

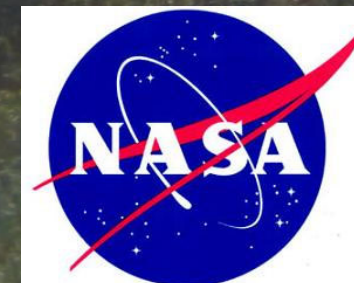
Evaluation of Uncertainties and Introduction of Tools for Quantification of Bulk Particle-phase Organic Nitrates Using Real-time Aerosol Mass Spectrometry

Doug Day

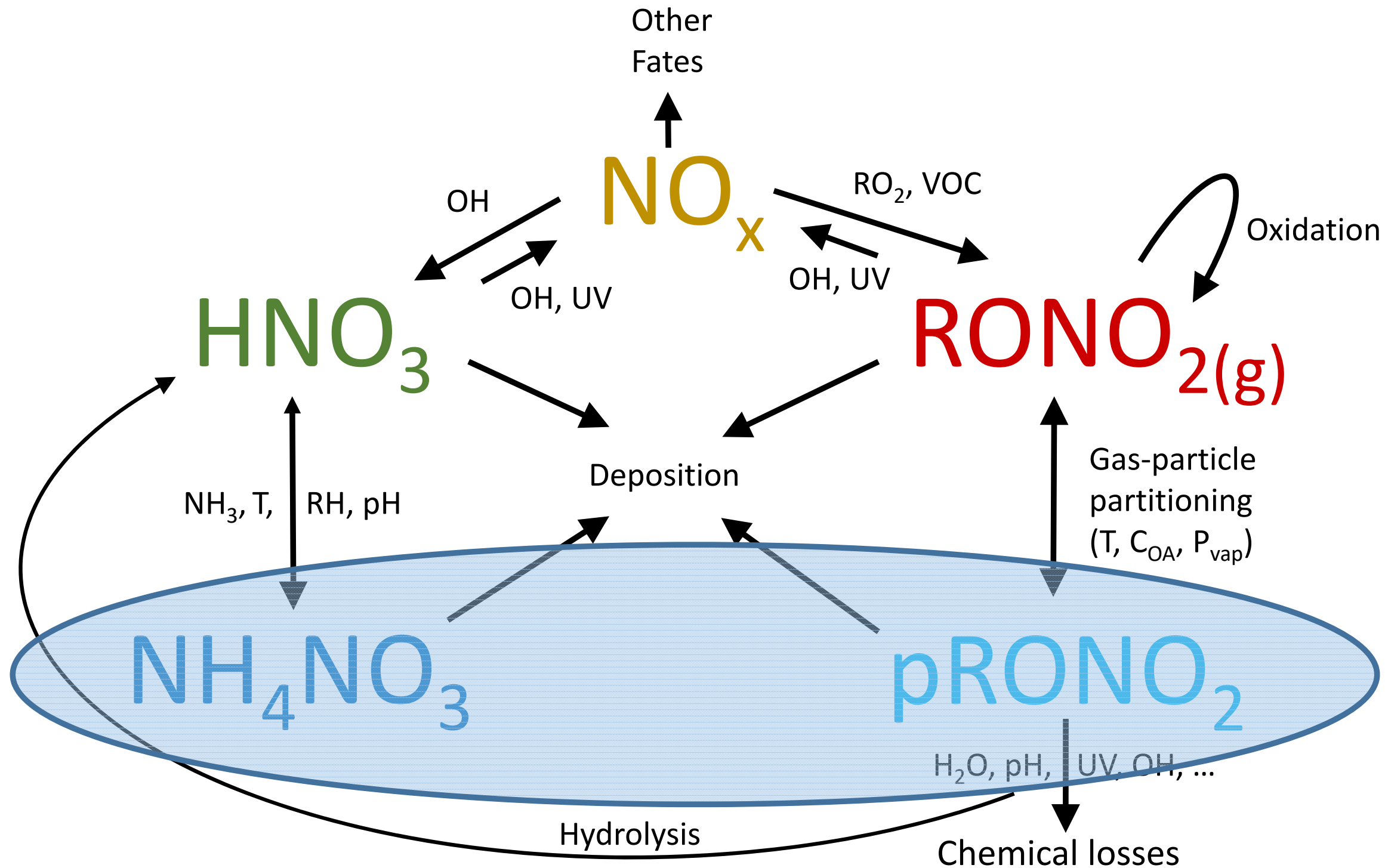
Pedro Campuzano Jost, Ben Nault, Donna Sueper, Jose L. Jimenez

American Association for Aerosol Research 41st Annual Conference

3 October 2023 (Portland, OR)



Organic Nitrates and Particle-phase Reactive Oxidized Nitrogen



AMS Methods for pRONO₂ Quantification

- **NO₂⁺/NO⁺ ion ratios** (*Farmer et al., PNAS 2010; Fry et al. ACP 2013; Kiendler-Scharr, et al., GRL 2016*)
- ~~HNO₃⁺/NO_x⁺ ion ratios~~ (*Farmer et al., PNAS 2010*)
- ~~C_xH_yO_zN⁺ ions~~ (*Farmer et al., PNAS 2010*)
- ~~Ammonium balance~~ (*Aiken et al., ACP 2009; Farmer et al., PNAS 2010, Zaveri et al., JGR 2010; Docherty et al., ACP 2011; Häkkinen et al., ACP 2012*)
- **Difference of total AMS nitrate and inorganic nitrate** (*Farmer et al., PNAS 2010; Xu et al., PNAS 2015*)
- **PMF including spectra of OA and nitrate ions** (*Sun et al., ACP 2012; Hao et al., ACP 2014; Xu et al., ACP 2015*)

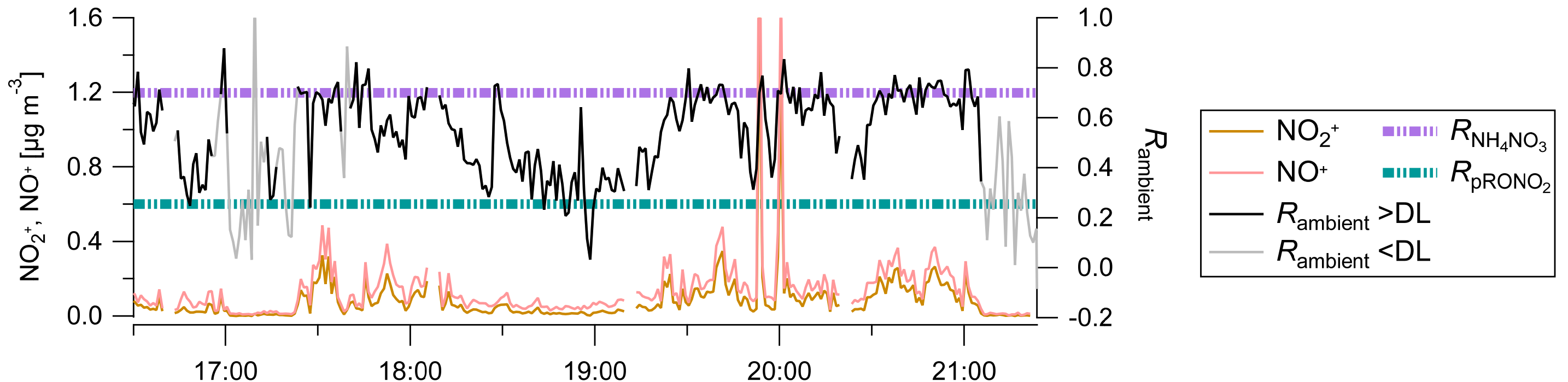
Nitrate Apportionment with NO_x^+ ions

- Organic nitrates and non-refractory inorganic nitrate produce different $\text{NO}_2^+/\text{NO}^+$ fragmentation ratios in AMS. (Farmer et al., PNAS 2010)

$$R_{\text{NH}_4\text{NO}_3} : \text{NO}_2^+ / \text{NO}^+ \rightarrow \sim 0.2 - 1$$

$$R_{\text{pRONO}_2} : \text{NO}_2^+ / \text{NO}^+ \rightarrow \sim 0.1 - 0.4$$

R_{ambient} : measured $\text{NO}_2^+ / \text{NO}^+$ bounded by $R_{\text{NH}_4\text{NO}_3}$ and R_{pRONO_2}



Nitrate Apportionment with NO_x^+ ions

$$f_{pRONO_2} = \frac{pRONO_2}{pNO_3}$$

$$R_{NH_4NO_3}: NO_2^+ / NO^+ \rightarrow \sim 0.2 - 1$$

$$R_{pRONO_2}: NO_2^+ / NO^+ \rightarrow \sim 0.1 - 0.4$$

$$f_{NH_4NO_3} \frac{NH_4NO_3}{pNO_3}$$

$R_{ambient}$: measured NO_2^+ / NO^+
bounded by $R_{NH_4NO_3}$ and R_{pRONO_2}

$$f_{pRONO_2} = \frac{(R_{ambient} - R_{NH_4NO_3})(1 + R_{pRONO_2})}{(R_{pRONO_2} - R_{NH_4NO_3})(1 + R_{ambient})}$$

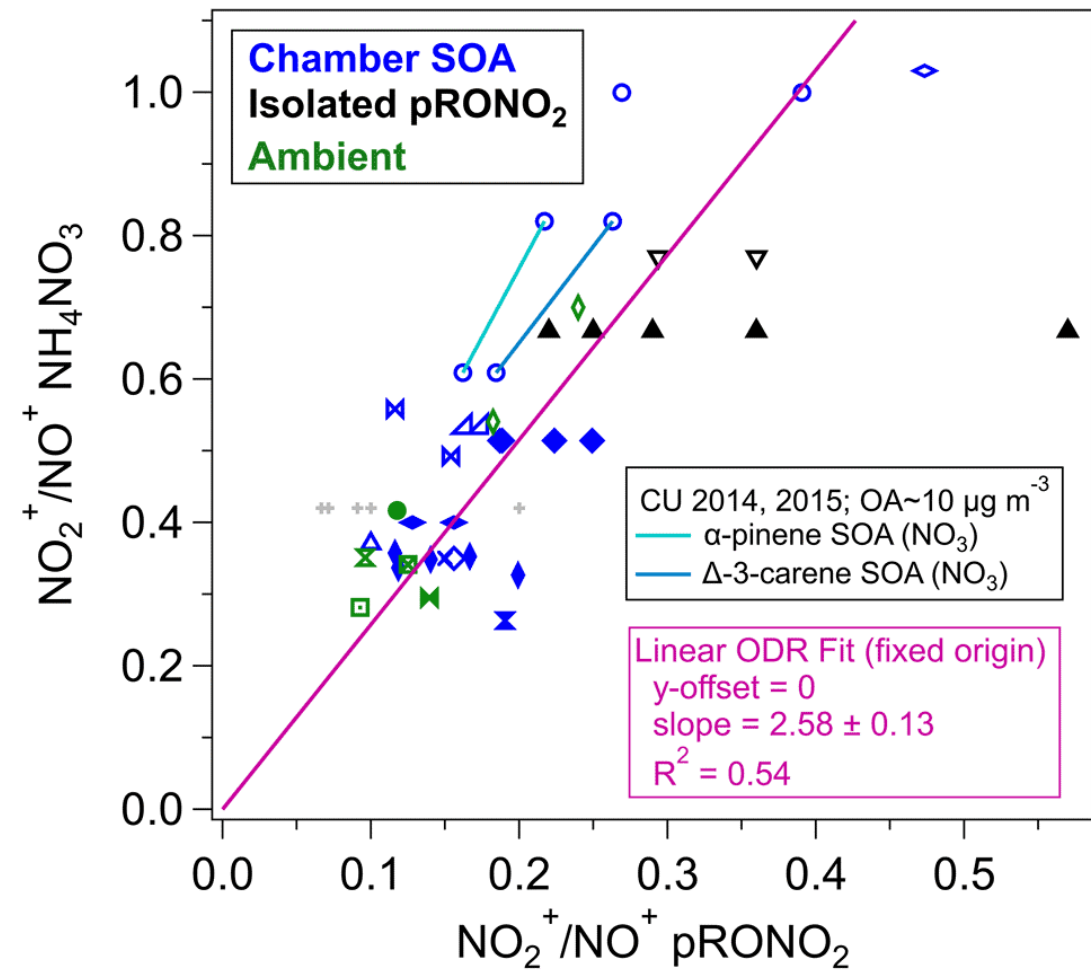
Apportionment with NO_x^+ ions, Ratio-of-Ratios

- “Ratio-of-Ratios” (R_oR) may be better metric to constrain R_{pRONO_2} for ambient measurements

(Fry et al., ACP 2013; Day et al AMT 2022)

$$f_{pRONO_2} = \frac{(R_{ambient} - R_{NH_4NO_3})(1 + R_{pRONO_2})}{(R_{pRONO_2} - R_{NH_4NO_3})(1 + R_{ambient})}$$

