
Sounding the Troposphere by LEO-LEO Occultation: A Simulation Retrieval System and Performance Analysis Results

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Inheritance and Requirements

GPS Occultation

- All operational experience in level 2 retrieval gained from GPS occultation
- Unresolved problems: negative-refractivity bias, horizontal gradients, nonphysical retrievals
- Unresolvable issues: wet-dry ambiguity (though no need to resolve for NWP)

To ACE+

- Make a system which is a first draft retrieval system and performance analysis system
- Simulate multipath, diffraction, high-accuracy amplitude
- Simulate systematic and random noise: stability and power issues
- Retrieve physically-constrained geophysical parameters (T , p , p_w , ρ_{cloud} , r_{rain} , O_3 , u , gain)

Steps in Performance Analysis

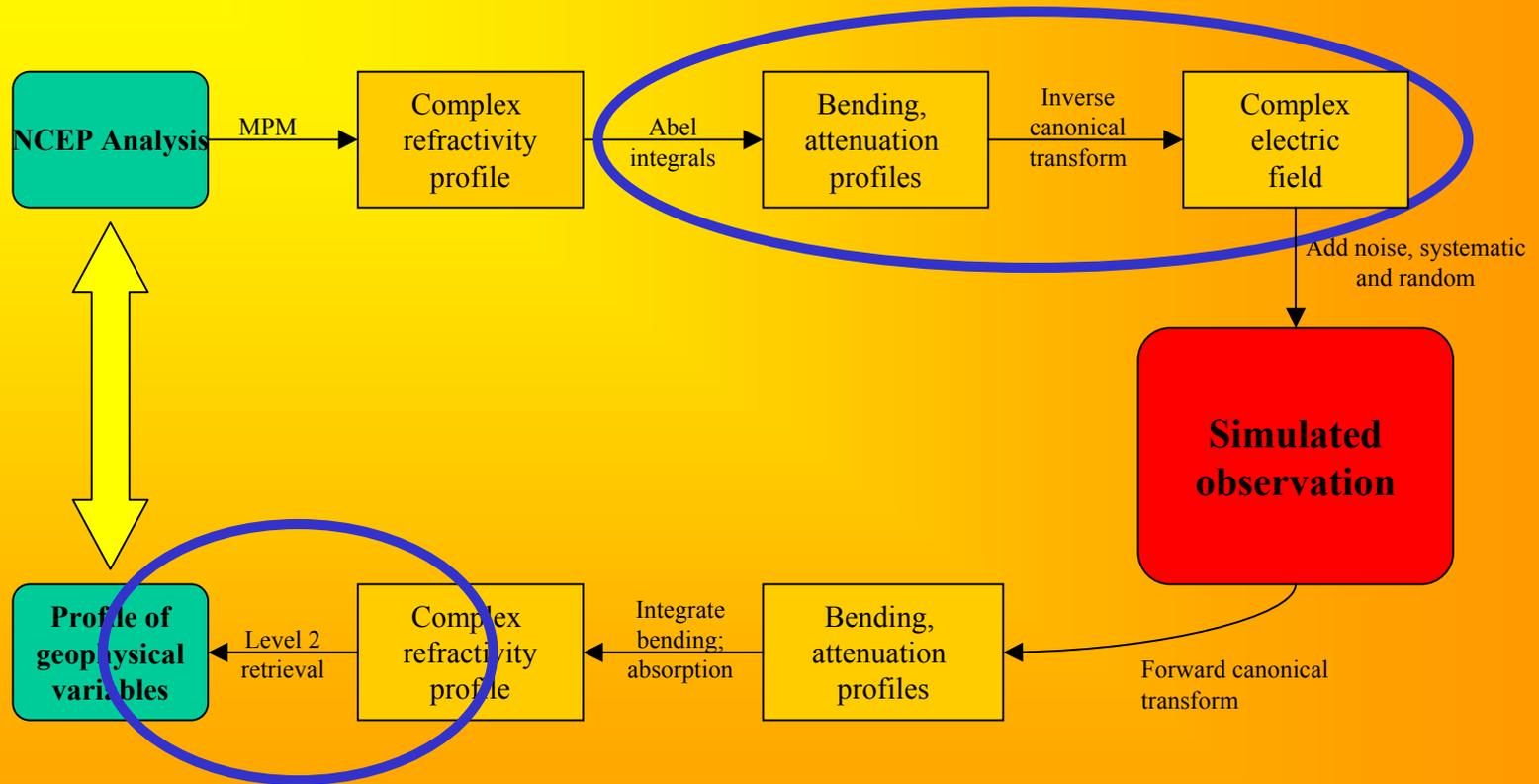
GPS Occultation

1. Atmospheric parameters (T , p , p_w) to real index of refraction (n)
2. Simulate bending using Abel transform / multiplane diffraction integrals
3. Geometry to simulate phase
4. Superimpose noise on s/c measurement of phase
5. Invert to real index of refraction using geometry / Egorov, then Abel transform
6. Obtain atmospheric parameters by assuming T or p_w or by variational assimilation

