

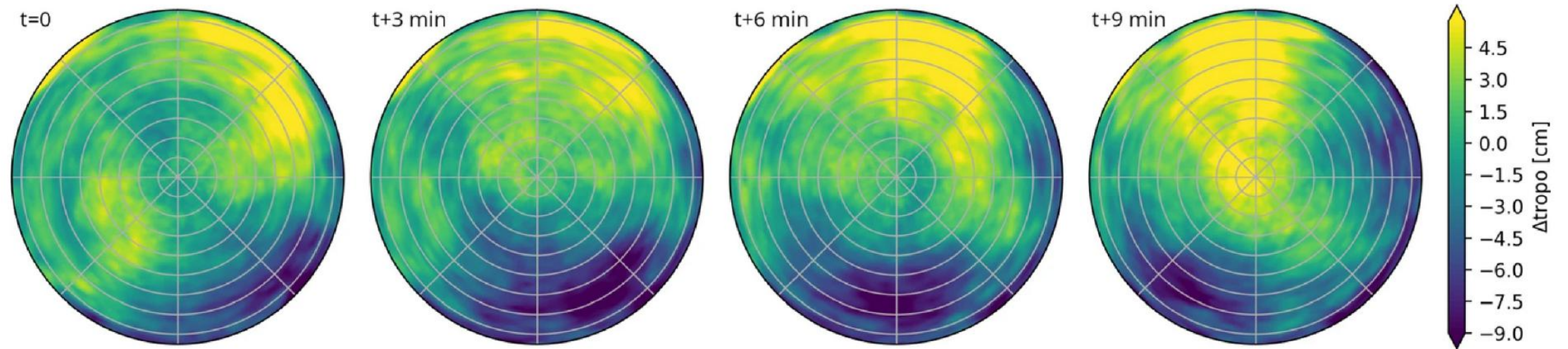
# Correlations in Atmospheric Parameter Estimation

**Benedikt Soja**

6 March 2026, Unified Analysis Workshop



# Correlation of tropospheric effects



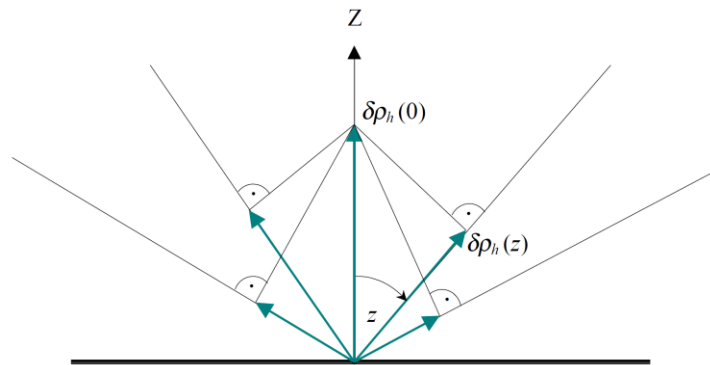
Schartner, 2025

# Problem overview

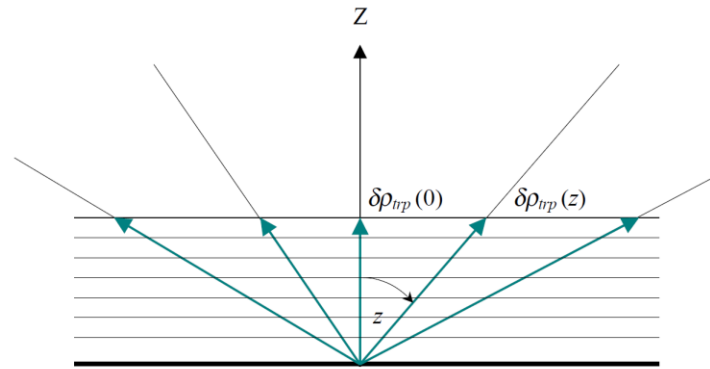
- **Current practice:** most Least Squares Adjustments (LSA) use **diagonal covariance matrices**
  - Assumption: observations are independent
- **Reality:** atmosphere is governed by **Kolmogorov turbulence**
  - Temporal correlations: short-term fluctuations are linked
  - Spatial correlations: co-located stations share the same troposphere
- **Consequence:**
  - Optimistic uncertainties
  - Sub-par tropospheric estimates → errors in station heights