$R_{NH_4NO_3}$ vs R_{pRONO_2}

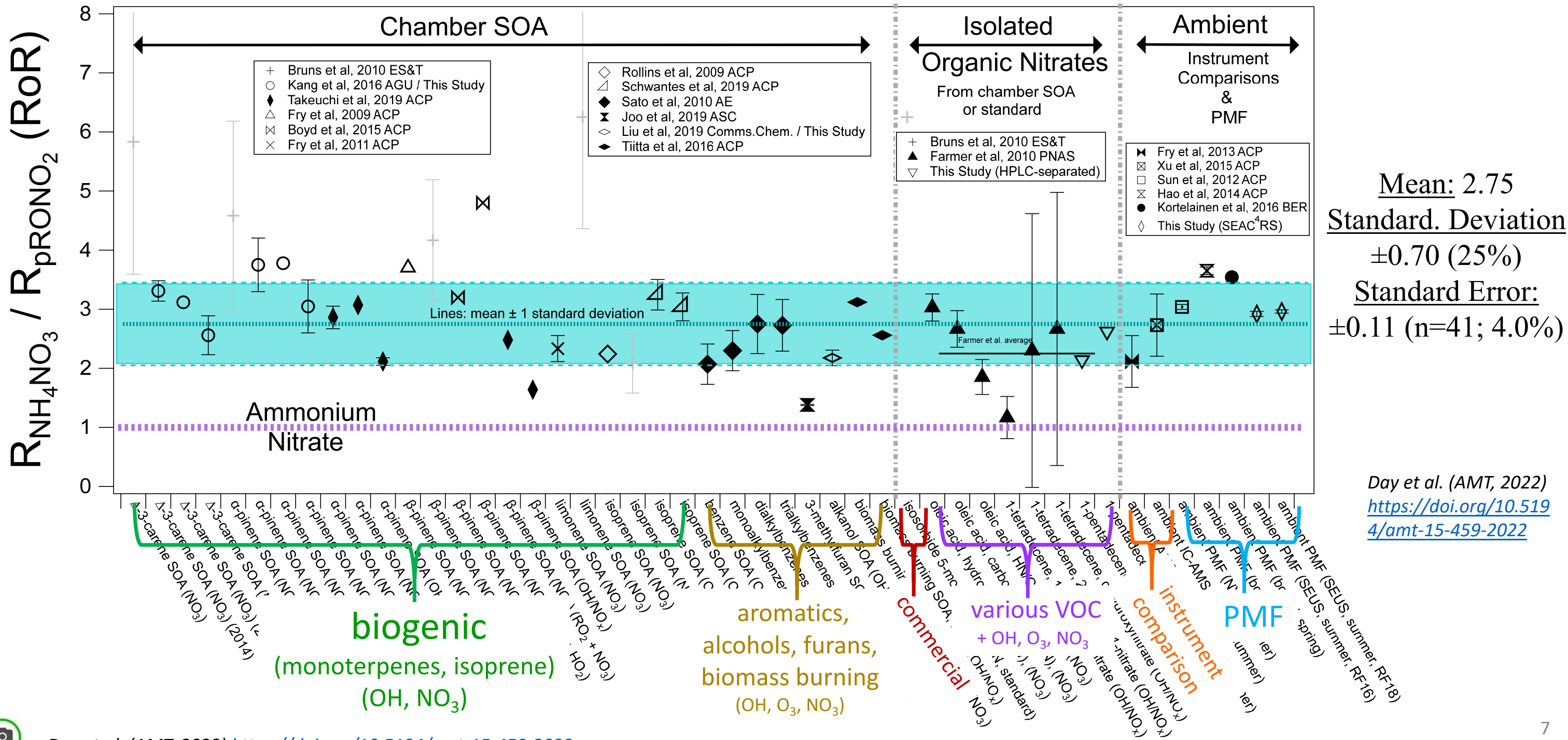


$$R_oR = \frac{R_{NH_4NO_3}}{R_{pRONO_2}}$$

Substituting $\frac{R_{NH_4NO_3}}{R_oR}$ for R_{pRONO_2}

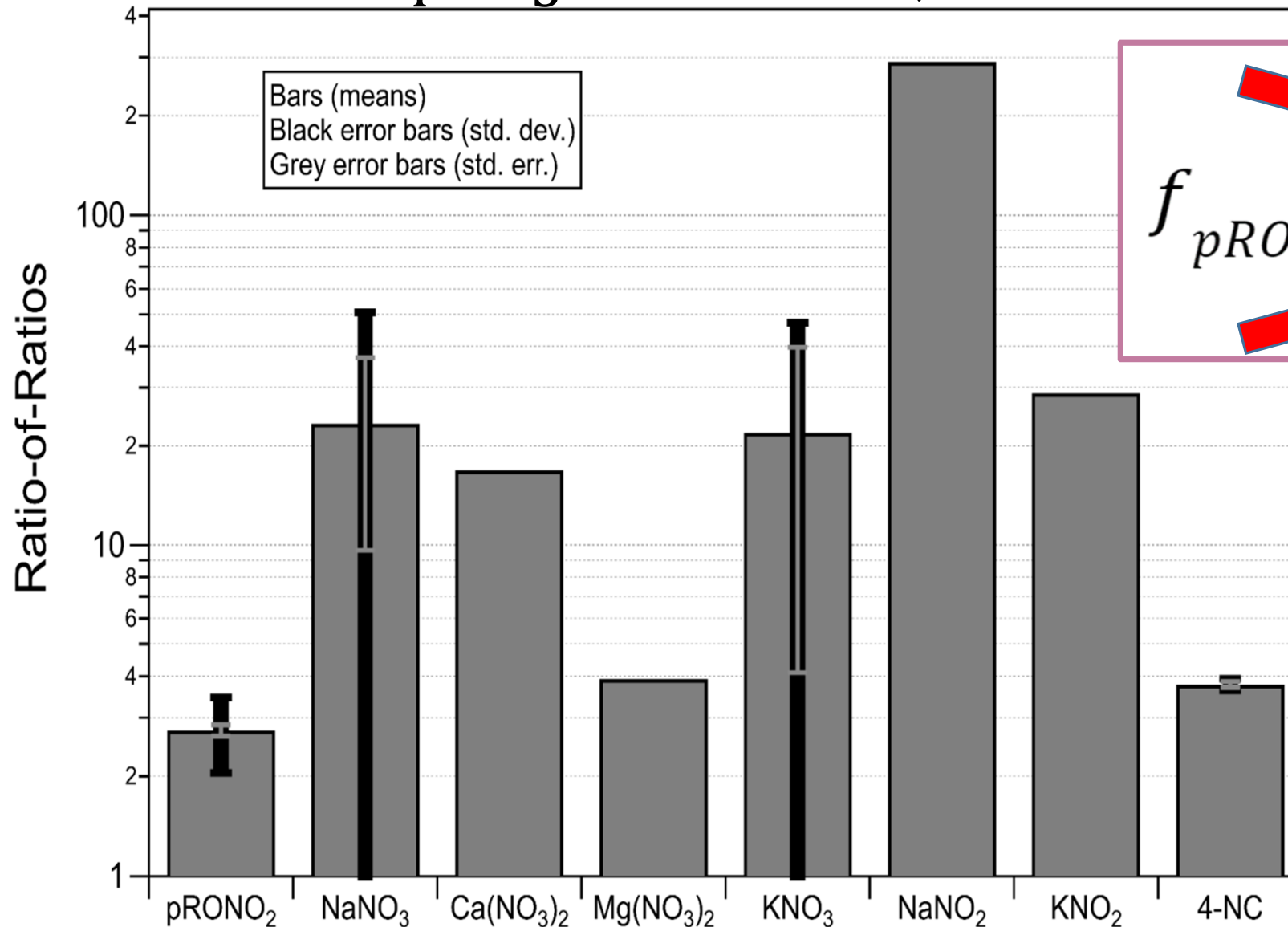
$$f_{pRONO_2} = \frac{(R_{ambient} - R_{NH_4NO_3})(1 + R_oR)}{(R_oR - R_{NH_4NO_3})(1 + R_{ambient})}$$

Survey of pRONO₂ NO_x⁺ ratios (as Ratio-of-Ratios)



Not applicable under strong influence of nitrite or refractory nitrate

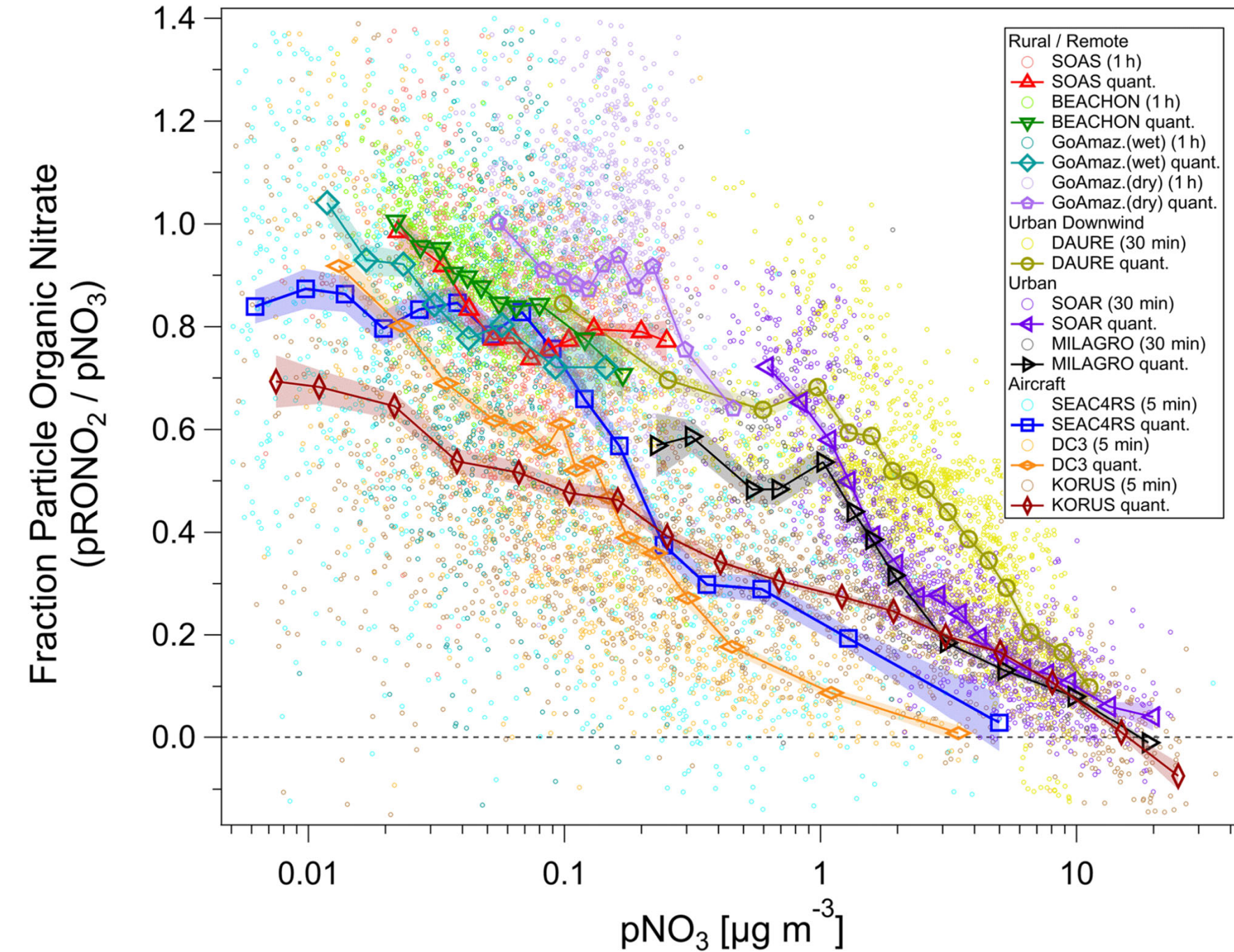
$$(R_{NH_4NO_3} / R_{nitrate, nitrite})$$



~~$$f_{pRONO_2} = \frac{(R_{ambient} - R_{NH_4NO_3}) \left(1 + \frac{R_{NH_4NO_3}}{RoR}\right)}{\left(\frac{R_{NH_4NO_3}}{RoR} - R_{NH_4NO_3}\right) \left(1 + R_{ambient}\right)}$$~~