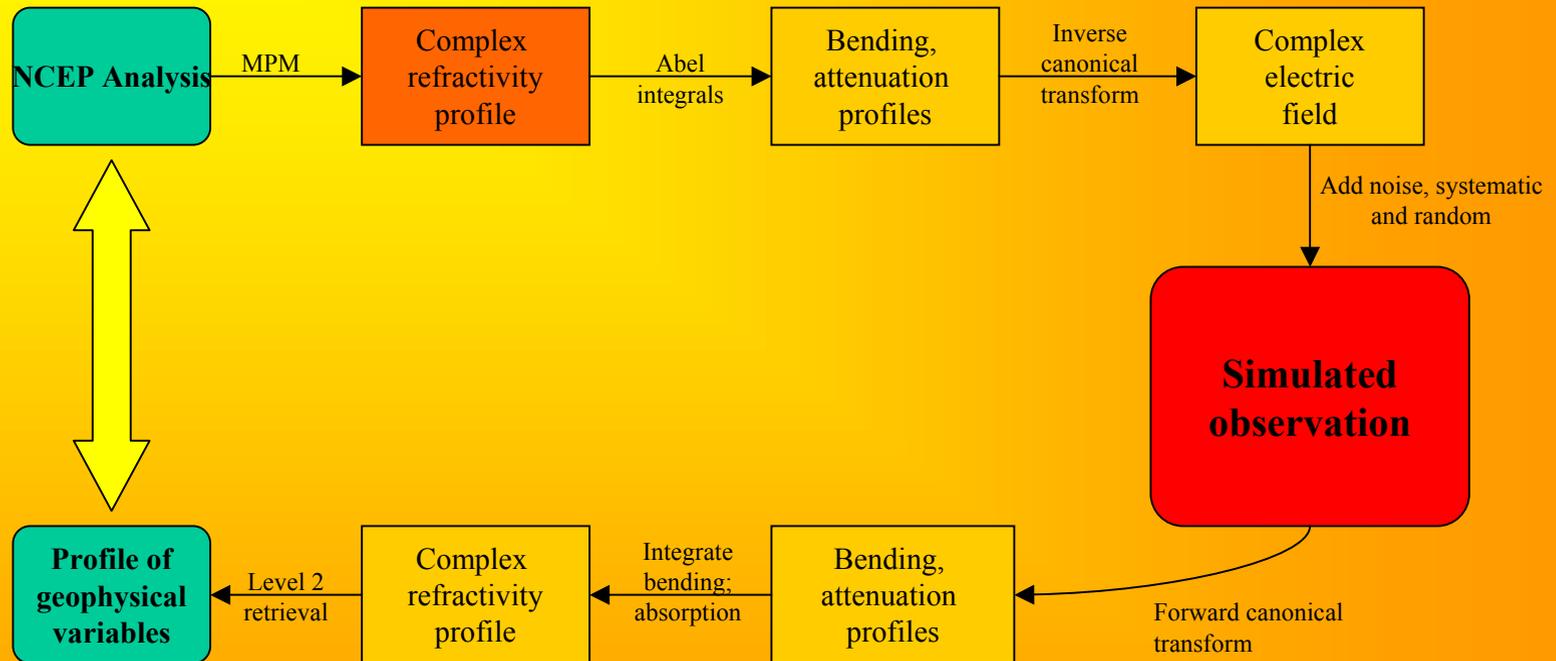
Intersatellite Link Occ'n

1. Atmospheric parameters (T , p , p_w , ρ_{cloud} , r_{rain} , O_3 , u) to complex n
2. Simulate bending and attenuation using Abel transforms
3. Simulate phase using inverse canonical transform
4. Superimpose noise on receiver measurements of correlation products (open-loop)
5. Invert to complex n profiles using forward canonical transform, Abel transforms
6. Obtain physically constrained atmospheric parameters using linearly constrained least squares

The simulation-retrieval system



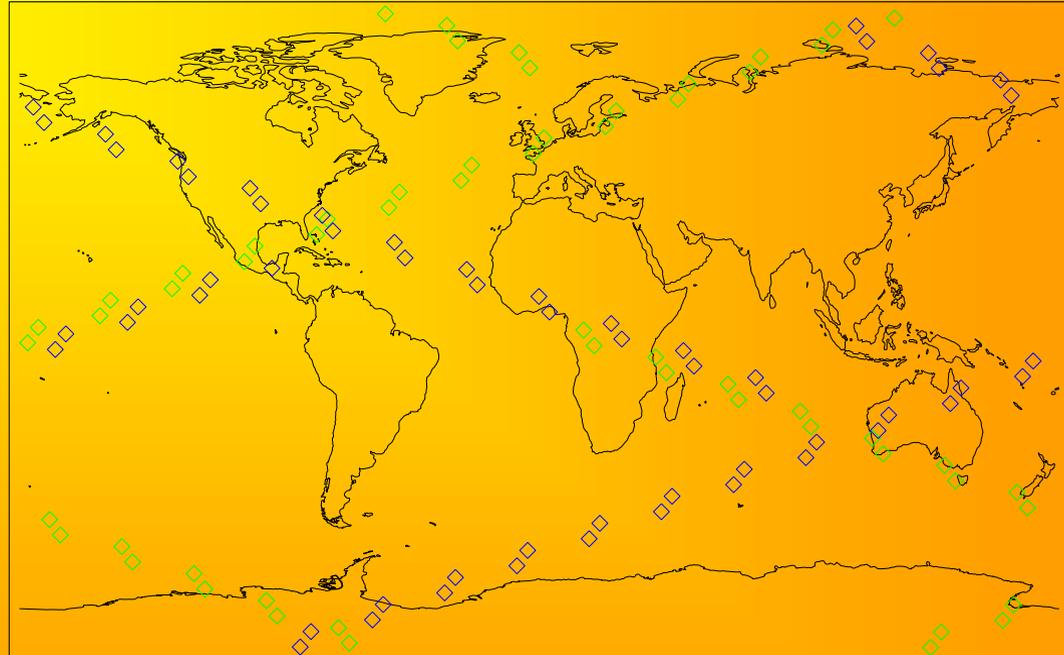
The simulation-retrieval system



SimDistribution (115 occ'ns)

Properties:

- Multiple transmitters
- Multiple receivers
- Mutual occ'ns
- Oblate Earth
- NetCDF output
- Circular orbits
- Variable inclination, altitude, ascending node, anomaly

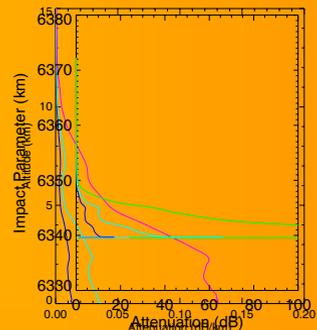
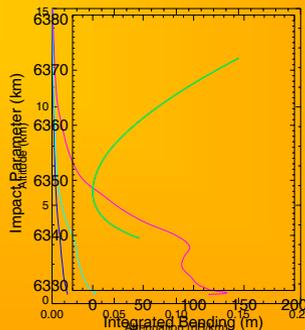
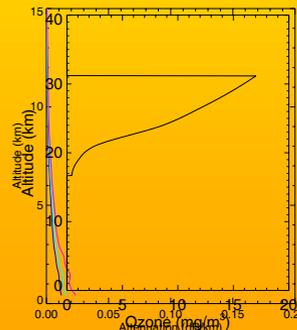
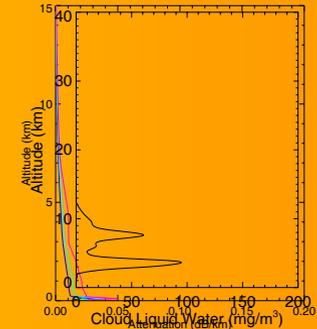
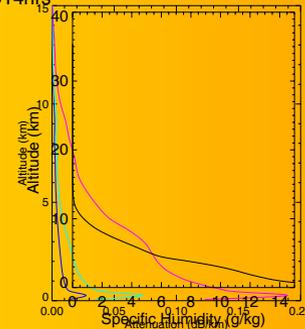
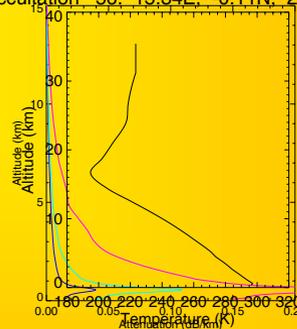


