



# Introducing AMATI, a New Tool for Rapid **Aerosol Thermodynamic Calculations on Large Field Datasets**

taken as is by AMATI, total computing time was 85 s..

Aerosol Water including OA kappa Aerosol Water Fraction Aerosol Water Fraction including



<u>P Campuzano Jost<sup>1,2</sup>, DT Sueper<sup>1,3</sup>, S Clegg<sup>4</sup>, BA Nault<sup>3</sup>, Hongyu Guo<sup>1,2</sup>, JL Jimenez<sup>1,2</sup>, </u> <sup>1</sup>CIRES, University of Colorado, Boulder, <sup>2</sup>Department of Chemistry, CU, Boulder, <sup>3</sup>Aerodyne Research,, <sup>4D</sup> Department of Chemistry, University of East Anglia

### INTRODUCTION



• As several recently published reviews have highlighted (Pye et al, 2020, Tilgner et al, 2021), many studies over the past decade have shown the importance of aerosol acidity in controlling many atmospheric processes, involving both organic and inorganic chemistries.

- However, direct measurements of aerosol acidity outside the laboratory are still rare. Instead, thermodynamic models are used to infer a measure of acidity, aerosol pH from gas + particle phase field data.
- These models tend to be complex and many have not been designed / implemented originally with field data in mind, hence the barrier of entry to their effective (and error-free) use is high.
- Hence outside of some specific regions of high interest (such as Eastern China), there are fairly limited reports on aerosol acidity from field

## **AMATI PANEL DESCRIPTION AND RESULTS**

AMATI (AMbient Aerosol Thermodynamic calculator in Igor) is a software package for the Igor Pro analysis software designed to run a standalone version of the Extended Aerosol Inorganics Model (E-AIM) on large ambient datasets. Its main objective is the computation of aerosol water and pH. It is optimized for Aerodyne AMS data + CIMS gas inputs, but can take other inputs (e.g total nitrate and ammonium measurements from mist chamber IC instruments). It provides a variety of diagnostics and can explore the sensitivity to different inputs by an iterative approach