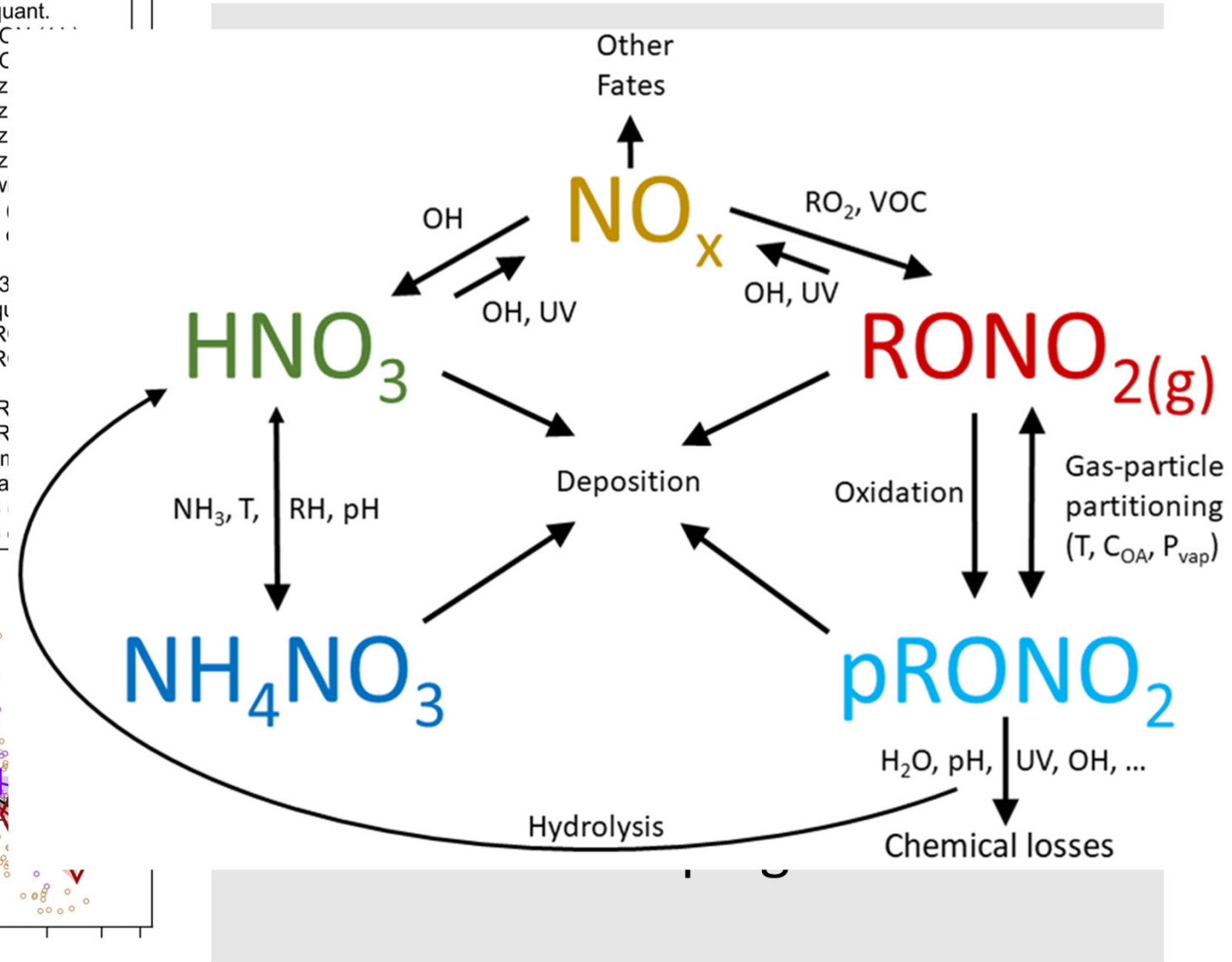
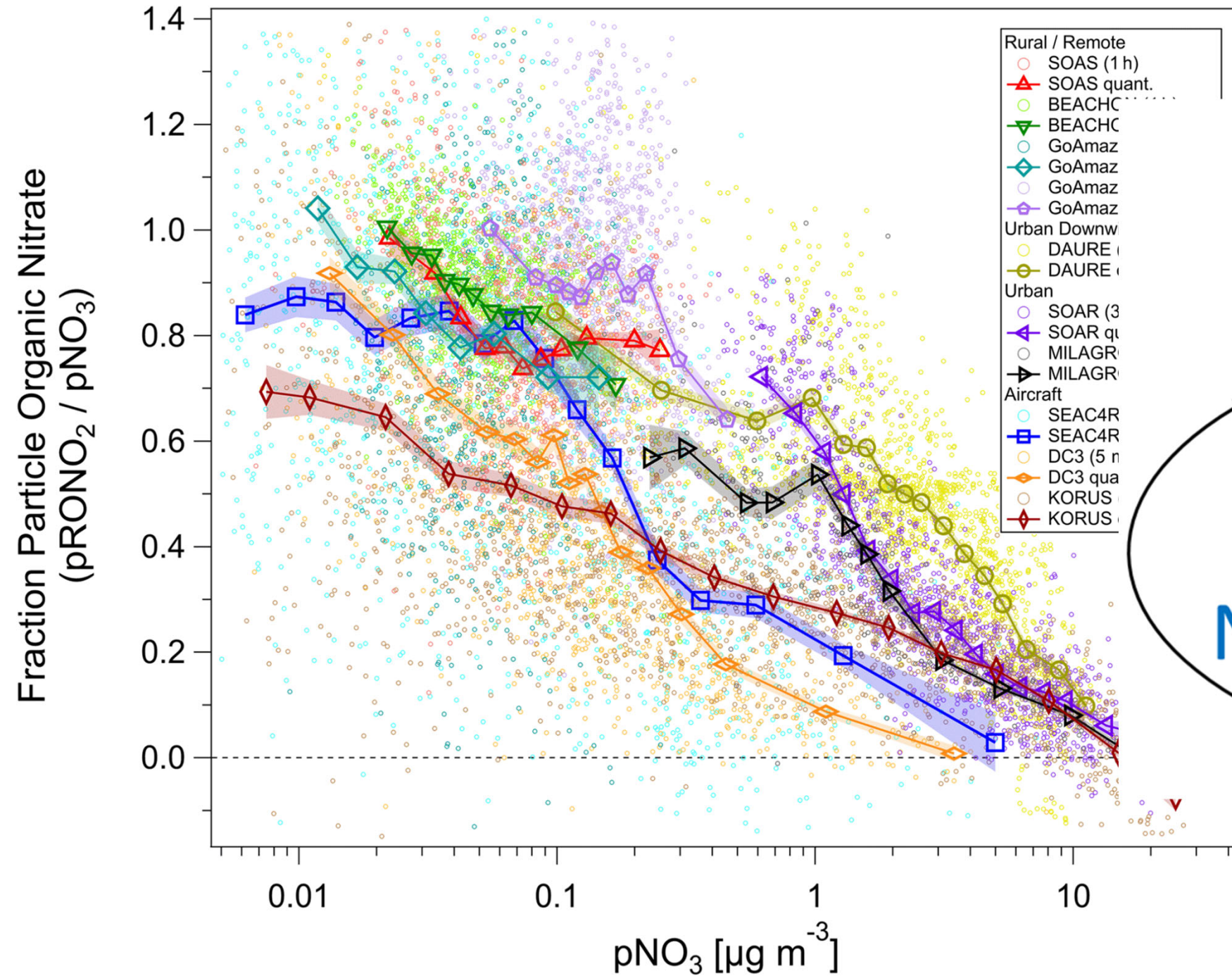
$R_{nitrate} \rightarrow NO_2^+ / NO^+$

Application and Further Support (Organic vs. Inorganic Nitrate)



- 10 Campaigns
- Ground, Aircraft
- Remote, Rural, Urban, Mixed
- Warm seasons
- Overall trend: fpRONO₂ decrease with pNO₃ increase
- Substantial differences for aircraft campaigns

Application and Further Support (Organic vs. Inorganic Nitrate)



Uncertainties Systematically Explored

$$R_{\text{nitrate, mix}}: \text{NO}_2^+/\text{NO}^+$$

$$RoR = \frac{R_{\text{NH}_4\text{NO}_3}}{R_{\text{pRONO}_2}}$$

$$f_{\text{pRONO}_2} = \frac{(R_{\text{ambient}} - R_{\text{NH}_4\text{NO}_3}) \left(1 + \frac{R_{\text{NH}_4\text{NO}_3}}{RoR}\right)}{\left(\frac{R_{\text{NH}_4\text{NO}_3}}{RoR} - R_{\text{NH}_4\text{NO}_3}\right) (1 - R_{\text{ambient}})}$$



$$p\text{RONO}_2 = f_{\text{pRONO}_2} \times p\text{NO}_3$$

$$\text{NH}_4\text{NO}_3 = f_{\text{NH}_4\text{NO}_3} \times p\text{NO}_3$$

$\sigma_{R_{\text{ambient}}}$: composition, concentration, instrument

$$\sigma_{R_{\text{NH}_4\text{NO}_3}}: \pm 5\%$$

$$\sigma_{RoR}: \pm 15\%$$

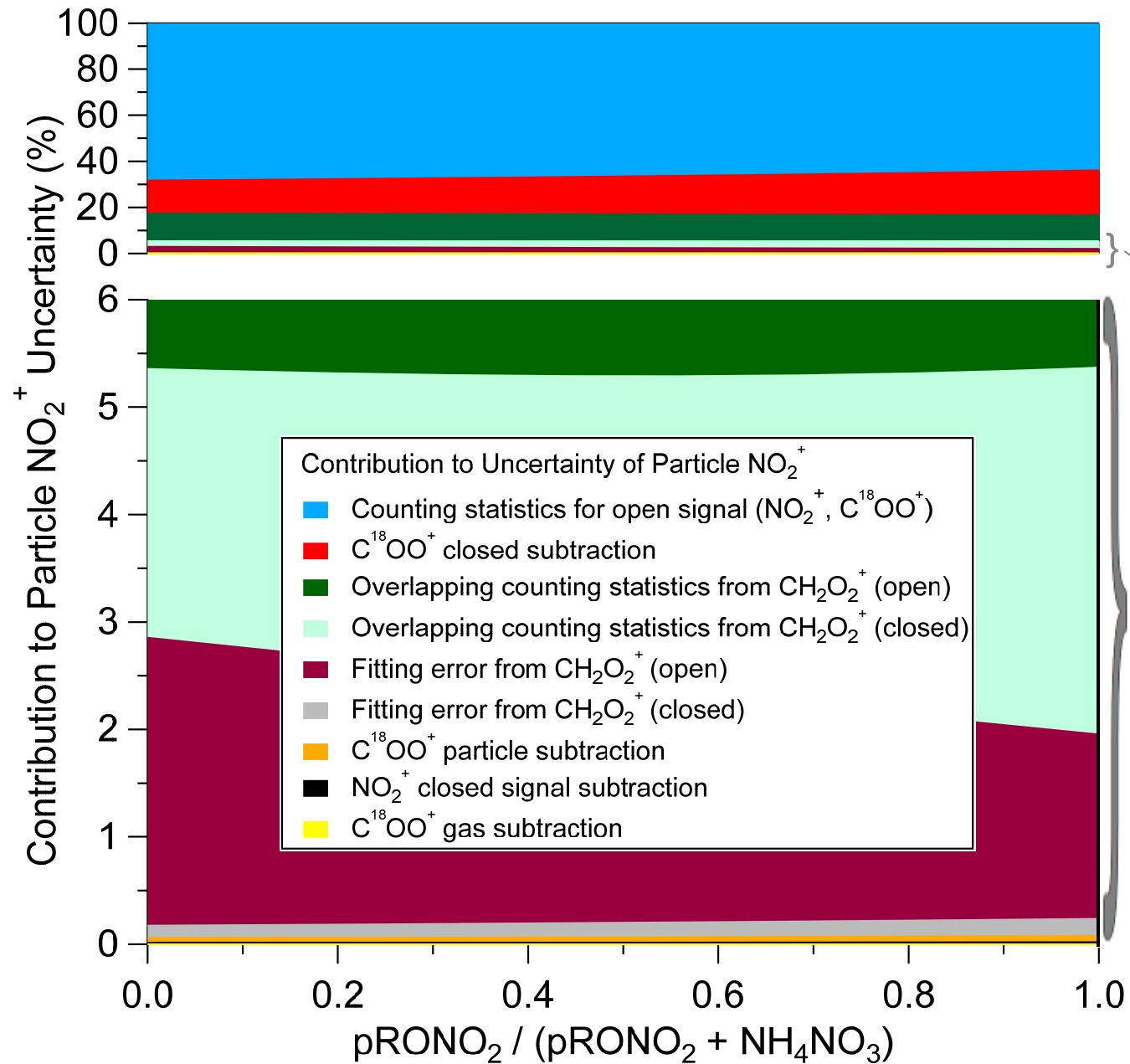
(Day et al., AMT 2022)