# Correlation of station height, atmosphere & clock parameters

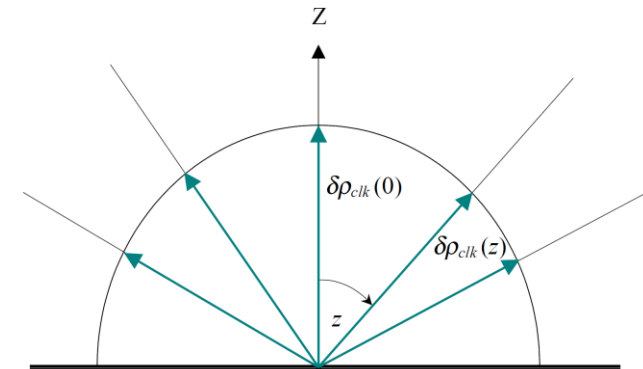
- Partial derivatives



$$\delta\rho_h(z) = \cos(z) \cdot \delta\rho_h(0) \quad ; \quad \delta\rho_h(0) = \delta h$$



$$\delta\rho_{vp}(z) = \frac{1}{\cos(z)} \cdot \delta\rho_{vp}(0)$$



$$\delta\rho_{clk}(z) = \delta\rho_{clk}(0) = c \cdot \delta t_R$$

- Errors in atmospheric effects propagate to other geodetic parameters

# Atmospheric turbulence

- Tropospheric delays are not random noise but rather **power-law noise** in space and time  
→ correlations of observations
- Structure function dependent on distance  $r$
- Typical assumption: frozen flow with a certain wind vector
- **Requires appropriate stochastic modeling**

$$D_n(r) = \langle [n(x) - n(x + r)]^2 \rangle = C_n^2 r^{2/3}$$

*Radio Science*, Volume 22, Number 2, Pages 251–265, March–April 1987

**The effect of the dynamic wet troposphere on radio interferometric measurements**

*R. N. Treuhaft and G. E. Lanyi*

*Jet Propulsion Laboratory, California Institute of Technology, Pasadena*

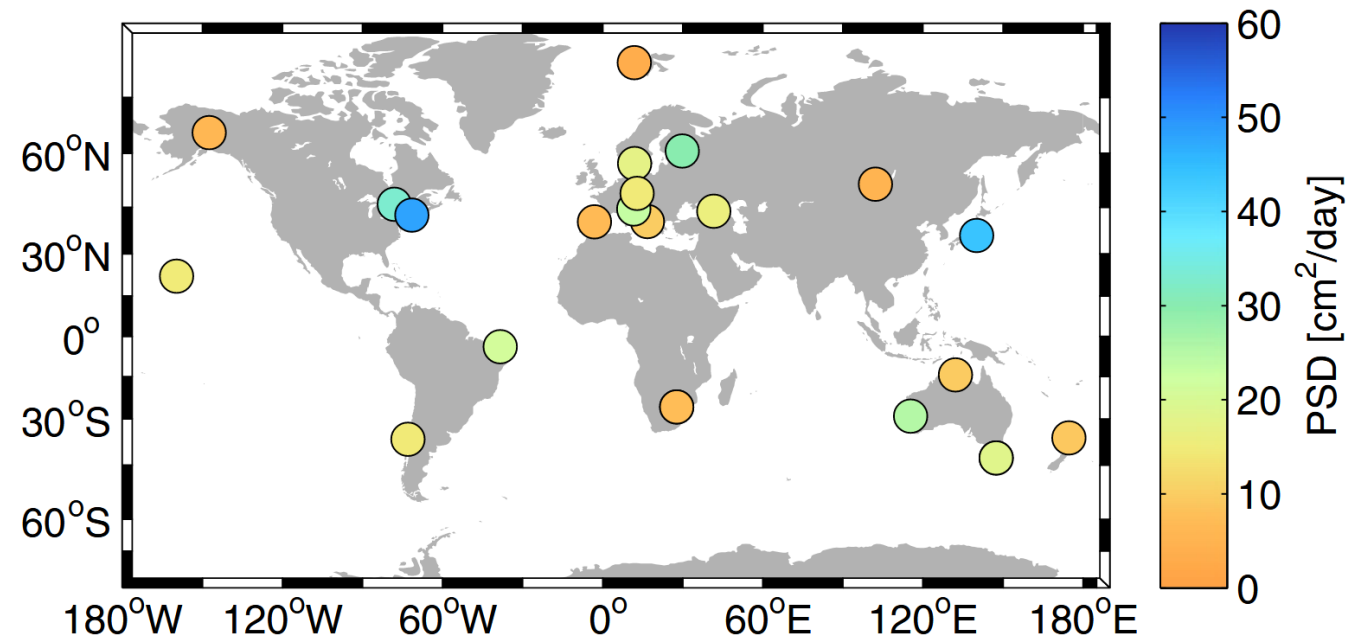
(Received June 24, 1986; revised September 23, 1986; accepted October 7, 1986.)