### Example of AMS, soluble gases and Met input



Main results: pH and Liquid Water

#### Current version of the Igor Panel

AMbient Aerosol Thermodynamic calculator in Igor v. 0.9 step 1. Data prep Step 2. Run EAIM v. 0.9 Step 1. Da		AMATI Panel
v. 0.9         step 1. Data prep         step 1. Data prep <t< th=""><th>Iynamic calculator in Igor EAIM web site</th><th>AMbient Aerosol Thermodynamic calculator in Igor</th></t<>	Iynamic calculator in Igor EAIM web site	AMbient Aerosol Thermodynamic calculator in Igor
NO3 [ug sm3] HRNO3_CE   NO3 [ug sm3] HRNO3_CE   SO4 [ug sm3] HRNO4_CE   VI [ug sm3] HRChI_CE   Plus particle inputs and settings   H2SO4 [pptv] _none_   H2SO4 [pptv] _none_   Measurement is total gas+particle   HCI [pptv] _none_   Measurement is total gas+particle   Measurement is total gas+particle   HCI [pptv] _none_   Measurement is total gas+particle	v. 0.9	Step 1. Data prep Step 2. Run EAIM V. 0.9
t:EAIM:Inputs: Create default <ul> <li>Relative humidity [%] RH</li> <li>Relative humidity [%] RH</li> </ul> 2a. Folder containing the EAIM input root:EAIM:Inputs:   2b. Folder to contain the EAIM results root:EAIM:FullGas: 2c. Meteorological inputs in standard units Temperature [K] Temp_K Relative humidity [0.1 - 0.99] RH_fract 2d. Chemical inputs in moles NO3 [ug sm3] HRN03_CE S04 [ug sm3] HRS04_CE S04 [ug sm3] HRChI_CE I us particle inputs and settings Cl [ug sm3] HRChI_CE Plus particle inputs and settings H2S04 [pptv] _none_ Measurement is total gas+particle HCI [pptv] _none_ Measurement is total gas+particle Enable partitioning to the gas phase HCI [pptv] _none_ Qe. Model options Gas formation flag wave GasFormOption Retastable [solid formation disallowed) flag wave metastableFlag Retastable [solid formation disallowed] flag wave metastableFlag Retastable [solid formation disallowed]	ot:FinalData:	Inputs generated from Step 1, do not allow the user to make selections
<ul> <li>Relative humidity [%] RH</li> <li>Relative humidity [%] RH</li> <li>NO3 [ug sm3] HRNO3_CE</li> <li>SO4 [ug sm3] HRSO4_CE</li> <li>SO4 [ug sm3] HRSO4_CE</li> <li>Cl [ug sm3] HRChI_CE</li> <li>Cl [ug sm3] HRChI_CE</li> <li>Plus particle inputs and settings</li> <li>H2SO4 [pptv] _none_</li> <li>Measurement is total gas+particle</li> <li>Enable partitioning to the gas phase</li> <li>HCI [pptv] _none_</li> <li>Weasurement is total gas+particle</li> <li>Enable partitioning to the gas phase</li> <li>HCI [pptv] _none_</li> <li>Measurement is total gas+particle</li> <li>Measurement is total gas+particle</li> <li>Measurement is total gas+particle</li> <li>Measurement is total gas+particle</li> <li>Weasurement is total gas+particle</li> <li>Measurement is total gas+particle</li> <li>Wetastable (solid formation disallowed) flag wave metastableFlag</li> <li>Metastable (solid formation disallowed) flag wave metastableFlag</li> </ul>	t:EAIM:Inputs:	2a. Folder containing the EAIM input root:EAIM:Inputs:
<ul> <li>NO3 [ug sm3] HRNO3_CE</li> <li>SO4 [ug sm3] HRSO4_CE</li> <li>Cl [ug sm3] HRChI_CE</li> <li>HCI [ug sm3] HRChI_CE</li></ul>	Relative humidity [%] RH	2b. Folder to contain the EAIM results root:EAIM:FullGas:
SO4 [ug sm3] HRSO4_CE       Implement of the gas phase         Cl [ug sm3] HRChI_CE       Implement of the gas phase         plus particle inputs and settings       Implement of the gas phase         H2SO4 [pptv] _none       Implement of the gas phase         Measurement is total gas+particle       Implement of the gas phase         HCl [pptv] _none       Implement of the gas phase         HCl [pptv] _none       Implement of the gas phase         Measurement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Implement is total gas+particle       Implement of the gas phase         Impl	NO3 (ug sm3) HRNO3_CE 👻	2d. Chemical inputs in moles
plus particle inputs and settings   H2SO4 [pptv]none   Measurement is total gas+particle   Enable partitioning to the gas phase   HCI [pptv]none   Measurement is total gas+particle   Weasurement is total gas+particle   Measurement is total gas+particle   Metastable (solid formation disallowed) flag wave metastableFlag	SO4 [ug sm3] HRSO4_CE  CI [ug sm3] HRChI_CE	NH4+ [moles] mNH4 VOS- [moles] mNO3 Na+ [moles] mNa SO4 [moles] mSO4
H2S04 [pptv] _none_  Measurement is total gas+particle HCI [pptv] _none_  Measurement is total gas+particle Tenable partitioning to the gas phase HCI [pptv] _none_  Measurement is total gas+particle Tenable partitioning to the gas phase HCI [ptv] _none_  Measurement is total gas+particle Tenable partitioning to the gas phase	plus particle inputs and settings	H+ [moles] mH  CI- [moles] mCI
Enable partitioning to the gas phase	H2SO4 (pptv] _none_ Measurement is total gas+particle Enable partitioning to the gas phase HCI (pptv] _none_ Measurement is total gas+particle	OH-, moles mOH NH3 (gas phase), [moles] mNH3 v 2e. Model options Gas formation flag wave GasFormOption v
· Validate options lable of inputs Career to run.	Enable partitioning to the gas phase	Metastable (solid formation disallowed) flag wave metastableFlag  Validate options Table of inputs Career to game Debug (print every xth

datasets

#### Cartoon from the Tilgner et al (2021) review showing the many atmospheric processes that are influenced by particle acidity