$$\sigma_{[p\text{NO}_3]}: \pm 16.5\%$$

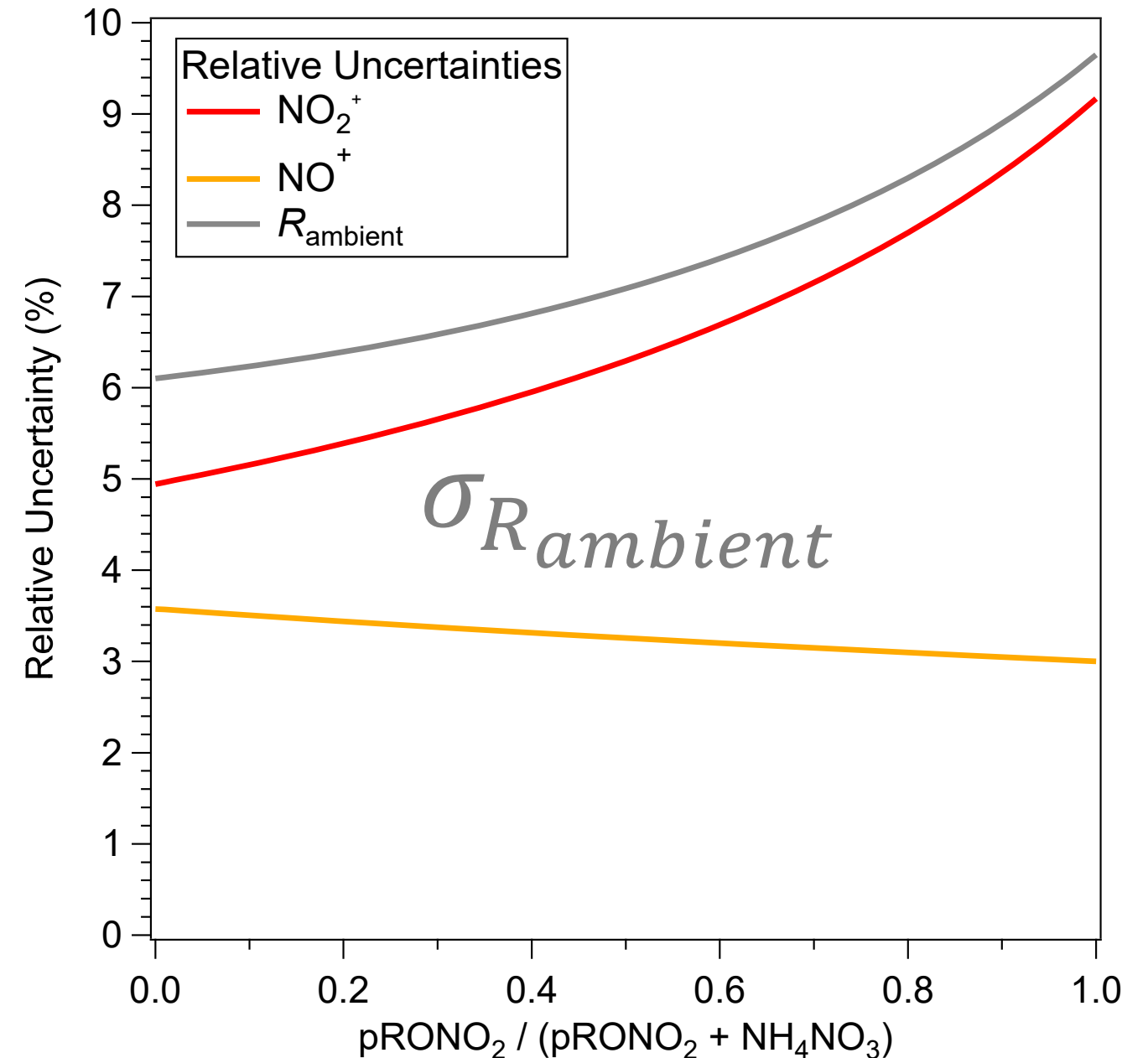
(Bahreini et al., AMT 2009)

Contributions to particle NO_x^+ , $R_{ambient}$ uncertainty

Particle NO_2^+ Uncertainty Contribution



NO_2^+ , NO^+ , $R_{ambient}$ uncertainty

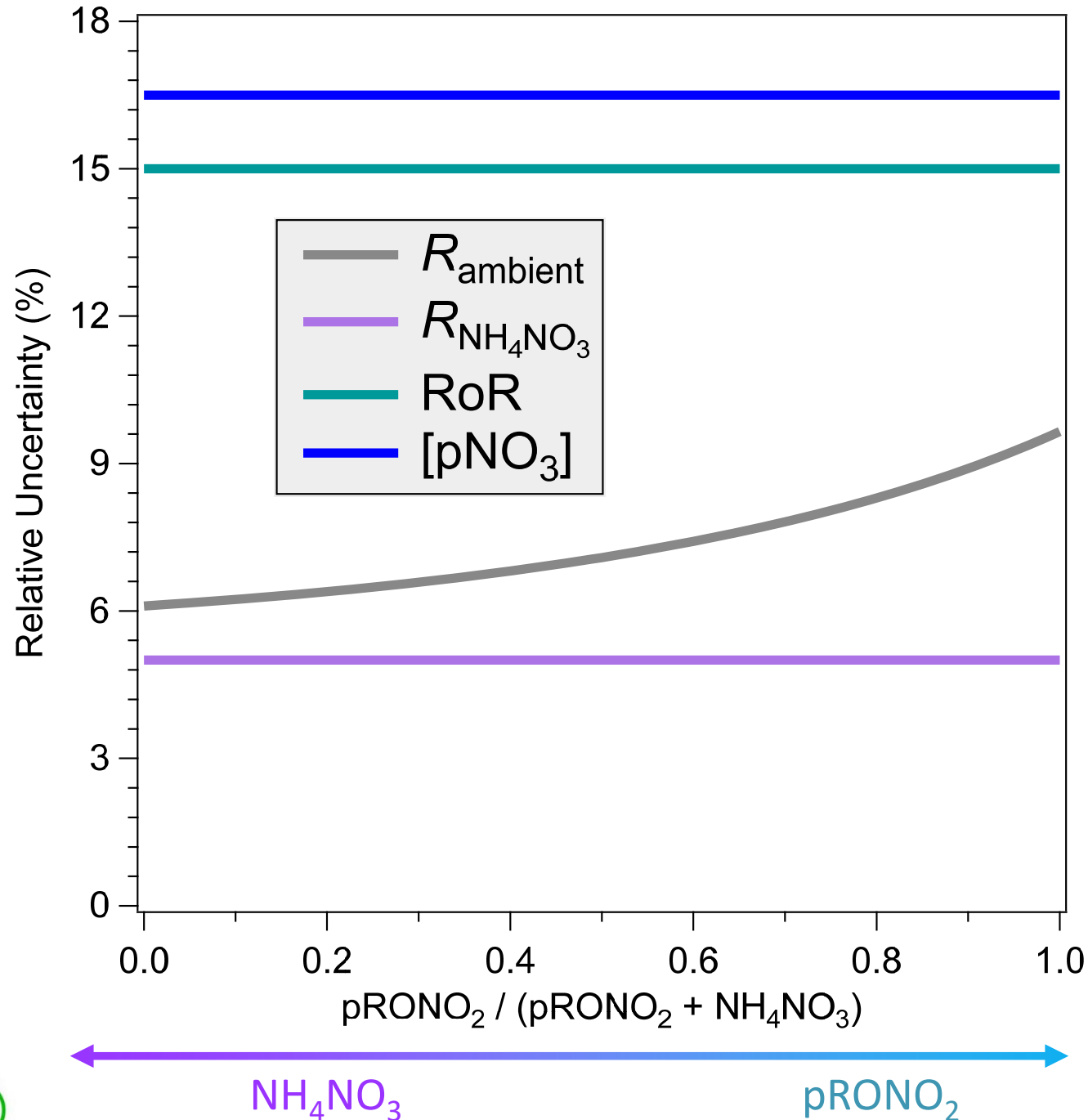


← NH_4NO_3 pRONO_2 →

← NH_4NO_3 pRONO_2 →

Overall Uncertainties

Input Terms (as Rel. Uncert)



$$\sigma_{R_{ambient}}$$

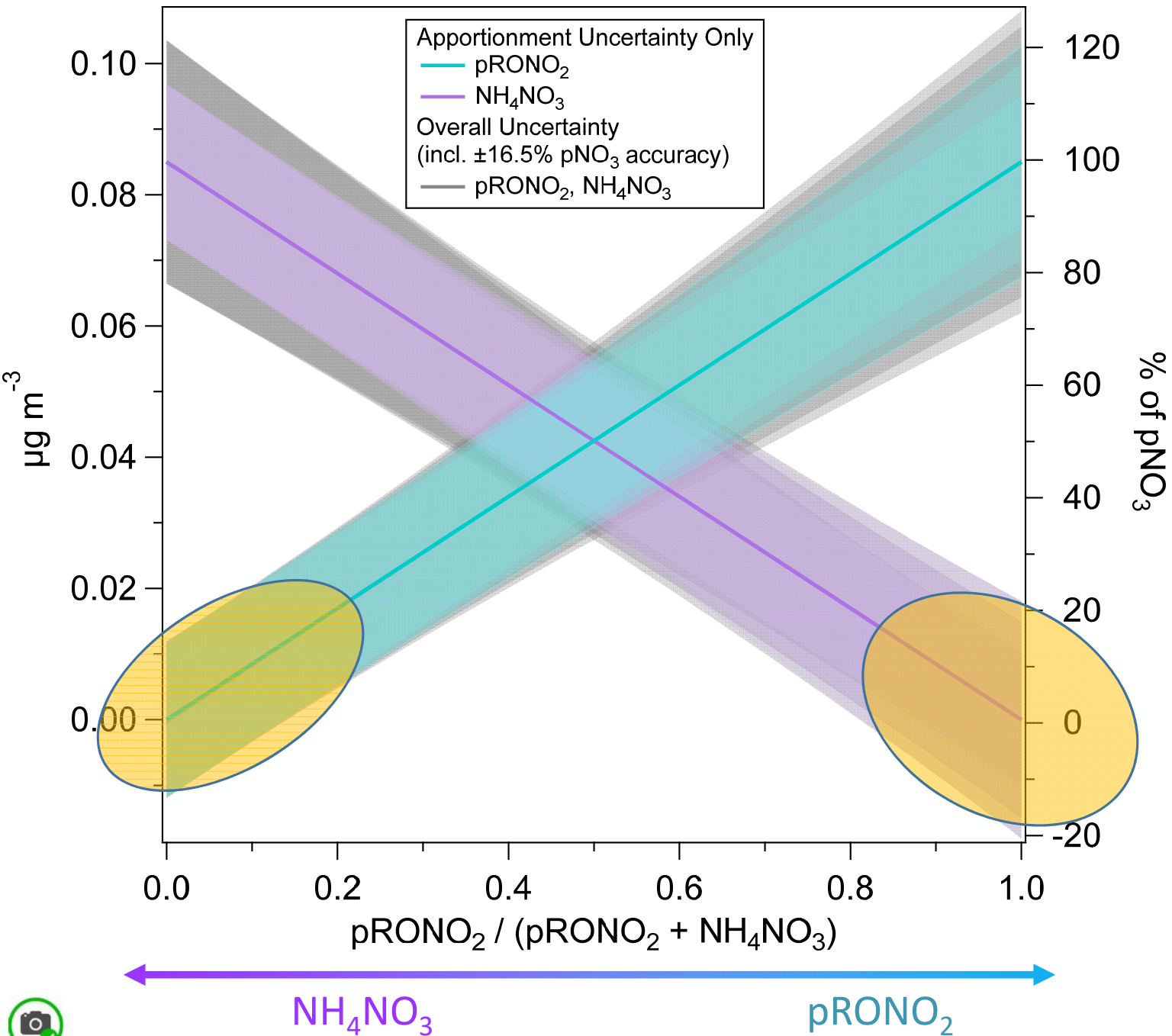
$$\sigma_{R_{NH_4NO_3}} : \pm 5\%$$

$$\sigma_{RoR} : \pm 15\%$$

$$\sigma_{[pNO_3]} : \pm 16.5\%$$

Overall Uncertainties

Absolute Uncertainties



Monte Carlo Simulations

$$f_{pRONO_2} = \frac{(R_{ambient} - R_{NH_4NO_3}) \left(1 + \frac{R_{NH_4NO_3}}{RoR}\right)}{\left(\frac{R_{NH_4NO_3}}{RoR} - R_{NH_4NO_3}\right) (1 + R_{ambient})}$$

$$pRONO_2 = f_{pRONO_2} \times pNO_3$$

(propagated in simple quadrature)

$$\sigma_{pRONO_2} = \sqrt{\sigma_{f_{pRONO_2}}^2 + \sigma_{[pNO_3]}^2}$$

Contributions to Overall Uncertainties

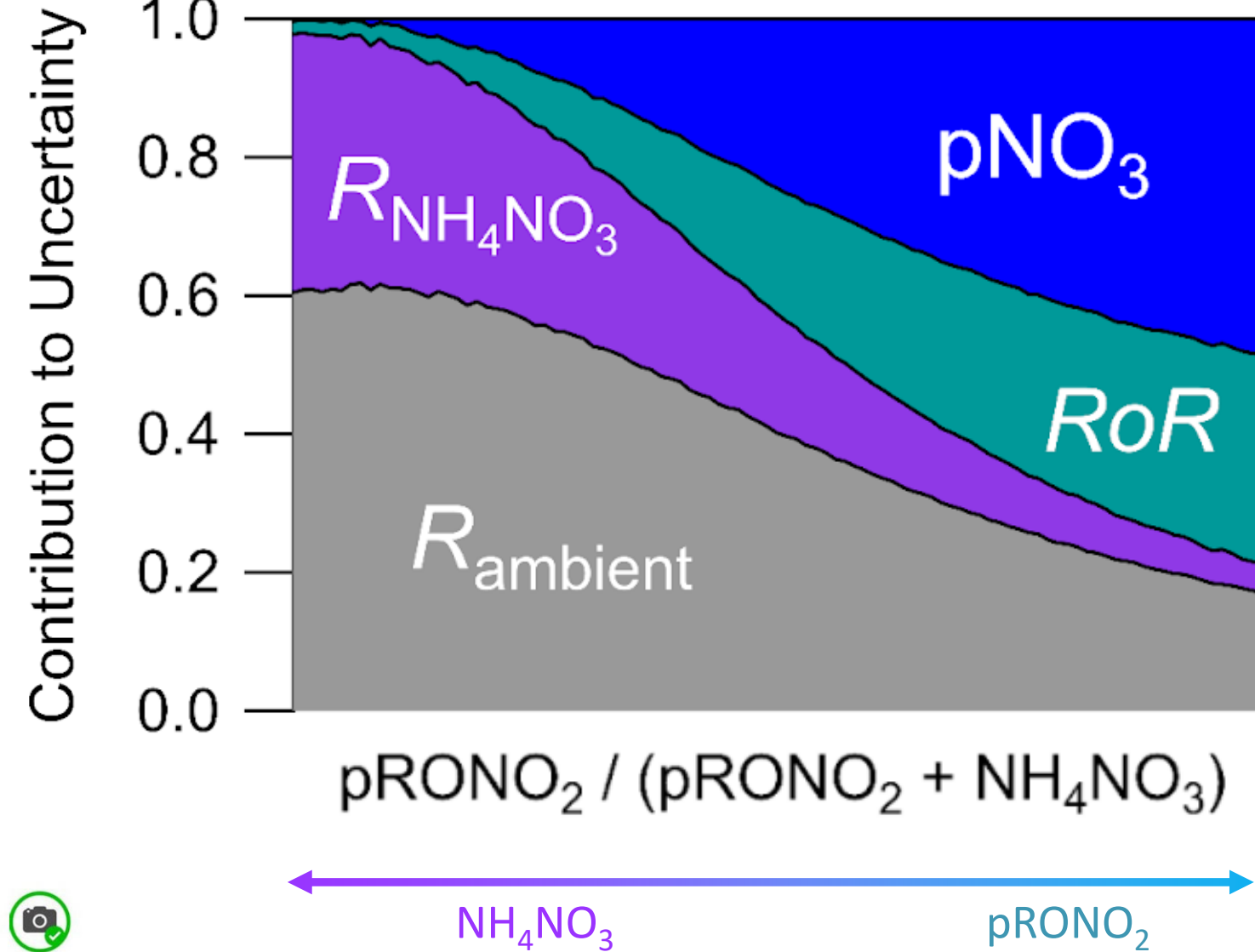
$\sigma_{R_{ambient}}$
(composition-dependent)

