Long-term changes of tropospheric NO₂ over megacities derived from multiple satellite instruments

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– more than 50% of human population lives in cities

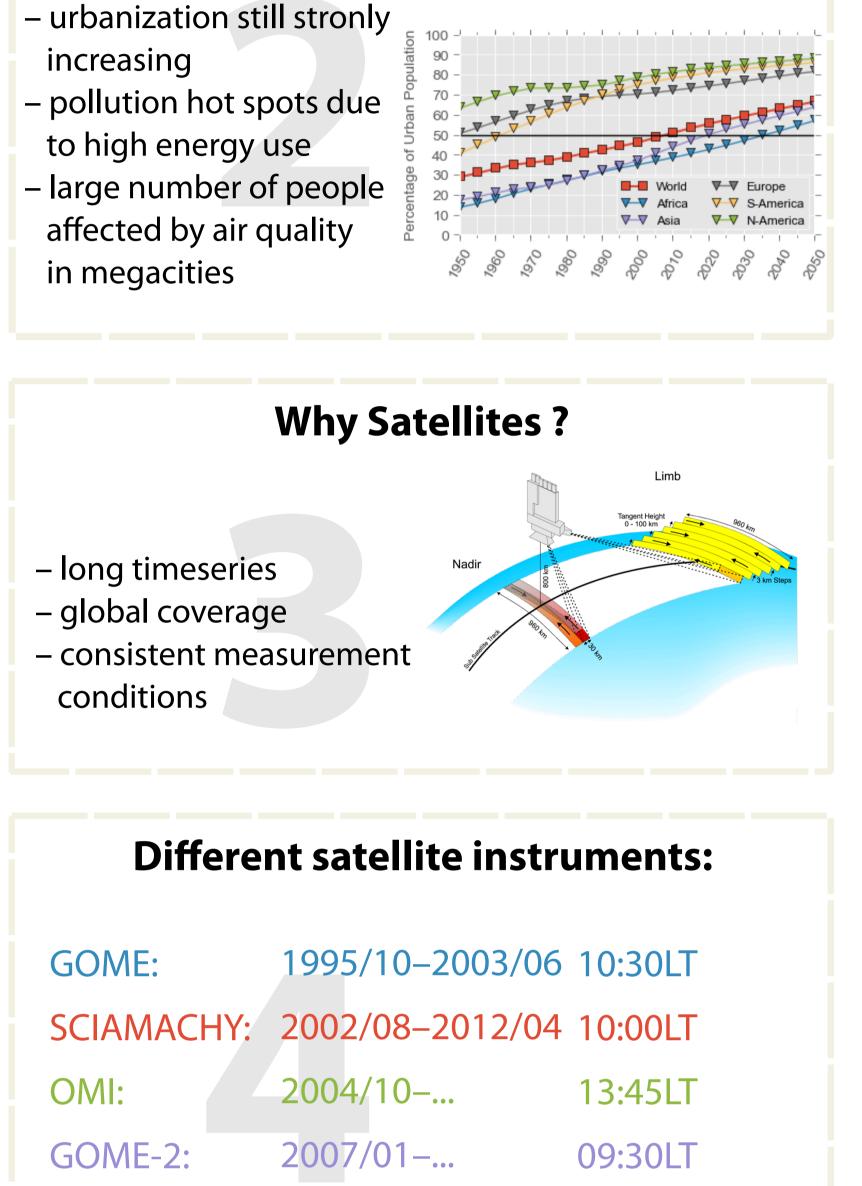
The data:

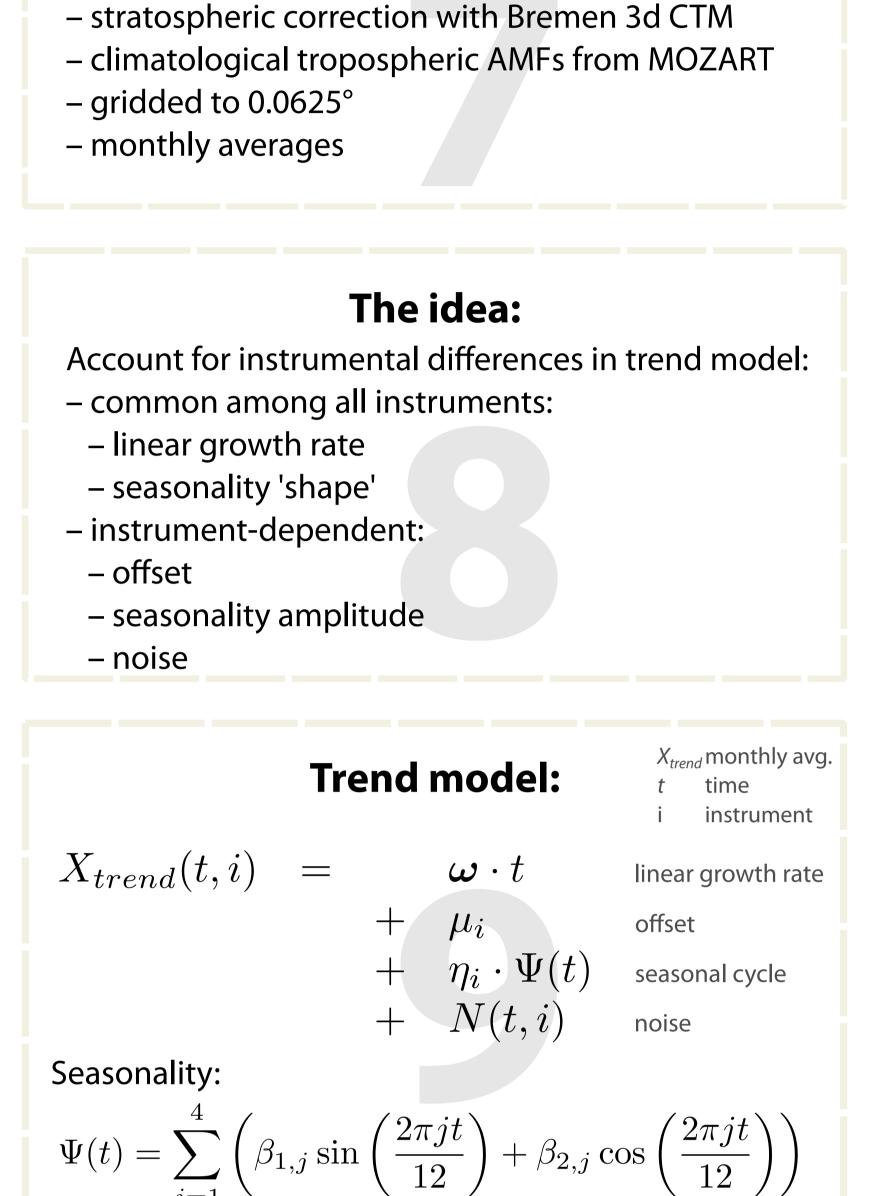
– VCD_{trop} NO₂ from IUP/Uni-HB scientific retrieval v4

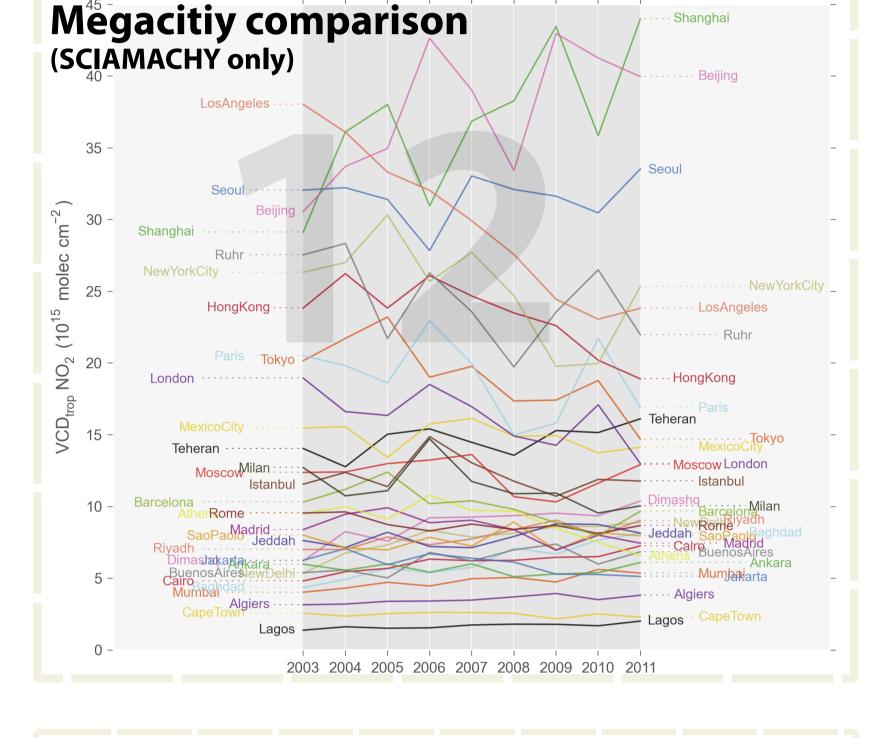
– strong decreases over U.S., Europe, Japan strong increases over E-China and Middle East