However, as Nault et al (2021) recently showed, global models do not represent acidity well, so increasing the breadth of observations in both space and time would provide muchneeded constraints on both global and regional processes. Based on our past work using the Extended Aerosol Inorganic Model (E-AIM) (Clegg et al, 1998; Wexler and Clegg, 2002; Friese and Ebel, 2010) to infer acidity in 10 field datasets, this poster presents our development work on a new, user-friendly tool to run E-AIM on field datasets, with a strong focus on users of the Aerodyne Aerosol Mass Spectrometer (Canagaratna et al, 2007).

#### **Design Goals**

- Provide an easy way to run E-AIM inside Igor Pro (Wavemetrics, Lake Oswego, OR) that does not require any Fortran knowledge to process large datasets
- Provide a simplified set of E-AIM defaults geared towards calculating realistic pH and aerosol liquid water in ambient aerosol over a wide range of temperatures
- Provide a framework to explore the sensitivity to one input parameter iteratively. This can also then be used, as shown by Guo et al (2016) and Nault et al (2021), to model field datasets where one critical input is missing (e.g. ammonia) Allow expert users full access to all model options if needed
- Optimized for speed)

### **BUILD-IN FAST ITERATIVE ALGORITHM FOR MISSING INPUTS / SENSITIVITY ANALYSIS**

#### Iterative approach to sensitivity analysis

The highly non-linear nature of thermodynamic models makes evaluation of input errors challenging. One simple approach to this problem is to do iterative sensitivity analysis on a single input parameter while keeping all others constant. AMATI provides this as a standard feature. The model is run till a convergence criterion (by default a stable pH in the model, but this can be changed) is met. By iterating on a case by case basis, not only is computational time saved but a consistent convergence criteria can be applied to every case.







Current (pre-release) version of the AMATI panel, showing the input panel for measurements, the editable and consistency checked E-AIM model input in the second panel and the buttons to both run the model and Inputs used to calculate the pH and aerosol water plots shown below, taken during the FIREX-AQ campaign on the explore iteratively the sensitivity to a particular input (see section to the left of this one) NASA DC-8 flying over the LA Basin on Sep 5th, 2019, recorded at 1 Hz (about 9000 individual points). These were

Mhient Aerosol Ther

#### Standard diagnostics to assess model output



Main Output of AMATI, for a test data set from the NASA FIREX-AQ mission (inputs shown below) (top left): Timeseries of pH (as in the more commonly reported molarity based pH, pH\_f), both all points and the ones screened by AMATI for highest model trustworthness (which for aircraft datasets such as this one can be a large fraction) (top right) Correlation of pH\_f vs the activity based pH, which is also calculated (bottom left) Timeseries of the inorganic aerosol water output from E-AIM Organic water (based on a simple O/C of OA parametrization of kappa) is included as well (bottom right): Total vs inorganic only liquid water, colored by dry OA fraction in the aerosol

A diagnostics plot provide by AMATI, showing the partitioning of nitrate between the aerosol and gas phase in the measurements and in the model for the test dataset shown above. Note that while overall the concentrations agree, the partitioning ratio epsilon (particulate/total nitrate ratio) is poorly correlated. The model sensitivity was explored further by iterative approaches (see left panel), and it was found that modest adjustments to the ammonia concentration within instrumental uncertainties greatly improved the overall measurement/model agreement.

COMPARISONS WITH ISORROPIA (WINTER CAMPAIGN)

Exploration of the NH3 sensitivity for the FIREX-AQ LA test dataset shown in the main panel. After 500 iterations adjusting NH3, the model gets the nitrate partitioning almost spot on (black points show 60 points that did not converge after 500 iterations), while the change in ammonia is overall still within the measurement uncertainties, hence the rather poor partitioning in the model run with straight inputs is not indicative of any major problems with the model.