$\sigma_{R_{NH_4NO_3}} : \pm 5\%$

$\sigma_{RoR} : \pm 15\%$

$\sigma_{[pNO_3]} : \pm 16.5\%$

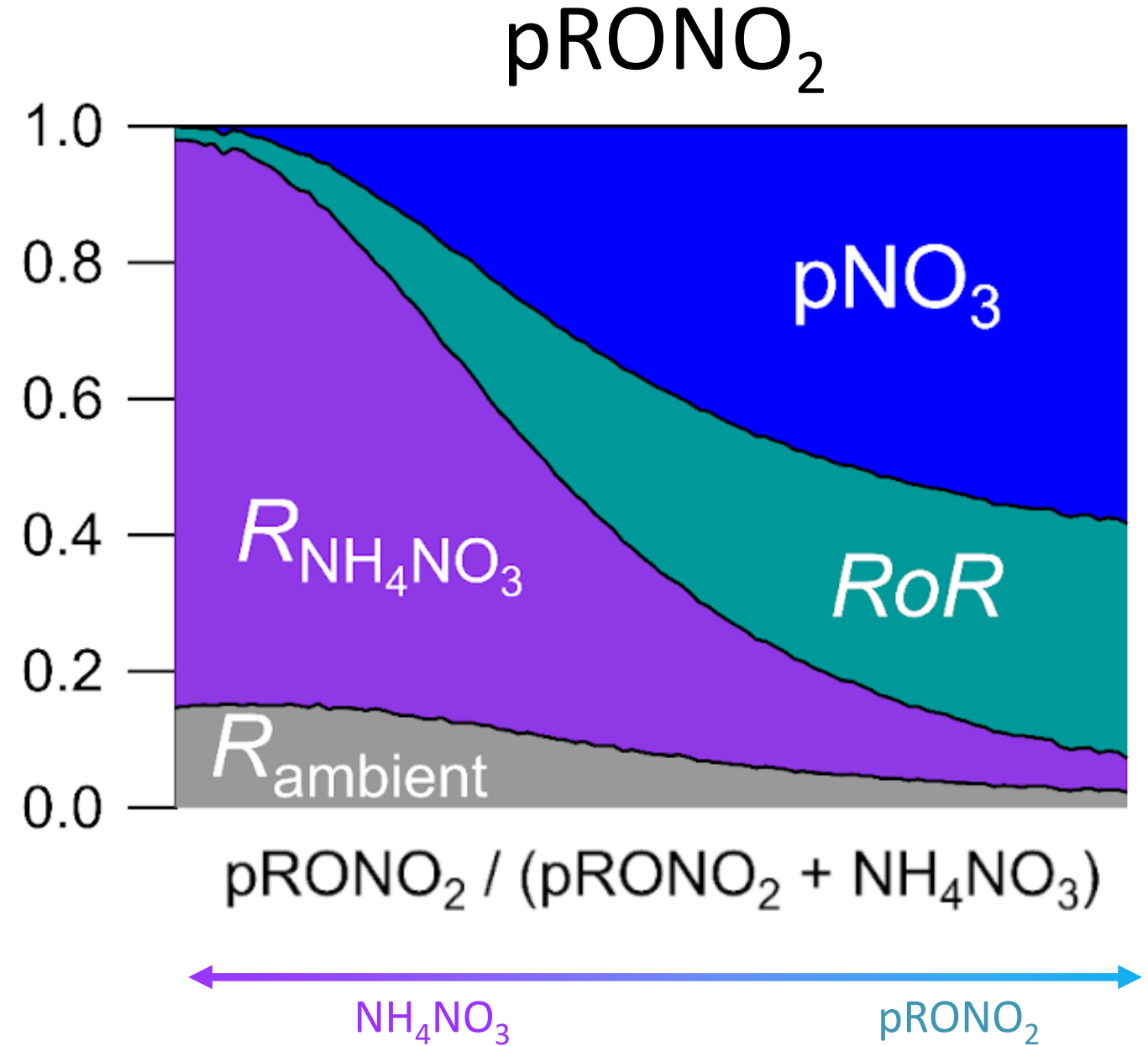
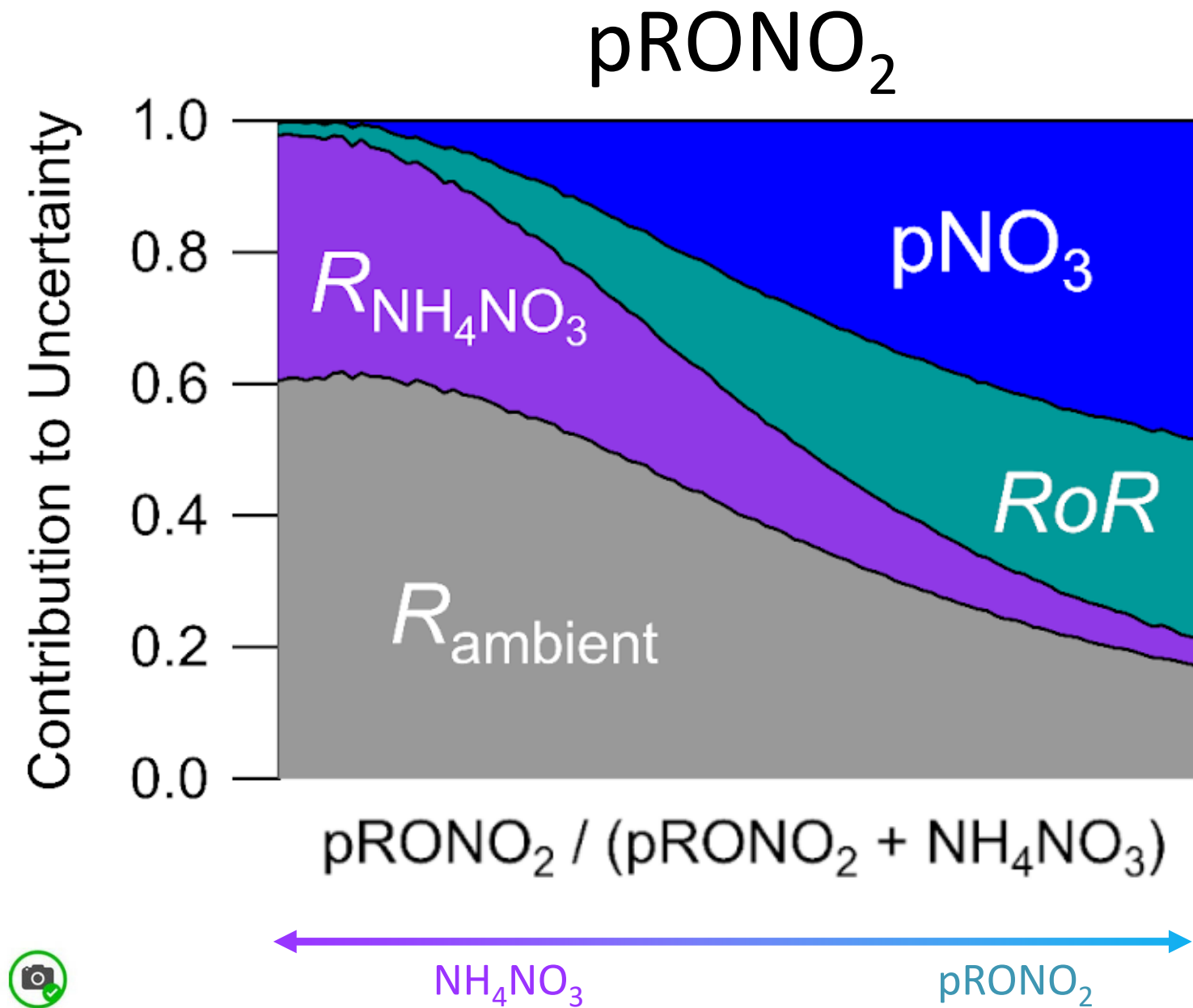
pRONO₂



Contributions to Overall Uncertainties




Base Case (1-min average)

10-min averaging



ANTS software (AMS NiTrate Separator)

AMS NiTrate Separator" (ANTS)
(apportionment of pRONO₂, NH₄NO₃)

Data Types & Input Parameters

0=use "RAN" wave pNO3 %uncert 16.5

HR or UMR data? RoR 2.73 R_{NH4NO3} 0.9 pCO/pCO₂ 1

GenAlt vs FMS data? %uncert 15 %uncert 5 %uncert 30

OmC or Diff data? MWt Org Nitrates (0 for skip calc) 230

Wave Assignments (UMR waves TBD)

ToDo

Waves required in root folder:

For Apportionment (value & err waves in µg m⁻³, incl. AB corr)
HR(diff or OmC): HRNO₃, NO₂, NO, HROrgCO₂, CH₂O, CH₂O₂, HROrg

For Uncerts/DLs (values and coresponding err waves in Hz, no AB corr)
HR(OmC, O, C): HRNO₃, NO, NO₂, HROrgCO₂, CO₂, CH₂O, CH₂O₂

smooth NOx (s)

Bound Fractions 0-1?

Uncertainty Calculations

NOx Ratio Uncerts

NOx uncert type

Plot NO₂,NO Sig/Error Contributions

Plot NOx Uncert Methods Compare

pRONO₂, NH₄NO₃ Apportmnt Uncerts

Uncert Apport Method?

Calculate Monte Carlo Uncerts? MC # Iter

Calc rel contrib each term to overall uncert?

Plot Uncerts on Master Apport Plot

Detection Limits and Screening

NOx Ratio DLs

NOx Ratio DL type

NOx Ratio DL sigma

Plot Detailed NOx+, pNO₃ DLs?

pRONO₂, NH₄NO₃ Apportionment DLs

Apport DL type

Apportionment DL sigma

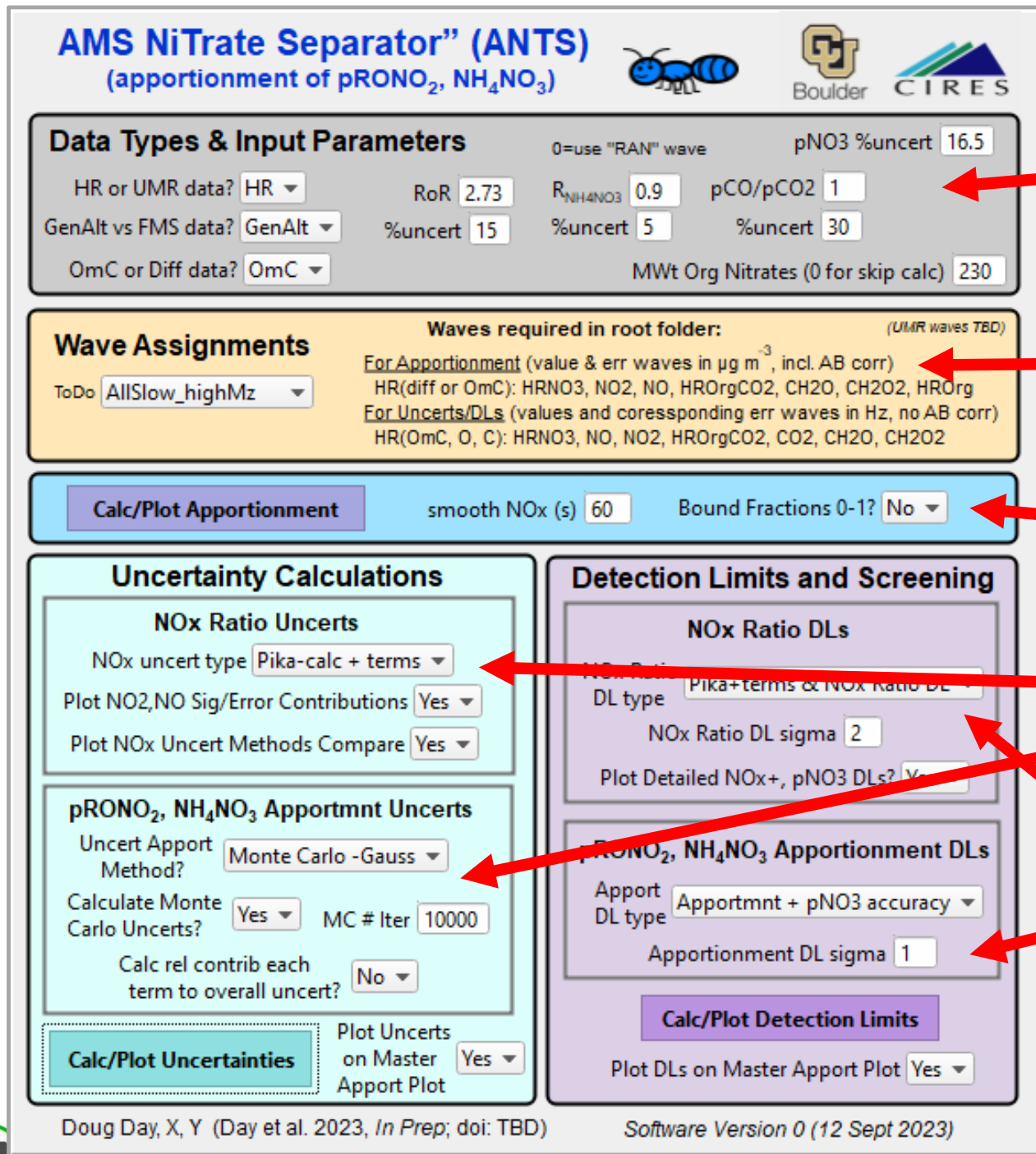
Plot DLs on Master Apport Plot

Doug Day, X, Y (Day et al. 2023, *In Prep*; doi: TBD)