# Considering correlations in geodetic parameter estimation

- Ideally: correlations as off-diagonal elements in the weight matrix
- Other concepts:
  - Stochastic modeling in the parameter domain
    - Kalman filter with random walk
    - LSA with piece-wise linear functions and constraints
  - Combination of tropospheric parameters of co-located stations

# Station-dependent stochastic parameters

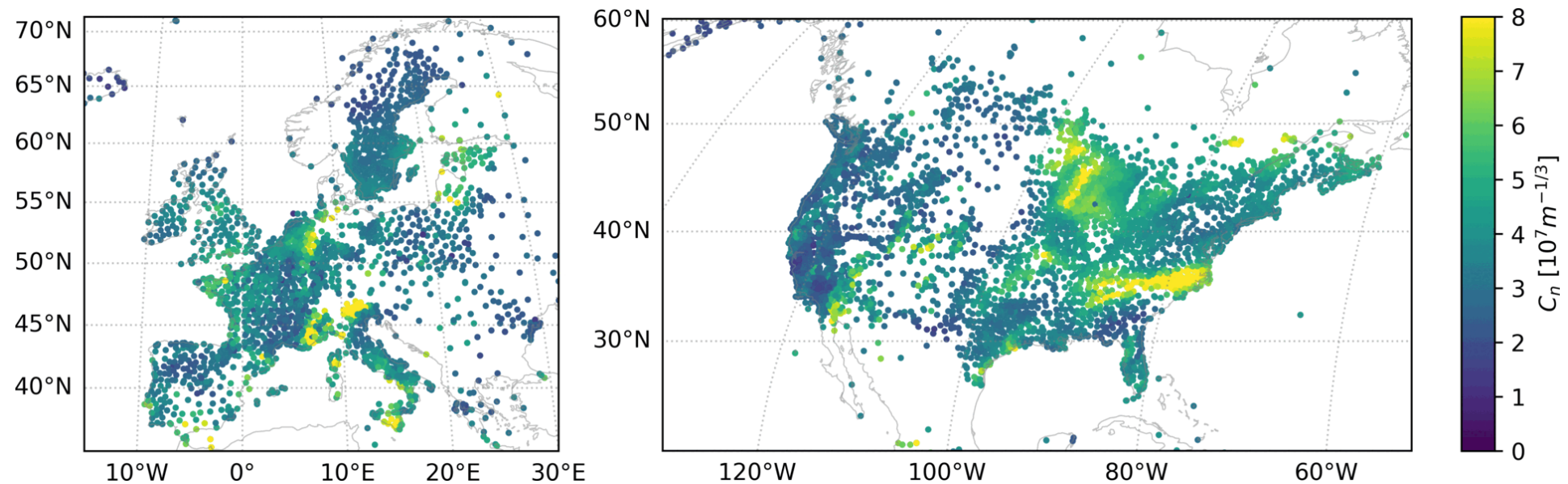
- Stochastic parameters are often assumed to be identical for all stations
- Atmospheric turbulence is actually very inhomogeneous
  - Summer vs. winter
  - Tropical vs. arid regions



