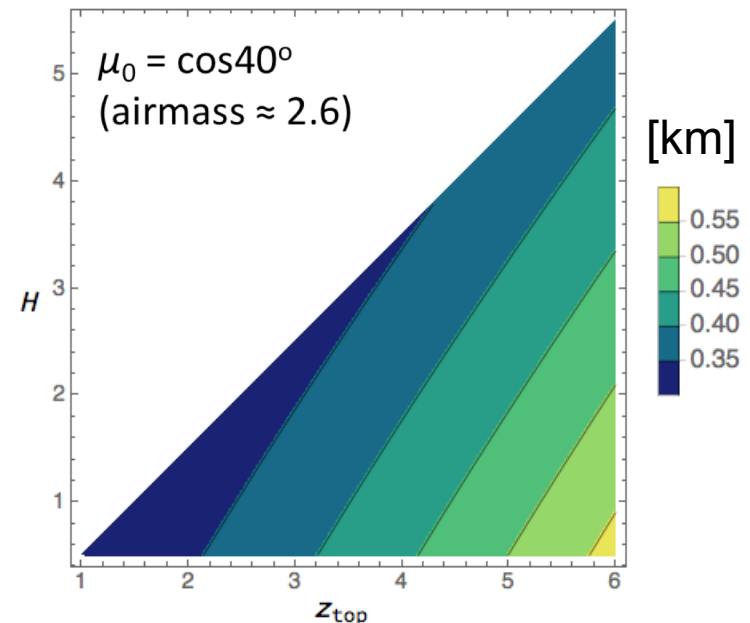
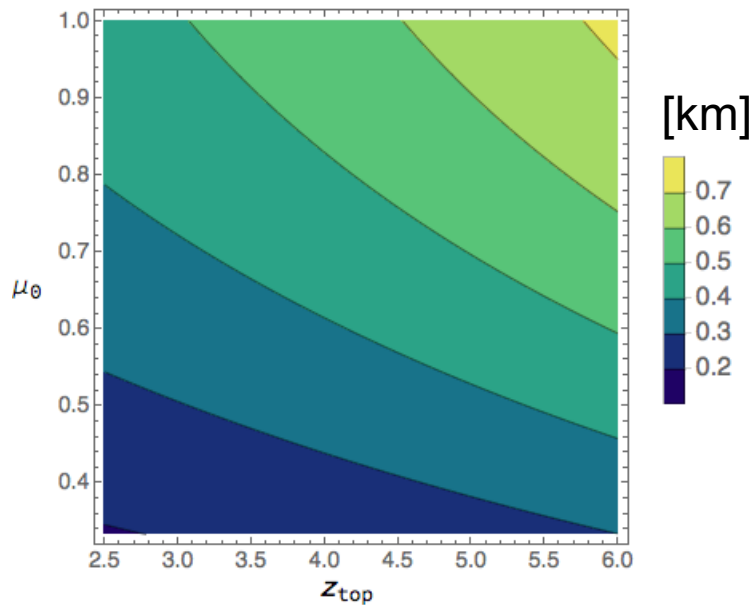


# Physical insights ...

random retrieval uncertainty resulting from sensor error, assuming 1.5% on DOAS ratio

$$\Delta z_{\text{top}}^{(\text{app})} \approx \frac{0.015 H_{\text{mol}}}{\tau_{\text{O}_2}^{(\Delta\lambda)}} \times \frac{e^{z_{\text{top}}/H_{\text{mol}}}}{2\mu_0 (\mu_0^{-2} + e^{H/H_{\text{mol}}} - 1)}$$

$$H = 2 \text{ km}$$



# Summary/outlook

- **Optimal estimation approach**
  - computational (exact) 1D RT model
  - Rodgers' [2000] statistical formalism
- **Physics-based approach**
  - analytical (but approximate) 1D RT model
  - physical insights about biases and sensitivities
- **Both approaches ...**
  - use derivatives of signals w.r.t. cloud properties (a.k.a. Jacobians)
  - account for sensor noise level
  - lead to the conclusion that, under most circumstances, only the cloud top height can be reliably retrieved