Software Version 0 (12 Sept 2023)

- Publically-available open-source
- Beta version complete. Further testing on ambient datasets.
- UMR apportionment & uncertainties to be added.

ANTS software (AMS NiTrate Separator)



AMS NiTrate Separator" (ANTS)
(apportionment of pRONO₂, NH₄NO₃)

Data Types & Input Parameters

HR or UMR data? RoR R_{NH4NO3} pCO/pCO₂ pNO₃ %uncert

GenAlt vs FMS data? %uncert %uncert %uncert

OmC or Diff data? MWt Org Nitrates (0 for skip calc)

Wave Assignments

ToDo

Waves required in root folder: (UMR waves TBD)

For Apportionment (value & err waves in µg m⁻³, incl. AB corr)
HR(diff or OmC): HRNO₃, NO₂, NO, HROrgCO₂, CH₂O, CH₂O₂, HROrg

For Uncerts/DLs (values and corresponding err waves in Hz, no AB corr)
HR(OmC, O, C): HRNO₃, NO, NO₂, HROrgCO₂, CO₂, CH₂O, CH₂O₂

Calc/Plot Apportionment smooth NO_x (s) Bound Fractions 0-1?

Uncertainty Calculations

NO_x Ratio Uncerts

NO_x uncert type

Plot NO₂, NO Sig/Error Contributions

Plot NO_x Uncert Methods Compare

pRONO₂, NH₄NO₃ Apportmnt Uncerts

Uncert Apport Method?

Calculate Monte Carlo Uncerts? MC # Iter

Calc rel contrib each term to overall uncert?

Detection Limits and Screening

NO_x Ratio DLs

DL type

NO_x Ratio DL sigma

Plot Detailed NO_x+, pNO₃ DLs?

pRONO₂, NH₄NO₃ Apportionment DLs

Apport DL type

Apportionment DL sigma

Calc/Plot Uncertainties Plot Uncerts on Master Apport Plot

Calc/Plot Detection Limits Plot DLs on Master Apport Plot


Doug Day, X, Y (Day et al. 2023, *In Prep*; doi: TBD) Software Version 0 (12 Sept 2023)


- User selectable input: e.g. type of data, parameters, uncertainties
- Runs in AMS analysis software (Sq/Pika) Generates all required waves
- Computes/plots apportionment
- Computes/plots uncertainties.
- Computes/plots detection limits.

ANTS output


AMS NiTrate Separator" (ANTS)

(apportionment of pRONO₂, NH₄NO₃)





Boulder



CIRES

Data Types & Input Parameters

0=use "RAN" wave pNO3 %uncert 16.5

HR or UMR data? RoR 2.73 R_{NH4NO3} 0.9 pCO/pCO2 1

GenAlt vs FMS data? %uncert 15 %uncert 5 %uncert 30

OmC or Diff data? MWt Org Nitrates (0 for skip calc) 230

Wave Assignments

(UMR waves TBD)

Waves required in root folder:

ToDo

For Apportionment (value & err waves in µg m⁻³, incl. AB corr)
 HR(diff or OmC): HRNO3, NO2, NO, HROrgCO2, CH2O, CH2O2, HROrg
 For Uncerts/DLs (values and coressponding err waves in Hz, no AB corr)
 HR(OmC, O, C): HRNO3, NO, NO2, HROrgCO2, CO2, CH2O, CH2O2

Calc/Plot Apportionment

smooth NOx (s) Bound Fractions 0-1?

Uncertainty Calculations

NOx Ratio Uncerts

NOx uncert type

Plot NO2,NO Sig/Error Contributions

Plot NOx Uncert Methods Compare

pRONO₂, NH₄NO₃ Apportmnt Uncerts

Uncert Apport Method?

Calculate Monte Carlo Uncerts? MC # Iter

Calc rel contrib each term to overall uncert?

Calc/Plot Uncertainties

Plot Uncerts on Master Apport Plot

Detection Limits and Screening

NOx Ratio DLs

NOx Ratio DL type

NOx Ratio DL sigma

Plot Detailed NOx+, pNO3 DLs?

pRONO₂, NH₄NO₃ Apportionment DLs

Apport DL type

Apportionment DL sigma

Calc/Plot Detection Limits

Plot DLs on Master Apport Plot

Doug Day, X, Y (Day et al. 2023, *In Prep*; doi: TBD)

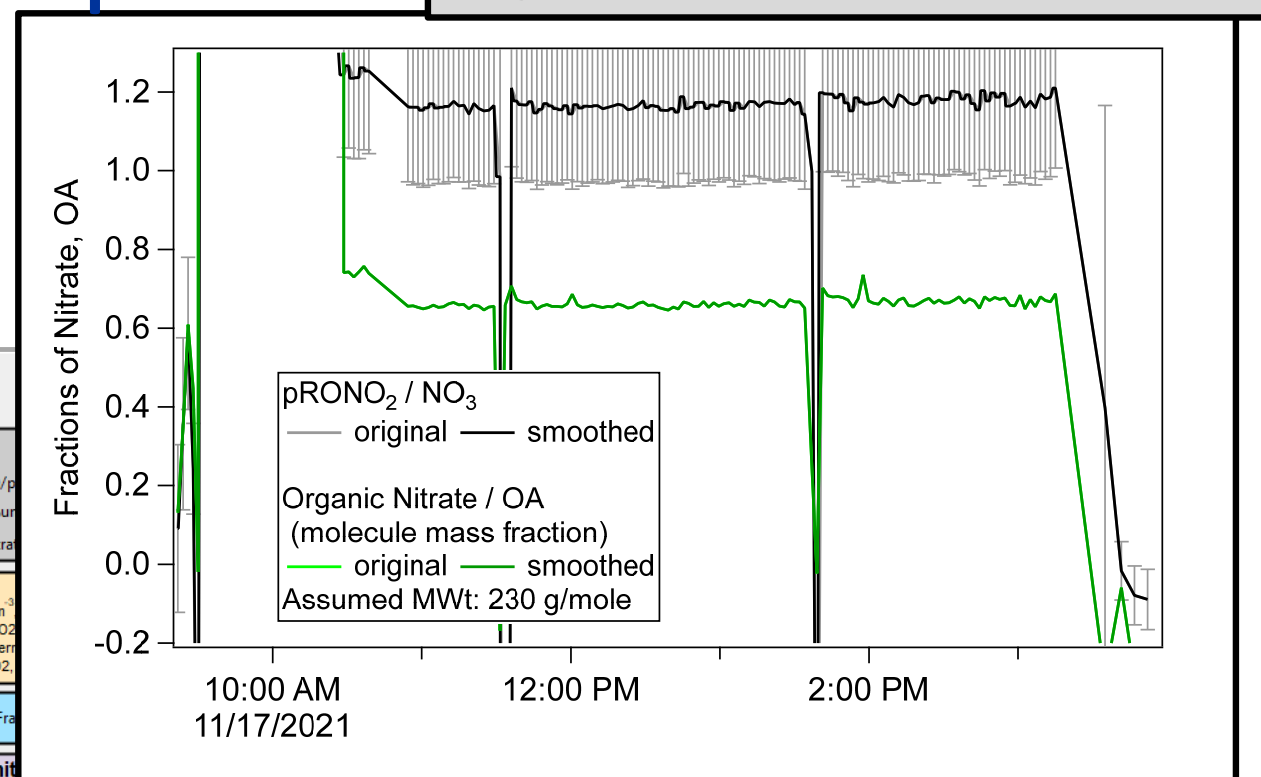
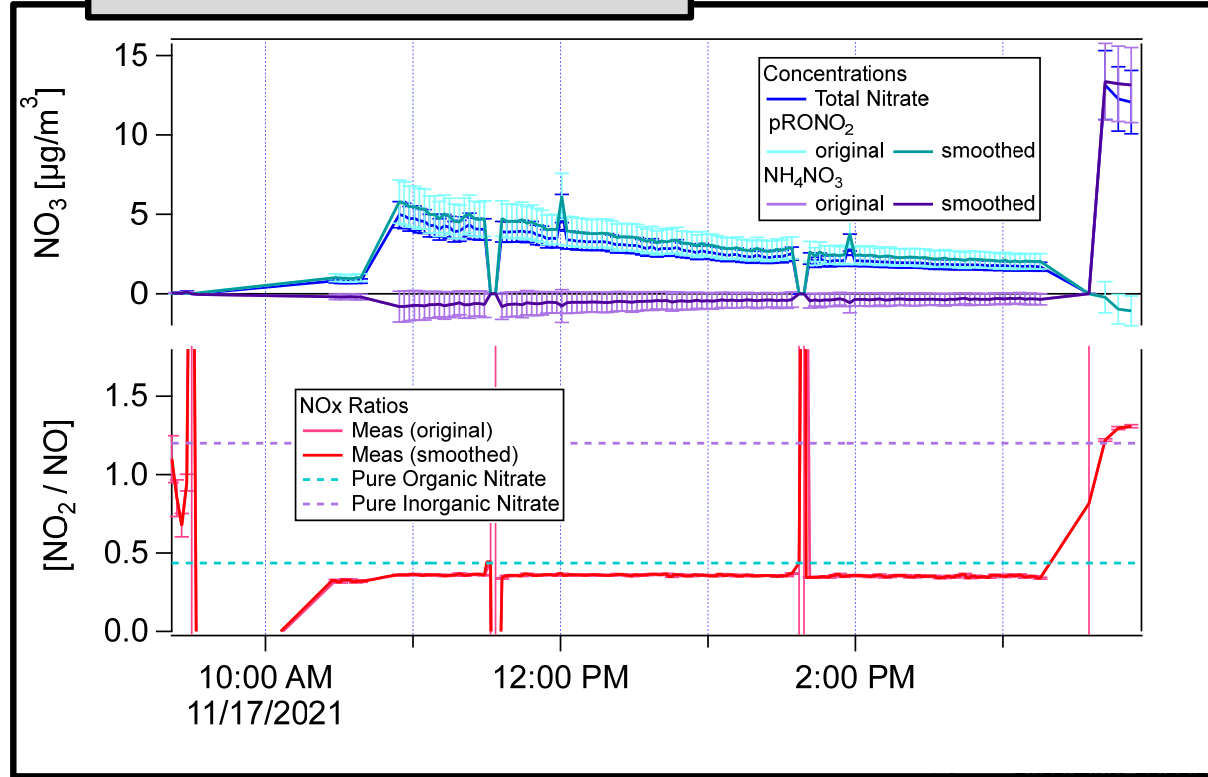
Software Version 0 (12 Sept 2023)