SimNCEP Atmosphere

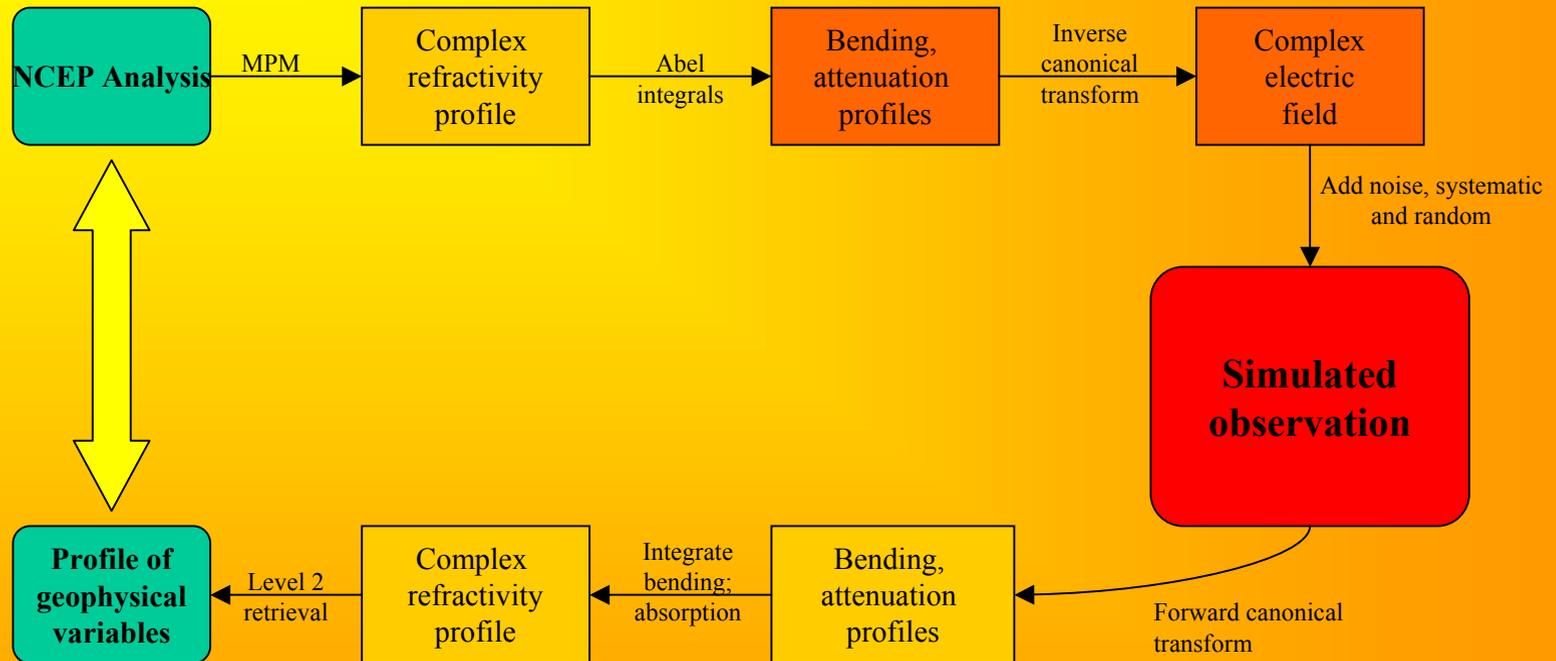
Properties

- Uses NCEP analysis starting at any time
- Millimeter-wave Propagation Model
- User-selected frequencies
- Accounts for clouds, rain (future: ozone, wind)
- NetCDF input/output

Occultation 56: 15.34E, -0.11N, 22.914hrs



The simulation-retrieval system



The Inverse Canonical Transform

Methods of simulating observations

1. Raytracing (1-D, 2-D, 3-D)
 - Ideal for computing phase
 - Difficult to simulate amplitude
 - Handles multipath, but not guaranteed to find all rays
 - Cannot handle diffraction
 - 2-D and 3-D version handle spherically nonsymmetric structures
2. Multiplane (2-D)
 - Computes phase, amplitude very precisely
 - Handles multipath, find all rays
 - Handles diffraction completely
 - Handles along-track asymmetric in atmosphere
 - Very expensive at high frequency