Soja et al., 2015

# Modeling turbulence parameters

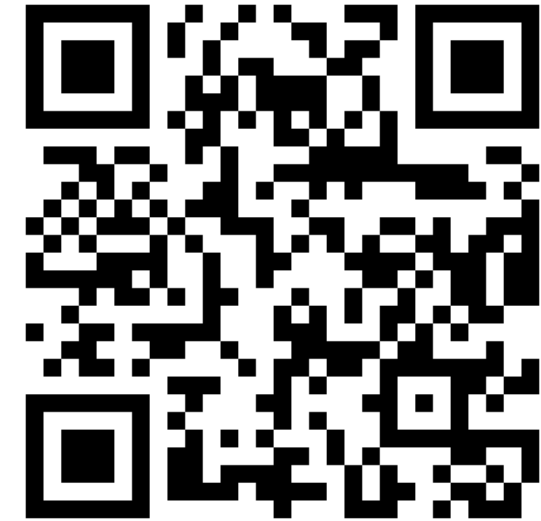
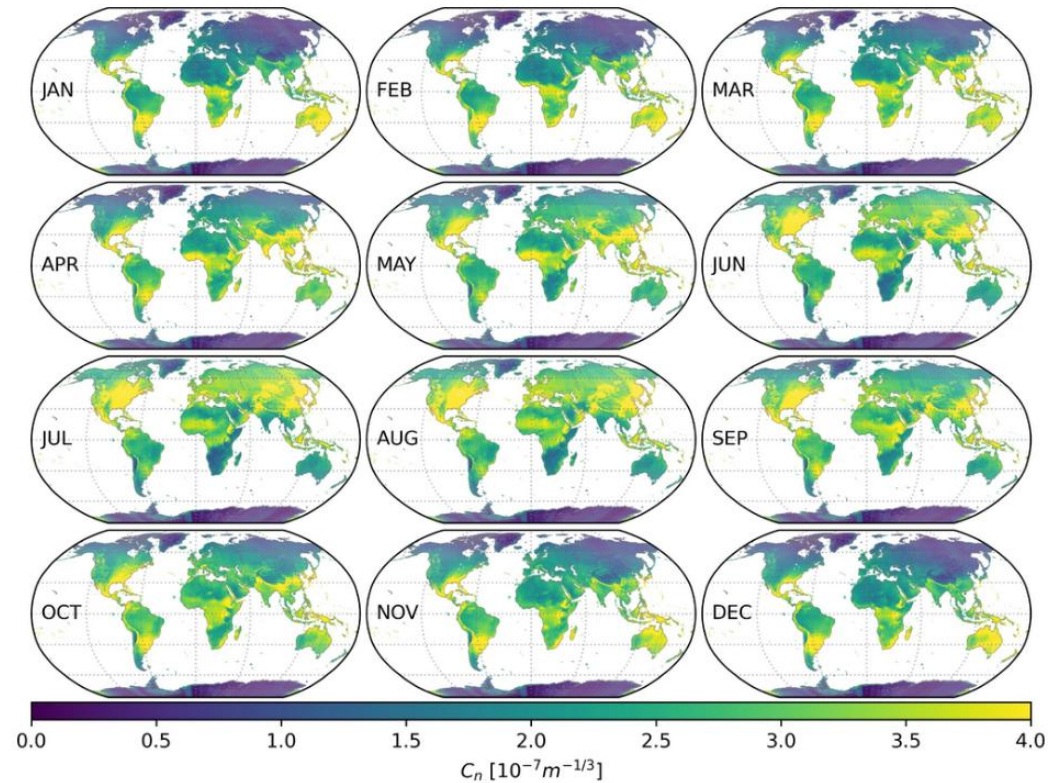
- Machine learning to model  $C_n$  values using 18k GNSS stations + numerical weather model



Schartner, 2025

# Modeling turbulence parameters

- Full model depends on lat, lon, time
- Easy access: monthly averaged grids



<https://gpc.ethz.ch/Troposphere/>

# Discussion

- Short presentations
  - Hana Krasna
  - Minghui Xu
- Discussion points
  - How are correlations due to the atmosphere handled by the different ACs or services?
  - Impact on geodetic products like ITRF and EOP
  - Should we mention atmospheric turbulence in the IERS Conventions?
  - Are ACs using tropospheric ties at co-located stations?
  - Interest in a multi-technique combined tropospheric product?

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**Thanks for your attention!**

# References

- Schartner, M. Deriving a global troposphere model for space geodetic simulations based on an ML ensemble featuring uncertainty quantification. *J Geod* **99**, 72 (2025). <https://doi.org/10.1007/s00190-025-01996-w>
- Soja, B., Nilsson, T., Karbon, M., Zus, F., Dick, G., Deng, Z., Wickert, J., Heinkelmann, R., & Schuh, H. (2015). Tropospheric delay determination by Kalman filtering VLBI data. *Earth, Planets and Space*, 67(1), 144. <https://doi.org/10.1186/s40623-015-0293-0>
- Treuhaft, R. N., & Lanyi, G. E. (1987). The effect of the dynamic wet troposphere on radio interferometric measurements. *Radio Science*, 22(2), 251–265. <https://doi.org/10.1029/RS022i002p00251>