Nitrate Apportionment + Uncertainties + DLs

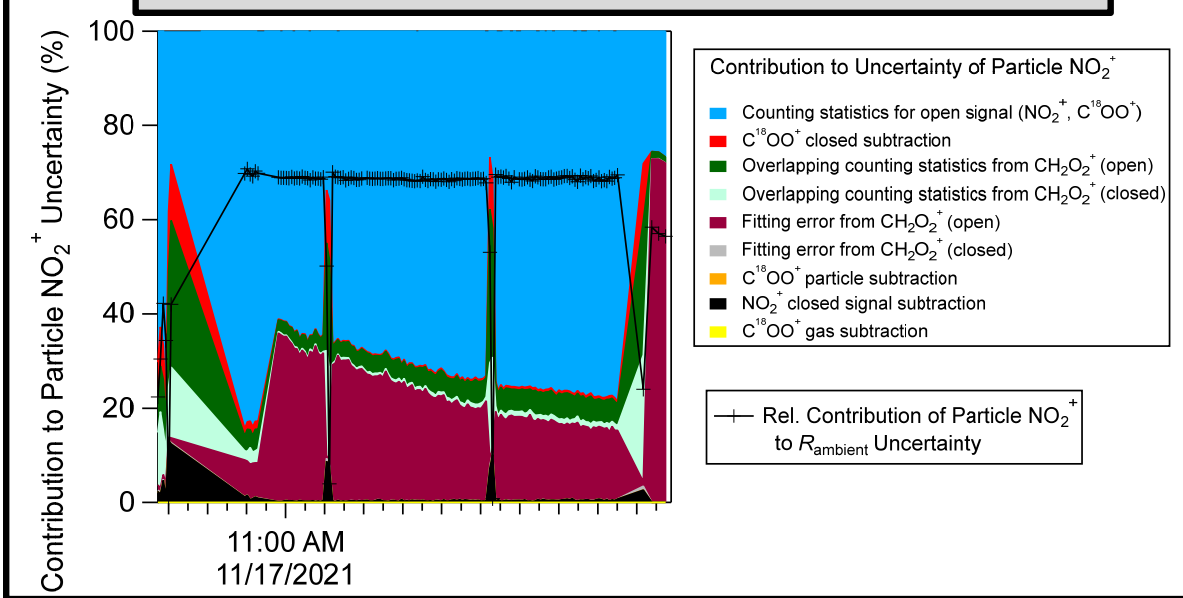
ANTS output

Organic Nitrate Contributions to OA



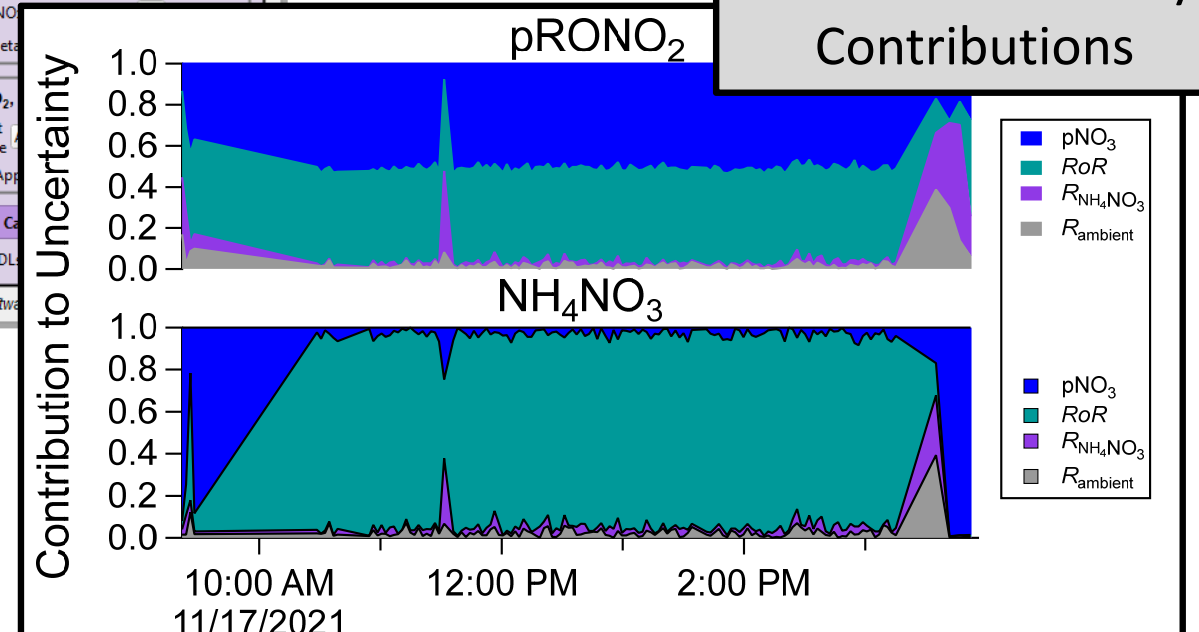
ANTS interface showing parameters: RoR 2.73, RNH4NO3 0.9, pCO/p, %uncert 15, %uncert 5, MWt Org Nitrate. Includes a list of waves required in the root folder for Apportionment and Uncert/DLs.

NO_x⁺, R_{ambient} Uncertainty Contributions

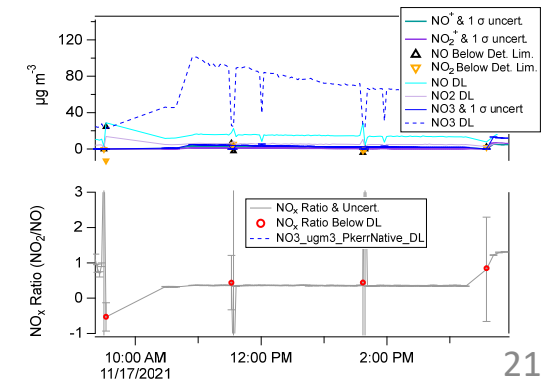
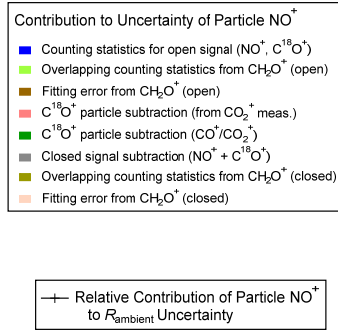
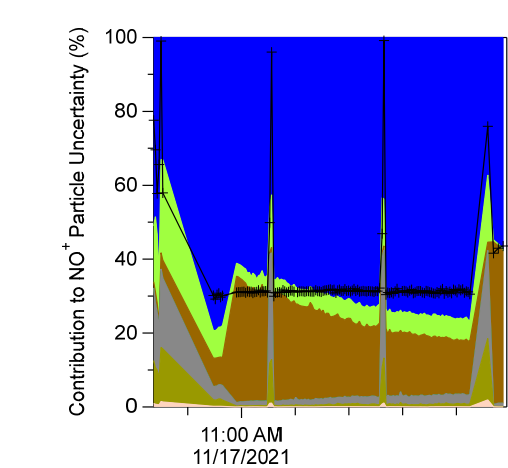
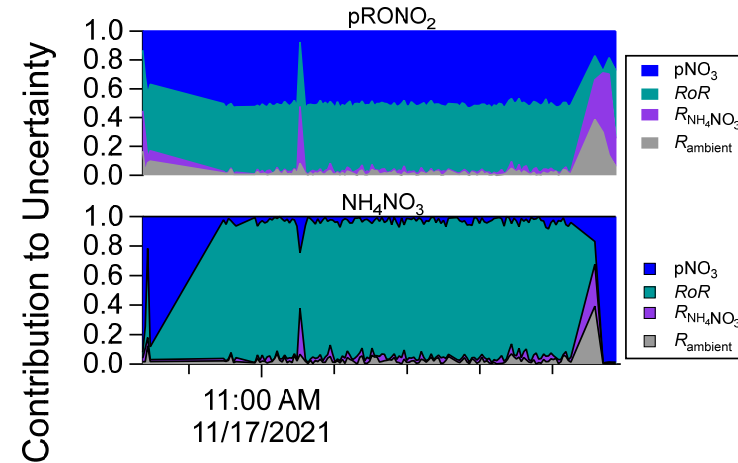
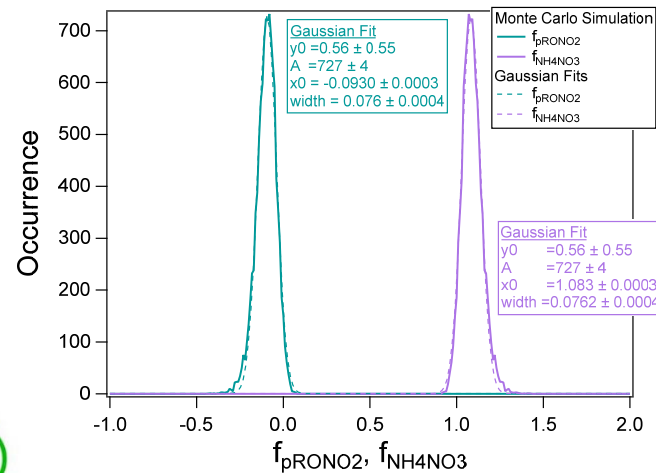
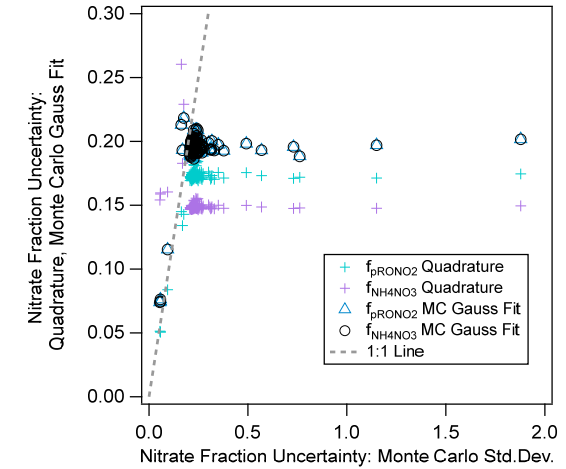
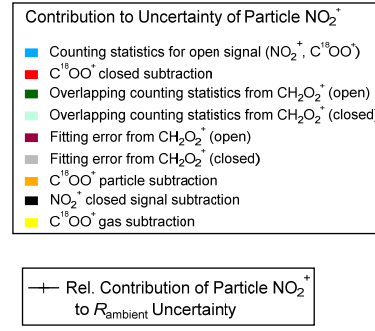
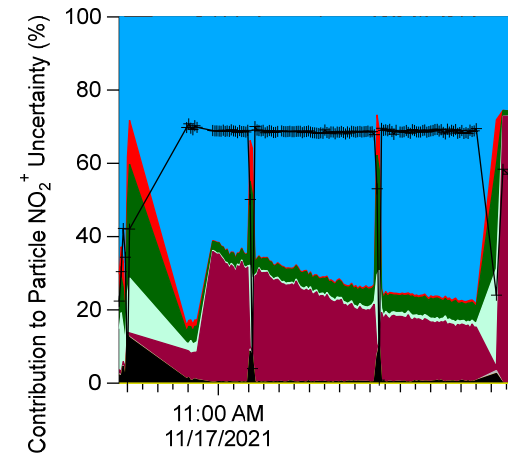
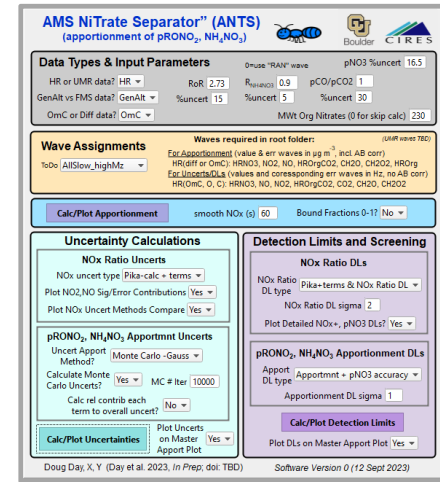
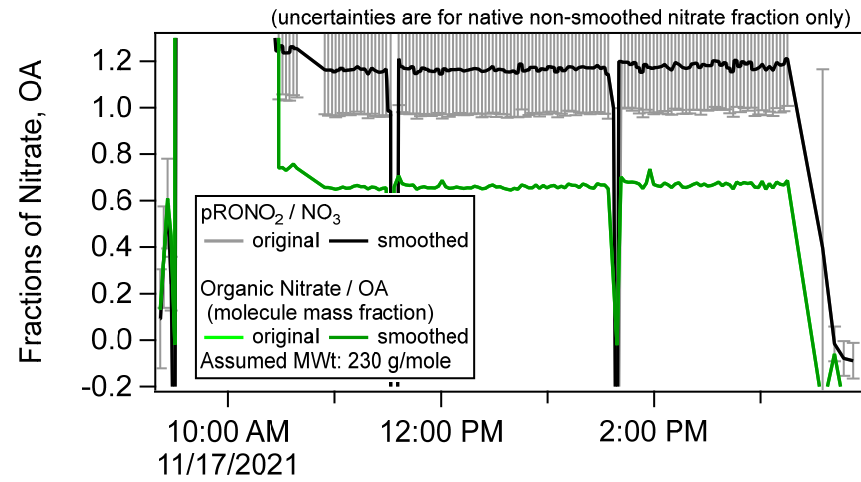
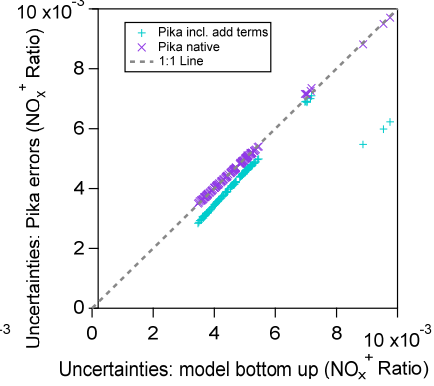
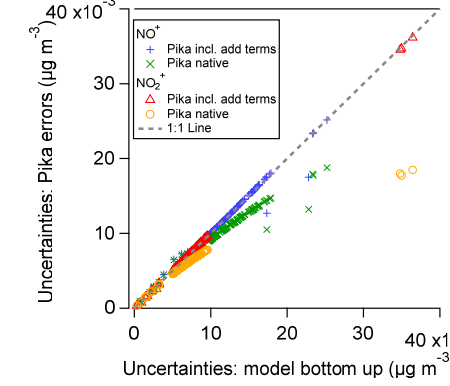
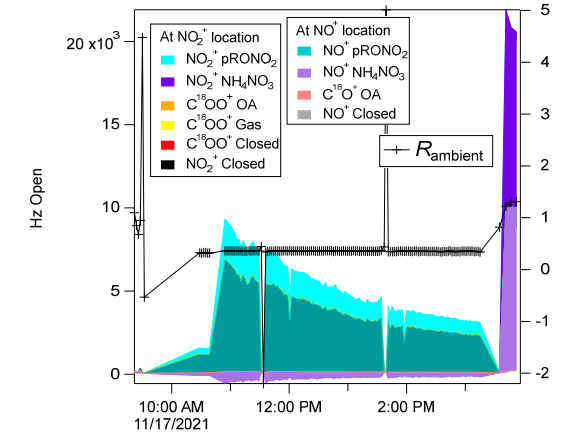
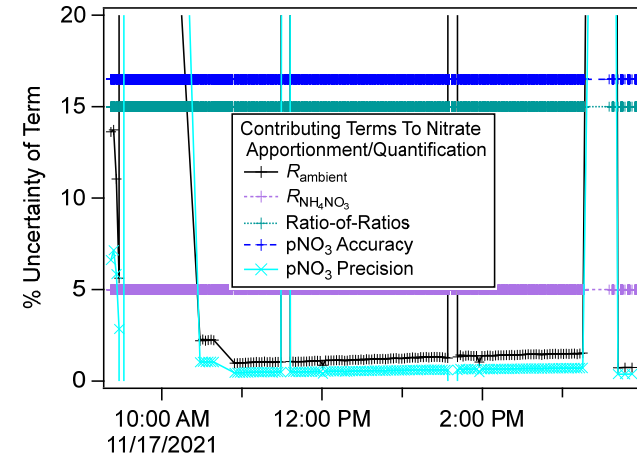
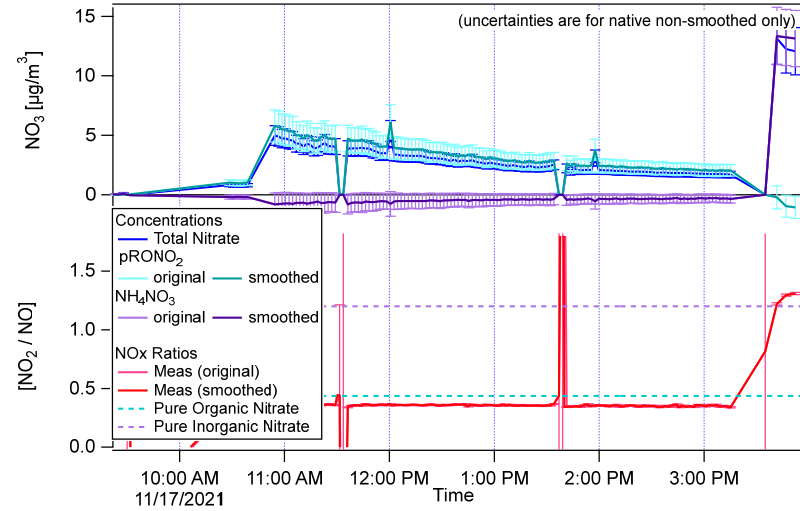