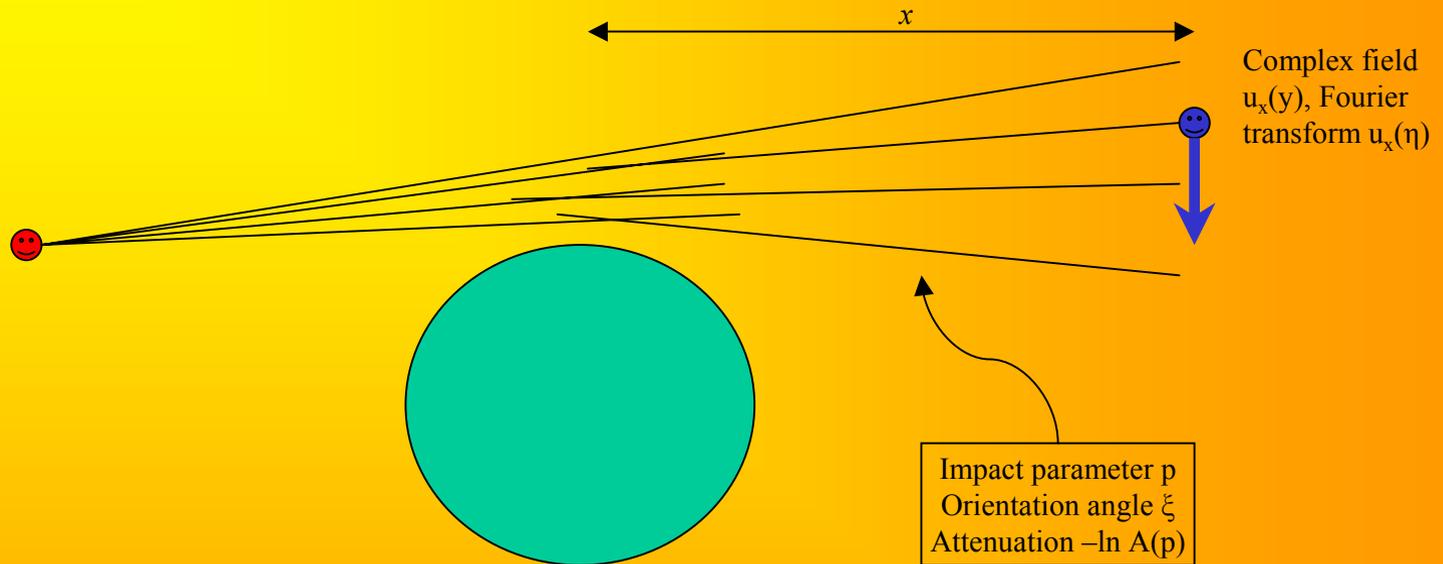
Forward canonical transform

- Given phase and amplitude, compute bending angle and atmospheric attenuation
- 1-Dimensional
- Accounts for multipath and diffraction
- Does not handle spherically nonsymmetric structures
- Computationally inexpensive, two FFTs
- The canonical transform has an analytic inverse which produces phase and amplitude from atmospheric bending and attenuation

(Gorbunov, 2000)



The Canonical Transform



$$\Phi u(p) = A(p) \exp \left[ik \int^p \xi(p') dp' \right]$$

The Inverse Canonical Transform, cont'd

The forward canonical transform (from Gorbunov) transforms from y, k_y coordinates to p, ξ coordinates:

$$\Phi u_x(p) = \frac{k}{2\pi} \int d\eta (1-\eta^2)^{1/4} \exp\left[ik\left(p \arcsin \eta - x\sqrt{1-\eta^2}\right)\right] \tilde{u}_x(\eta)$$

The inverse canonical transform transforms from p, ξ coordinates to y, k_y :

$$\tilde{u}_x(\eta) = (1-\eta^2)^{-3/4} e^{ikx\sqrt{1-\eta^2}} \int \Phi u_x(p) \exp[-ikp \arcsin \eta] dp$$

Abel Transform Integrals

$$\Phi u(p, \nu) = A(p, \nu) \exp \left[ik \int^p \xi(p') dp' \right]$$

$$\Phi u(p, \nu) = \exp \left\{ -2k \int_{r_{\min}}^{\infty} \frac{n_i(\nu) n_r r dr}{\sqrt{(n_r r)^2 - p^2}} - 2ik \int_{r_{\min}}^{\infty} \sqrt{(n_r r)^2 - p^2} \frac{d \ln n_r}{dr} dr \right\}$$



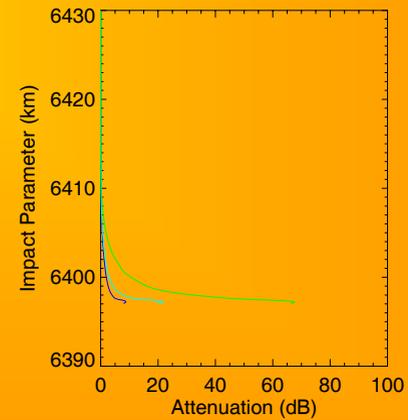
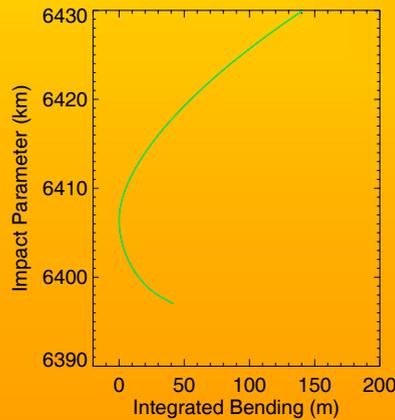
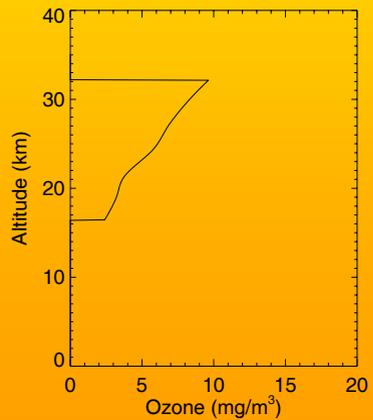
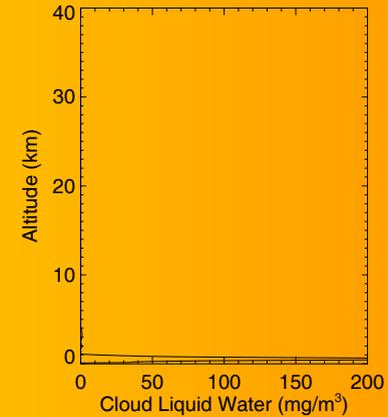
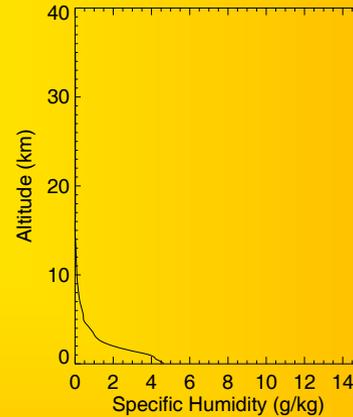
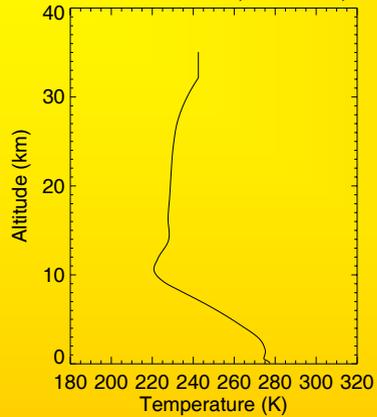
**Forward model
for attenuation!**
(Need corrections
for some geometric
effects)