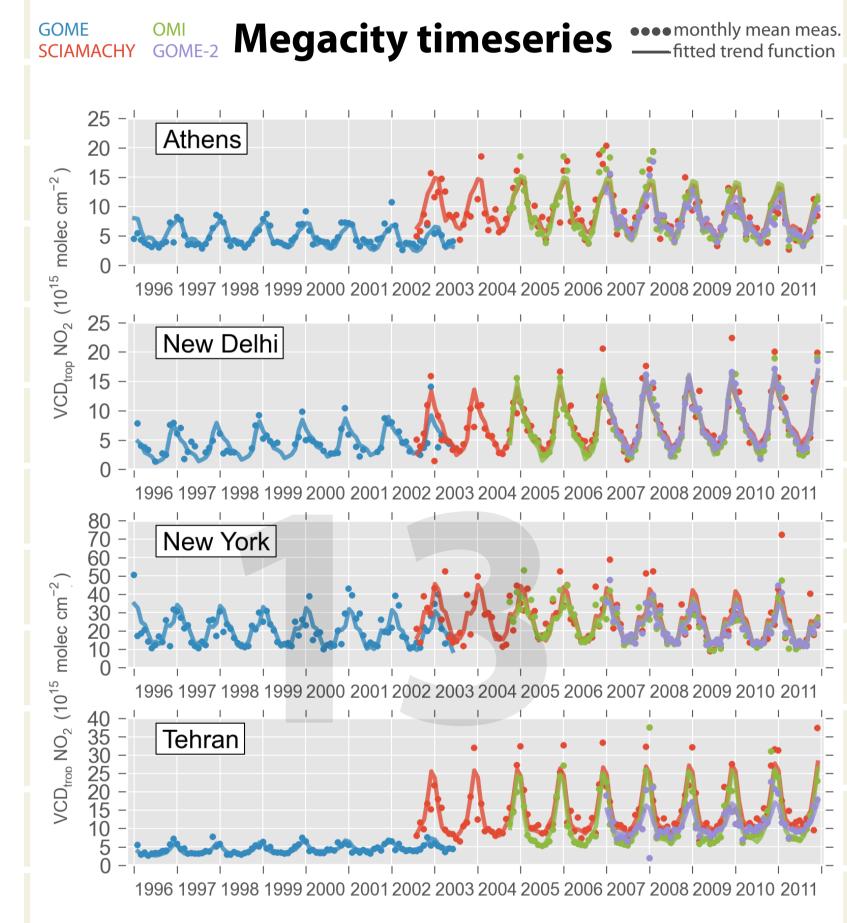


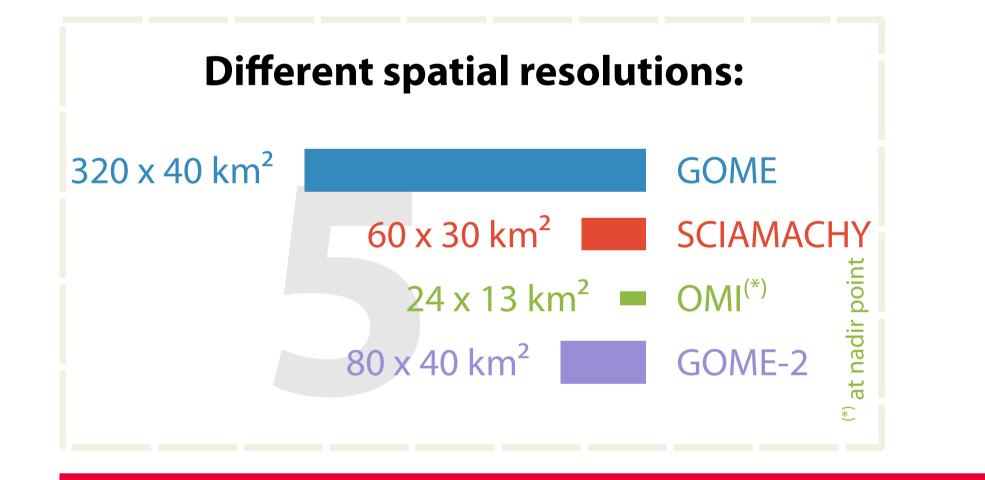
Shanghai











Uncertainty / significance assessment

via Bootstrap analysis:

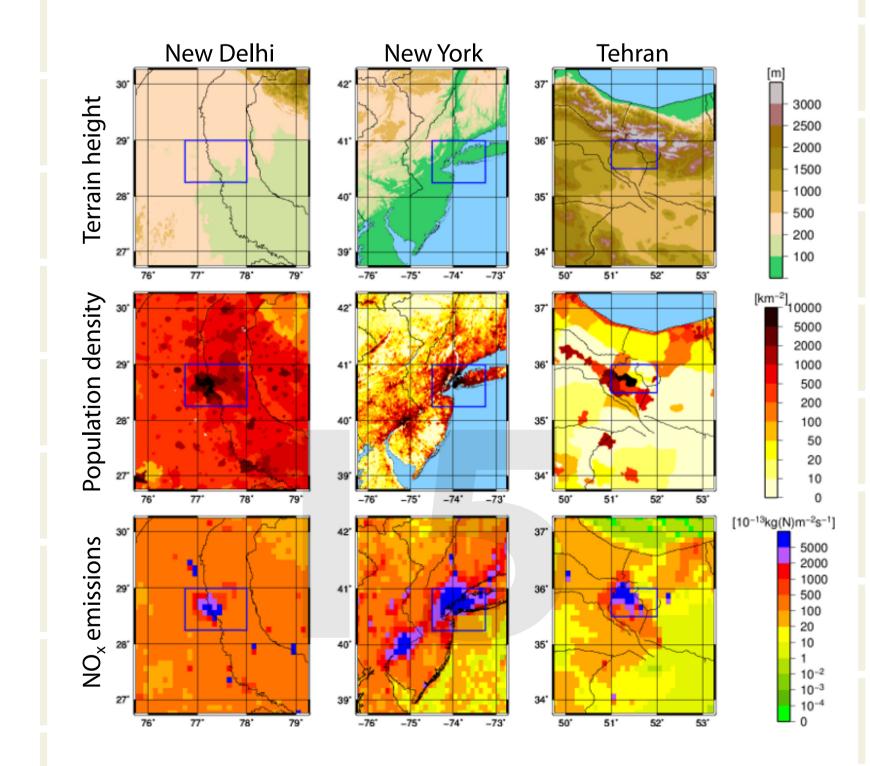
– 2000 replications

- shuffle trend fit residuals, repeat analysis
- compute histogram & 95% confidence interval
- trend is significant \iff 0.0 is outside of 95%-interval

Megacity NO₂ trends

City $(10^{14} \text{ molec cm}^{-2} \text{ yr}^{-1})$ $(\% \text{ yr}^{-1})$ Athens -2.09 ± 0.83 -3.7 ± 1.5 Baghdad $+3.24 \pm 0.37$ $+18.0 \pm 2.1$ Beijing $+9.5 \pm 2.9$ $+7.3 \pm 2.2$ enos Aires $+0.55 \pm 0.51$ $+1.7 \pm 1.6$ Cairo $+1.73 \pm 0.28$ $+6.4 \pm 1.0$ Dhaka $+3.41 \pm 0.54$ $+24.0 \pm 3.8$ ong Kong -1.1 ± 2.3 -1.0 ± 2.1 stanbul -0.4 ± 1.1 -0.5 ± 1.5 Jakarta -1.19 ± 0.41 3.3 ± 1.1 Karachi $+0.85 \pm 0.25$ $+6.0 \pm 1.8$ Lagos -1.66 ± 0.91 -3.0 ± 1.6 S Angeles -13.2 ± 2.6 -5.8 ± 1.2 exico City $+0.51 \pm 0.82$ $+1.0 \pm 1.6$ Mumbai $+0.70 \pm 0.21$ $+3.6 \pm 1.1$ ew Delhi $+2.57 \pm 0.60$ $+7.4 \pm 1.7$ lew York -5.7 ± 2.3 -2.6 ± 1.0 Paris -5.2 ± 2.5 -3.3 ± 1.6 Riyadh $+2.05 \pm 0.38$ $+6.9 \pm 1.3$ áo Paolo $+1.0 \pm 1.8$ $+0.7 \pm 1.2$ hanghai $+9.4 \pm 3.0$ $+9.2 \pm 2.9$
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Reasons for instrument-dependence



Non-linear changes in Athens STL decomposition Breakpoint regression SCIAMACHY OML 2003 2005 2007 2009 – Linear trend model does not reflect reality – Trend needs to be decomposed into several periods

Summary / Conclusions

– Investigation of long-term changes in tropospheric

Homogeneous, high-emission areas with no topographic boundaries: – ground pixel size has negligible effect

Areas with inhomogeneous, partly high emissions and no topographic boundaries: NO₂ can spread – small impact of instrument resolution

Emission "point sources" with topographic barriers (e.g., mountaints): NO₂ cannot spread throughout area – instrument resolution is very important

NO₂ columns using multiple satellite instruments

- Different instruments' spatial resolutions result in differences in the behaviour of the four datasets
- Effect of spatial resolution strongly depends on local surroundings of the city
- Development of a trend model which uses all available data
- Positive trends in emerging regions, negative trends in developed regions
- Assumption of linear changes is not optimal for long timeseries:

non-linear methods needed for quantification

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