ANTS interface showing NOx Ratio Uncerts and Apportionment Uncerts settings, including MC # Iter 10000 and Plot Uncerts on Master Apport Plot.

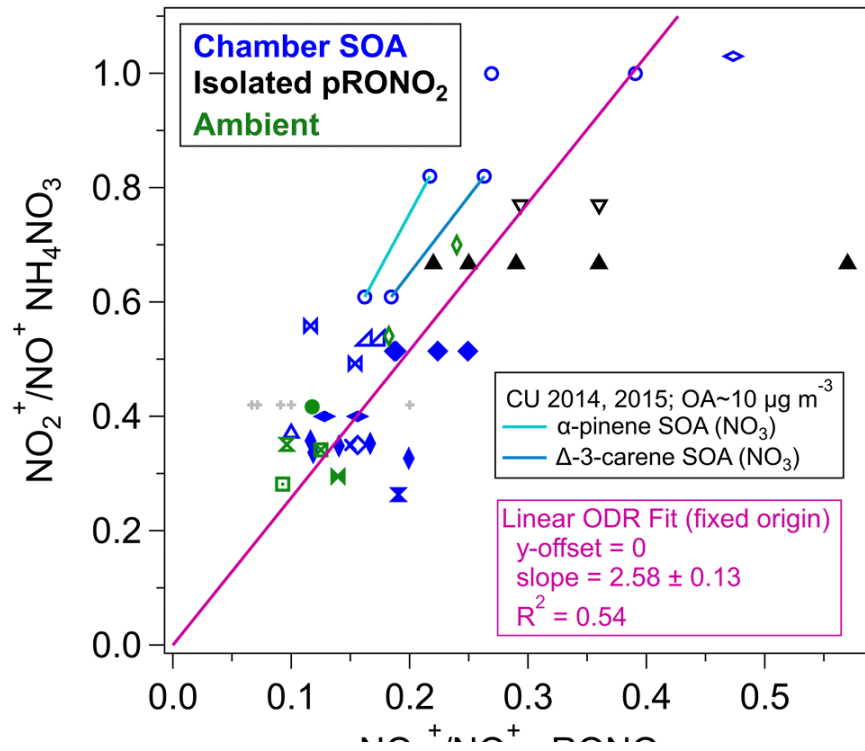
Overall Uncertainty Contributions



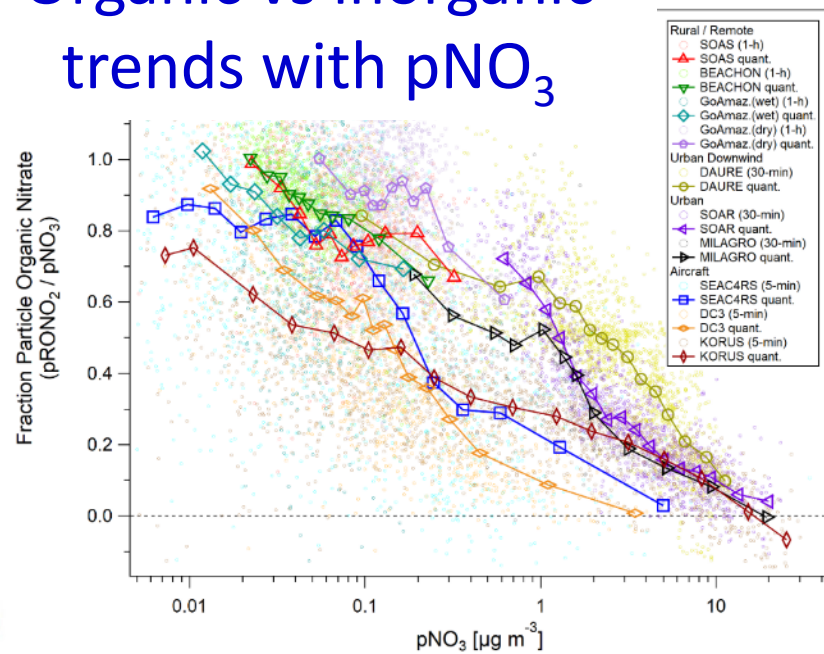
ANTS output



R_{pRONO_2} tracks $R_{NH_4NO_3}$ (NO_x^+ Ratio-of-Ratios, RoR)



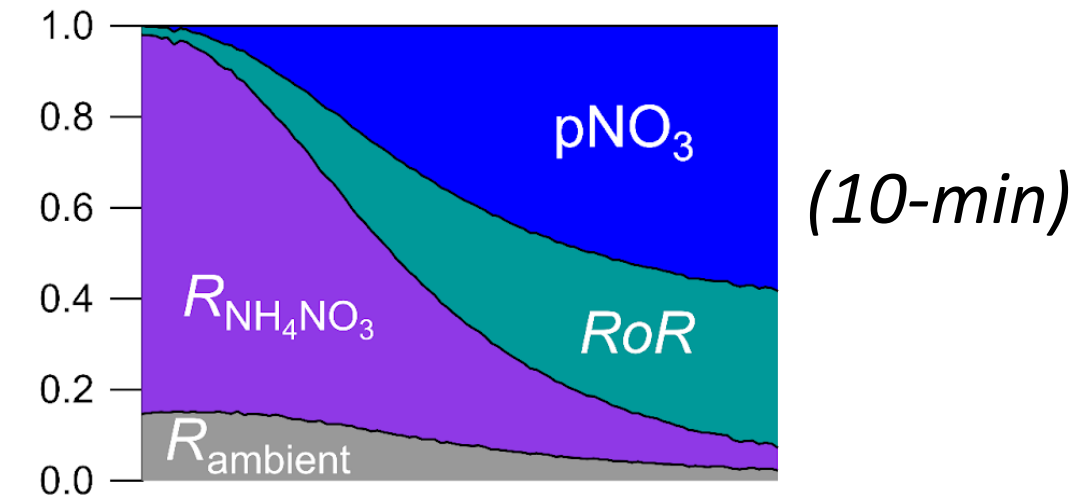
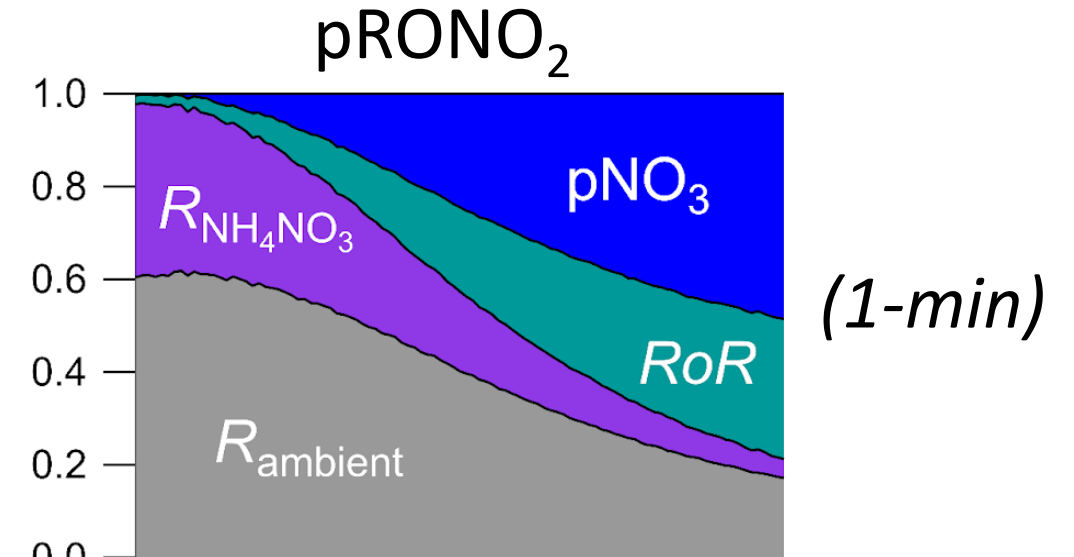
Organic vs inorganic trends with pNO₃



Strong dependencies of uncertainties & contributions to uncertainties with composition, averaging

paper on uncertainties + software coming soon

Overview



AMS NiTrate Separator[®] (ANTS) (apportionment of pRONO₂, NH₄NO₃)

Data Types & Input Parameters: HR or UMR data? HR; GenAlt vs FMS data? GenAlt; OmC or Diff data? OmC; pNO3 %uncert: 16.5; RoR: 2.73; R_{NH4NO3}: 0.9; %uncert: 15; %uncert: 5; %uncert: 30; MWT Org Nitrates: 230

Wave Assignments: Waves required in root folder: HR(diff or OmC): HRNO3, NO2, NO, HROrgCO2, CH2O, CH2O2, HROrg; For Uncerts/DLs (values and corresponding err waves in Hz, no AB corr): HR(OmC, O, C): HRNO3, NO, NO2, HROrgCO2, CO2, CH2O, CH2O2

Uncertainty Calculations: NOx Ratio Uncerts: NOx uncert type: Pika-calc + terms; Plot NO2, NO Sig/Error Contributions: Yes; Plot NOx Uncert Methods Compare: Yes; pRONO₂, NH₄NO₃ Apportmt Uncerts: Uncert Apport Method?: Monte Carlo -Gauss; Calculate Monte Carlo Uncerts?: Yes; MC # Iter: 10000; Calc rel contrib each term to overall uncert?: No

Detection Limits and Screening: NOx Ratio DLs: NOx Ratio DL type: Pika+terms & NOx Ratio DL; NOx Ratio DL sigma: 2; Plot Detailed NOx+, pNO3 DLs?: Yes; pRONO₂, NH₄NO₃ Apportionment DLs: Apport DL type: Apportmt + pNO3 accuracy; Apportionment DL sigma: 1

Buttons: Calc/Plot Apportionment, Calc/Plot Uncertainties, Calc/Plot Detection Limits

Doug Day, X, Y. (Day et al. 2023, In Prep, doi: TBD) Software Version 0 (12 Sept 2023)

Easy-to-use software tool for computing and exploring:

- apportionment
- uncertainties
- detection limits