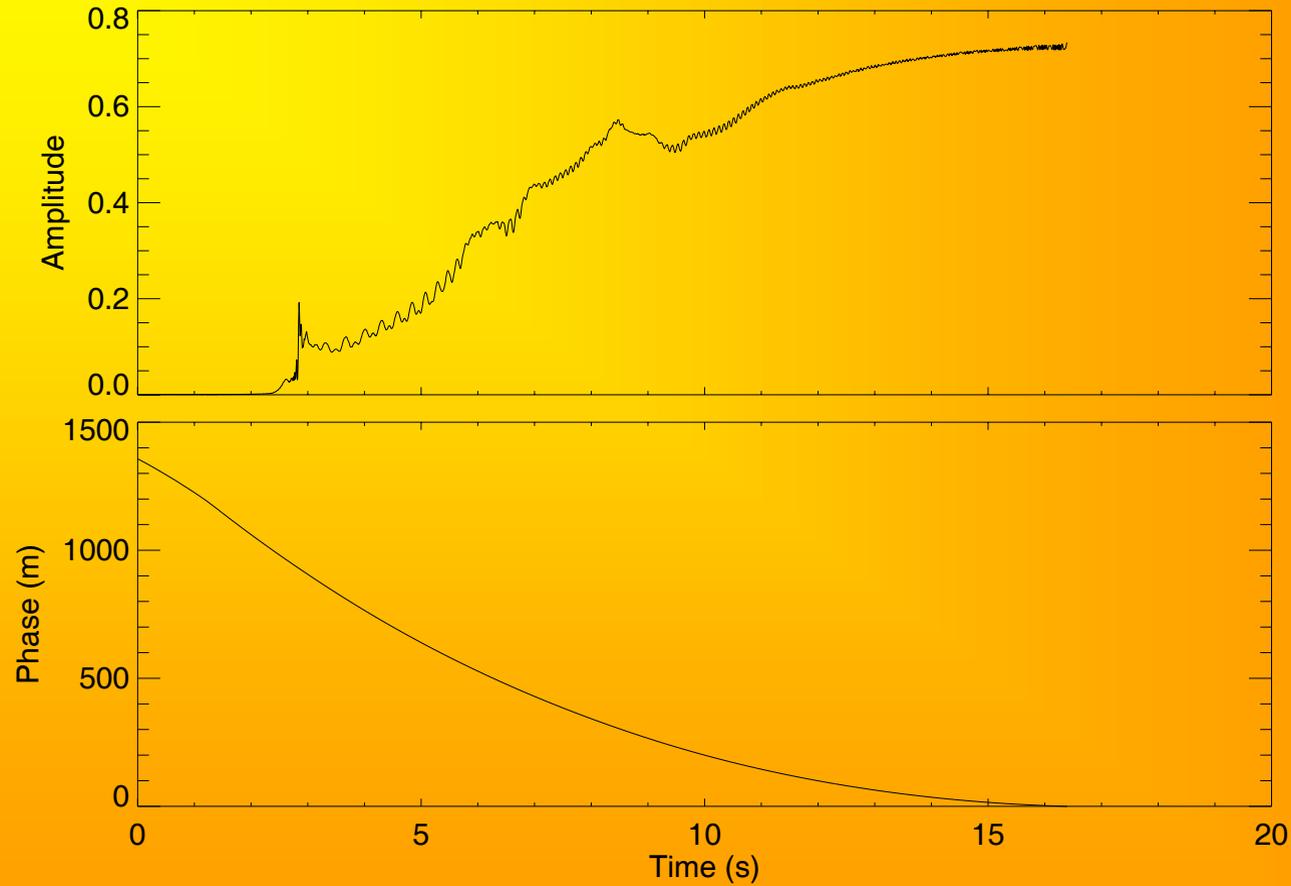
**Forward model
for bending!**
(Need correction for
incident ray
orientation)

Example simulation

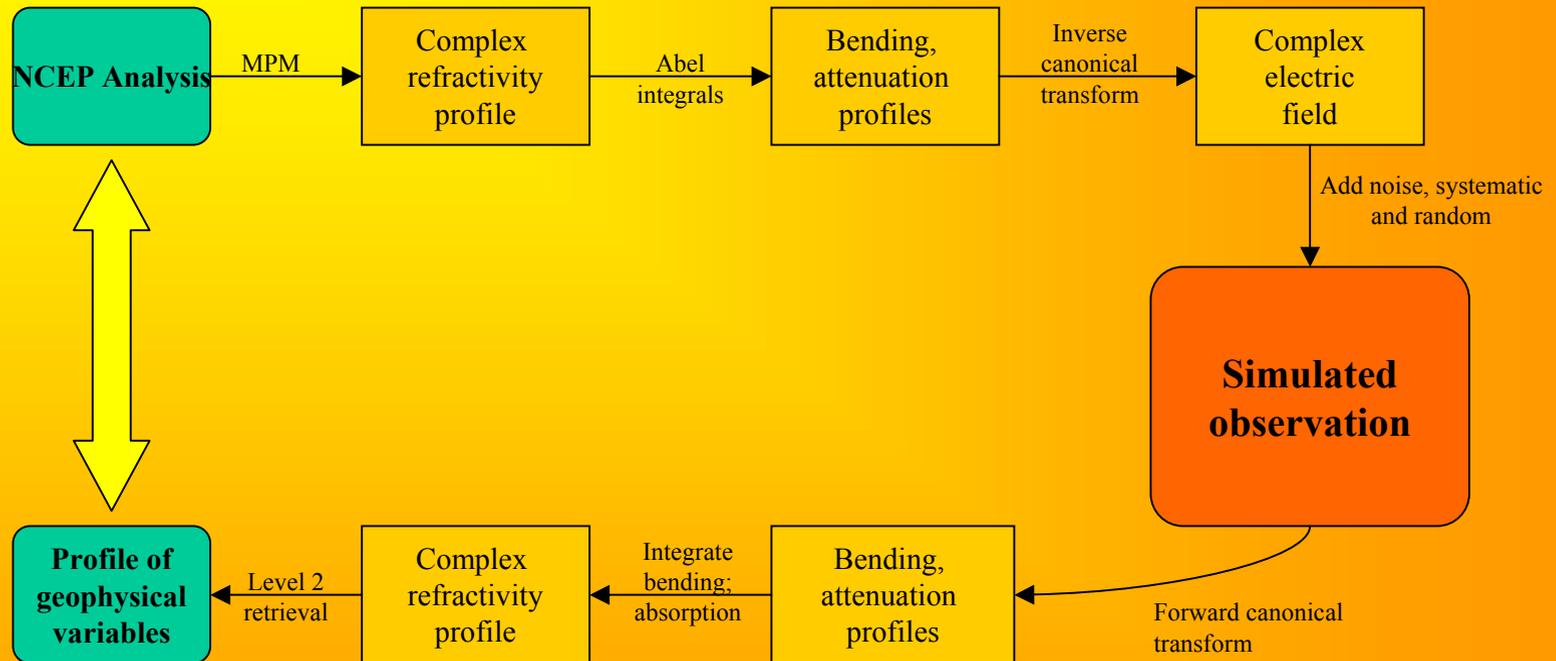
Occultation 1: 356.73E, 73.30N, 0.218hrs



