How to average measurements from ground-based radiometers

NDACC Microwave Workshop 2012

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- 2 Time series inversion -a simulated case
- 3 Retrieval matrices
- 4 Results from OSO



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How long should we average spectra?

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How long should we average spectra?

- How long should we average spectra?
- A day?
- A week?
- This affects the retrieval in a nonlinear way

Averaging spectra is not the same as averaging profiles!



Expanding the retrievals into the temporal dimension

• Retrievals perfomed on single spectrum

 $\mathbf{y} = \mathbf{K}\mathbf{x}$



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 But we can do several spectra simultaniously

$$\left(\begin{array}{c} \mathbf{y}_1\\ \mathbf{y}_2\\ \vdots\\ \vdots\\ \mathbf{y}_N \end{array}\right) = \left(\begin{array}{ccc} \mathbf{K}^1 & \mathbf{0} & \mathbf{0}\\ \mathbf{0} & \ddots & \mathbf{0}\\ \mathbf{0} & \mathbf{0} & \mathbf{K}^N \end{array}\right) \left(\begin{array}{c} \mathbf{x}_1\\ \mathbf{x}_2\\ \vdots\\ \vdots\\ \mathbf{x}_N \end{array}\right)$$

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A simulation of an abrupt change in the atmosphere

- To test the properties of the retrieval a simulation i run.
- Atmosphere is constant equal to a priori until the 120th hour, when it is doubled.

$$\hat{\mathbf{x}} = \mathbf{x}_{\mathbf{a}} + (\mathbf{K}^{T} \mathbf{S}_{\epsilon}^{-1} \mathbf{K} + \mathbf{S}_{\mathbf{a}}^{-1})^{-1} \mathbf{K}^{T} \mathbf{S}_{\epsilon}^{-1} (\mathbf{y} - \mathbf{K} \mathbf{x}_{\mathbf{a}})$$

Instrument

 $\nu_0{=}22$ GHz, Bandwidth = 1 GHz, $\Delta\nu$ = 25KHz, 83 Channels, Noise T = 100 K, Opacity 0.5, Integration time 3 hours, Calibration time 50%



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1D inversion

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48 h average of spectra



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Time series inversion

Specifying the a priori uncertainty

• We need to specify the 2d-a priori covariance matrix.

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Specifying the a priori uncertainty



Element in Sa

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Element in Sa

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Element in Sa

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- Vertical elements
- Temporal elements



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Specifying the a priori uncertainty



Temporal elements

Hour

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Specifying the a priori uncertainty



It is the temporal correlation that allows us to improve the retrievals!

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Averaging kernels

• The averaging kernels become 2D.

$$\mathbf{A} = \begin{pmatrix} \mathbf{A}^{1,1} & \mathbf{A}^{1,2} & \cdots & \mathbf{A}^{1,N} \\ \mathbf{A}^{2,1} & \mathbf{A}^{2,2} & \cdots & \mathbf{A}^{2,N} \\ \vdots & \vdots & \ddots & \vdots \\ \mathbf{A}^{N,1} & \mathbf{A}^{N,2} & \cdots & \mathbf{A}^{N,N} \end{pmatrix}$$



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• The temporal averaging kernels describe the averaging at each altitude.



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 The temporal averaging kernels describe the averaging at each altitude.



Retrievals from OSO



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Retrievals from OSO



76 km



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Temporal Averaging kernels from OSO



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Temporal Averaging kernels from OSO



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Summary and conclusions

- Retrievals were expanded into the temporal dimension.
- Allows for different temporal resolutions at different altitudes.
- Takes into account noise in neighbouring measurements

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Ideas

The method also allows for seamless optimal interpolation for filling data gaps or regridding the data.

Can be used to retrieve instrumental data like baselines.

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