Example simulation, cont'd



The simulation-retrieval system



Adding Error

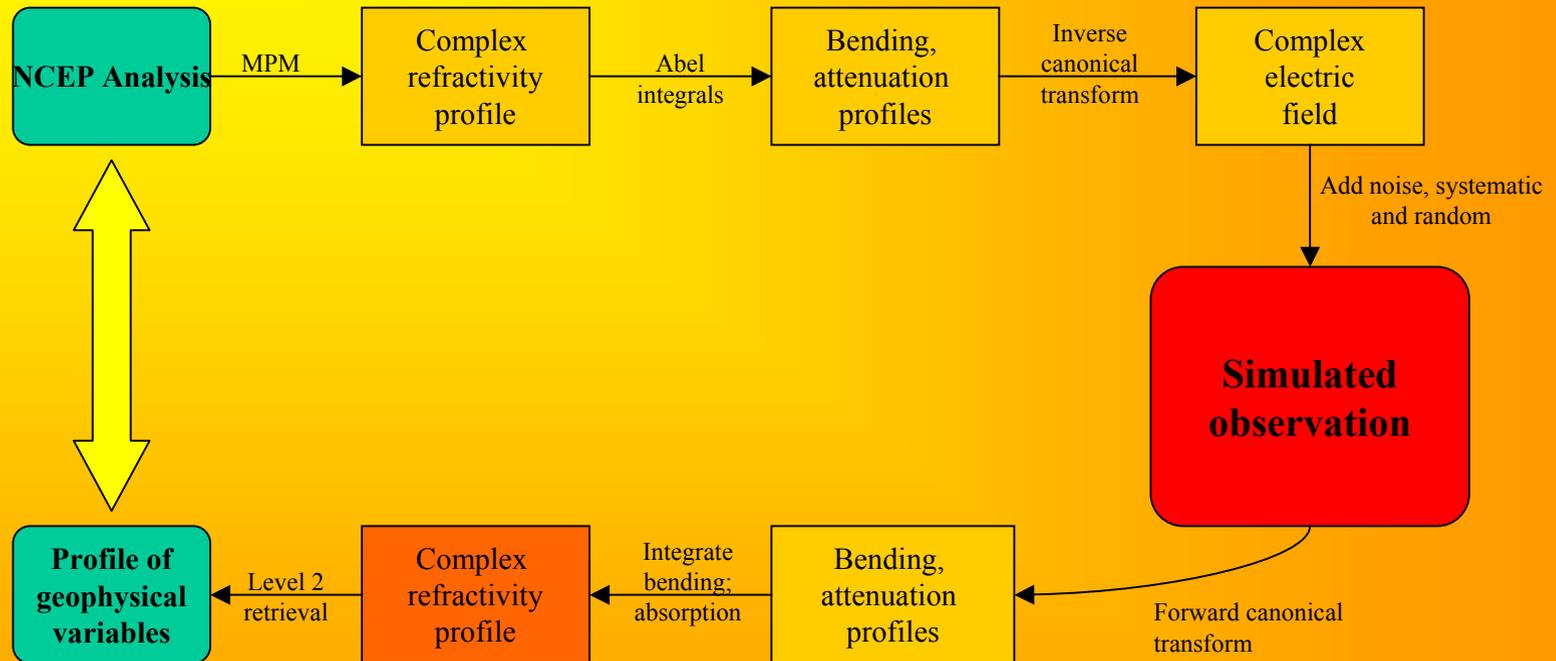
Sources of error:

- Gain drift dg/dt in dB/s
- Signal-to-noise ratio, $\sigma = (v_{s/c}/dy)^{1/2} / \text{SNR}$

$$u_{obs}(y) = u_{true}(y) \cdot 10^{\dot{g}t/10} + \sigma(n_1 + in_2)$$



The simulation-retrieval system



Abelian inversions

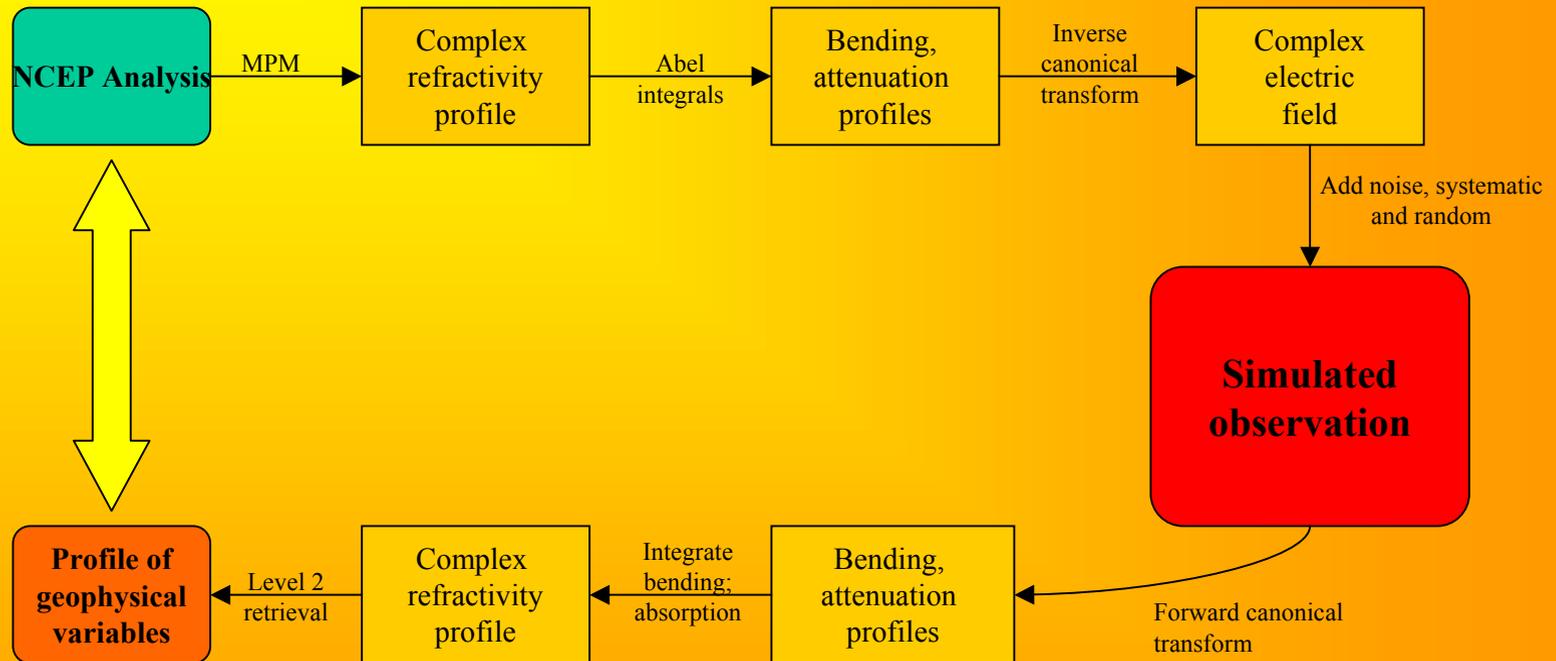
Inversion for real part of refractivity

$$\ln n_r(p) = \frac{1}{\pi} \int_p^\infty \frac{\varepsilon(p') dp'}{\sqrt{p'^2 - p^2}}$$

Inversion for imaginary part of refractivity

$$n_i(p) = \frac{1}{\pi k p} \frac{dp}{dr} \frac{d}{dp} \int_p^\infty \frac{p' \ln(\text{amp}) dp'}{\sqrt{p'^2 - p^2}}$$

The simulation-retrieval system



Retrieval of geophysical variables

Minimize χ^2 with respect to data and constraints:

$$\chi^2 = (\mathbf{d} - \mathbf{J}_{MPM} \delta\mathbf{x})^T \mathbf{O}^{-1} (\mathbf{d} - \mathbf{J}_{MPM} \delta\mathbf{x}) + \lambda |\delta\mathbf{H} + \mathbf{J}_H \delta\mathbf{x}|^2$$

Constraints, such as hydrostatic equilibrium, nonnegative water vapour, etc., must satisfy $\mathbf{H}(\mathbf{x})=0$.

Solution: Factorize

$$(\mathbf{J}_H^T \mathbf{J}_H) = \mathbf{e}_H \boldsymbol{\lambda} \mathbf{e}_H^T$$

Remove the constraint space described by the eigenvectors \mathbf{e}_H from the retrieval space ($\mathbf{J}\mathbf{O}^{-1}\mathbf{J}^T$). Then retrieval can be done for each level, starting from the top of the atmosphere. Same as **linearly constrained least squares**: Minimize

$$\chi^2 = (\mathbf{d} - \mathbf{J}_{MPM} \delta\mathbf{x})^T \mathbf{O}^{-1} (\mathbf{d} - \mathbf{J}_{MPM} \delta\mathbf{x}) \quad \text{subject to} \quad \delta\mathbf{x} \cdot \nabla\mathbf{H} = 0$$

- ✦ Topmost layer: 0DVAR using a climatology of pressure and temperature.
- ✦ Subsequent layers: linearly constrained least squares, hydrostatic equilibrium mandatory.
- ✦ Added generality: make it possible to retrieve a subset of geophysical variables; use up to 10 frequencies, but subset by frequency and real/imaginary part for each level.

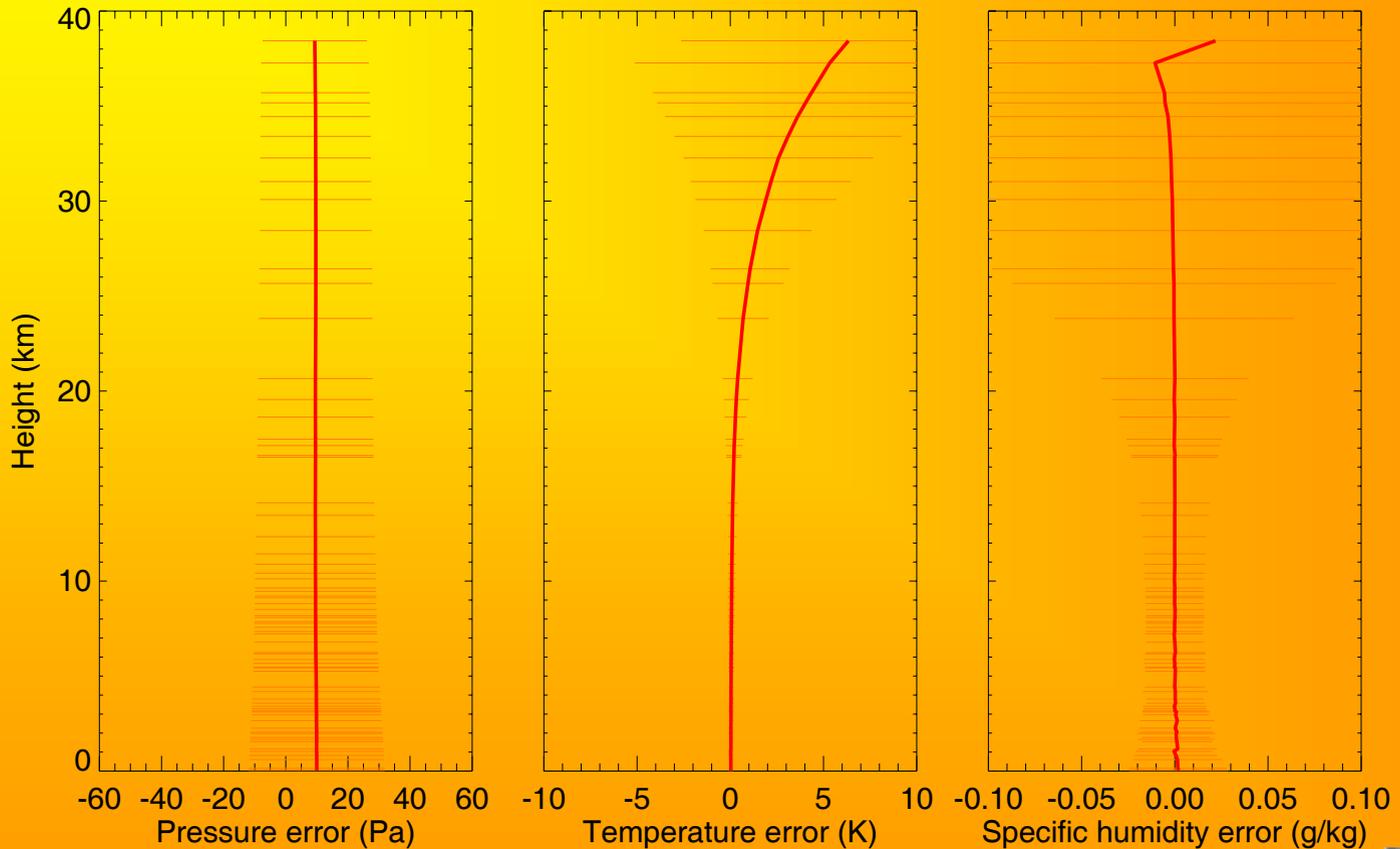
Boundary layer χ^2

Bending and absorption

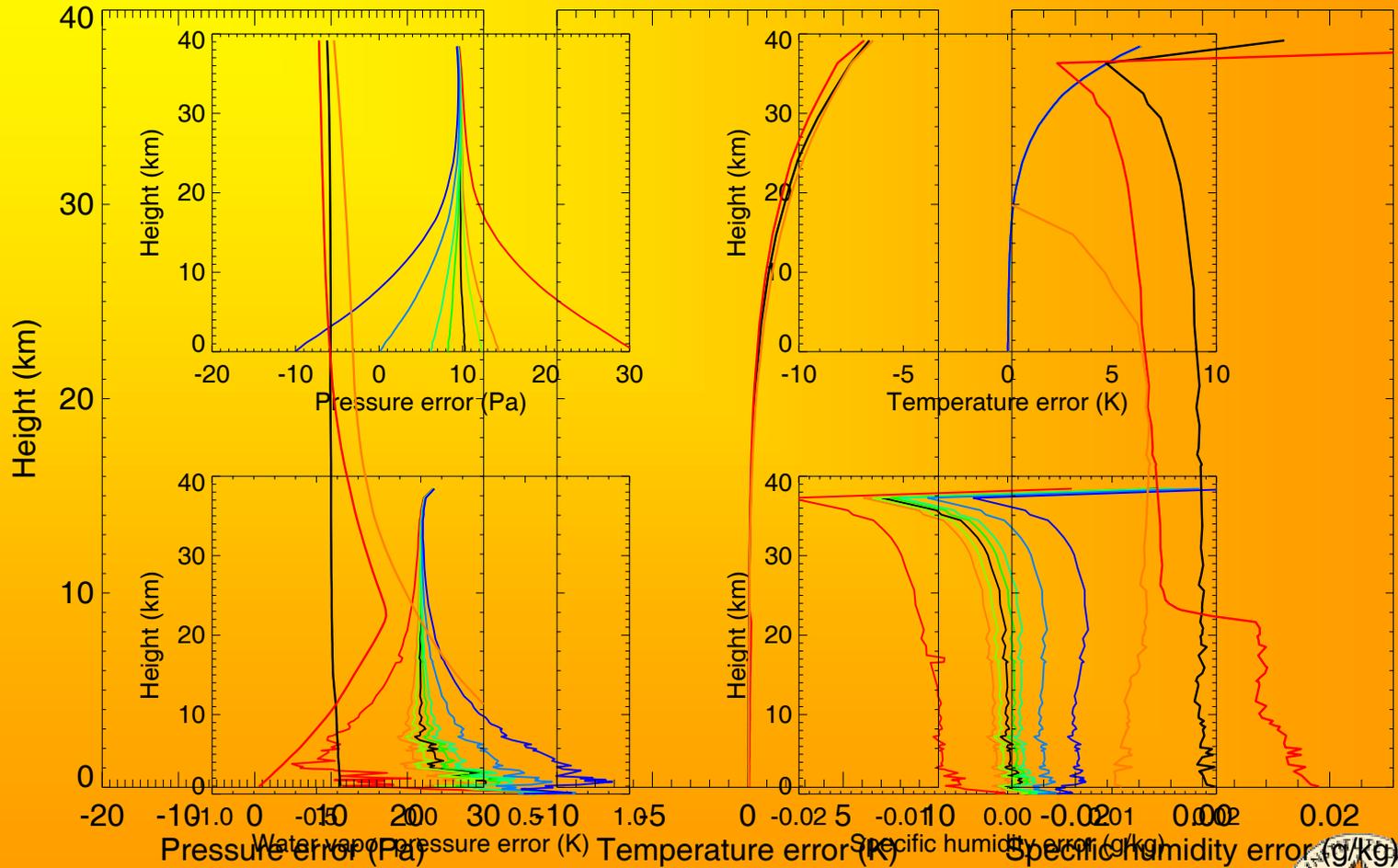
Absorption only



Example level 2 retrieval w/ errors



Example (unrelated) level 2 retrieval



Summary/Work-to-be-done

- Complete forward and inverse canonical transform
- Include line parameterizations for ozone
- Series of runs at 10.3, 17.2, 22.6 GHz
- Series of runs with a “calibration tone” (3-5 GHz)
- Try different gain drifts (0.01-0.10 dB/30s) with and without calibration tone to determine how much the calibration tone helps
- Different SNRs (100-1000) with different sets of frequencies to determine sensitivity in the presence of clouds