### Estimating pH when inputs are missing

In addition to its usefulness for sensitivity analysis, the by far most important application for ambient datasets of the iterative approach is to still be able to run a thermodynamic model when data is missing (e.g. typically one of the gas inputs, ammonia or nitric acid). While this approach has its limitations, it does greatly expands the number of datasets that can potentially be analyzed with AMATI, since a full gas suite of measurements is often not available.



The ISORROPIA model (Fountoukis and Nenes, 2007) has often been used in the past for field datasets (e.g. Guo et al, 2015), in part due to its lower computing requirements compared to E-AIM. Furthermore, Guo et al (2016) pioneered the use of an iterative approach to approximate unmeasured ammonia to derive pH and used this for the data from the NSF WINTER campaign (see section on iterative approach for details). Here we show a comparison of the output of AMATI with the ISORROPIA-II data in Guo et al, (2016). Note that different thermodynamic models are not supposed to agree perfectly (see e.g. Pye et al, 2020 for an extended discussion), and hence these are provided mostly as a consistency check

#### pH Output Comparison



The ISORROPIA model (Fountoukis and Nenes, 2007) has often been used in the past for field datasets (e.g. Guo et al 2015), in part due to its lower computing requirements compared to E-AIM. Furthermore, Guo et al (2016) pioneered the use of an iterative approach to approximate unmeasured ammonia to derive pH and used this for the data from the NSF WINTER campaign. A comparison of the output of AMATI with the ISORROPIA-II data in Guo et al, (2016).

#### **Convergence behavior AMATI vs ISORROPIA**



(left) pH convergence of AMATI/EAIM for the WINTER dataset, showing a very consistent convergence behavior. (right) Average WINTER pH in ISORROPIA after a higher number of iterations, showing clear runaway behavior that requires additional constrains (Ibunkule et al, 2020). The reasons for the more consistent EAIM behavior (also observed for other datasets) is still under investigation, but is like related to (a) the exclusion of OH in the configuration used and (b) the higher fidelity and complexity of the E-AIM model.

#### Comparison of model outputs for volatile species







Example of typical convergence behaviour for the (missing) ammonia concentration for subset of the NASA KORUS-AQ dataset. The spikes are caused by numerical noise close to the neutralization point but converge fairly quickly afterwards (see also ISORROPIA comparison)

From Ibikunle et al, 2020: Sensitivity of pH to different gas inputs depending on total inorganic mass/total water contents as calculated by ISORROPIA. If e.g. ammonia measurements are missing, an iterative approach can be used to get consistent thermodynamic model output for moderately to very acidic conditions, but it will be underconstrained for near neutral conditions. Likewise, if nitric acid measurements are missing, an iterative approach will work wery well at near neutral conditions and rather poorly at very acidic conditions.

#### Acknowledg

ements This work has been supported by NASA thru grants NNX15AH33A, 80NSSC19K0124 and 80NSSC21K1342

#### References Pye et al, ACP., 20, 4809–4888, 2020; Tilgner et al, ACP, 21, 13483–13536, 2021. Nault et al, Comm Earth & Env, 2, 1–13, 2021; Wexler and Clegg JGR. 107, No. D14, art. no. 4207, 2002; Clegg, et al: JPCA 102, 2137-2154, 1988; Friese and Ebel. JPC A, 114, 11595-11631. 2010; Clegg and Seinfeld JPCA 110, 5692-5717, 2006; Clegg and Seinfeld, JPCA 110, 5718-5734, 2006; Canagaratna et al, Mass Spectrom. Rev., 26, 185–222, 2007. Guo, et al, ACP, 15, 5211–5228, 2015. Guo, et al, JGR D., 121, 500, 2016; Ibikunle et al ACPD, https://doi.org/10.5194/acp-2020-501, 2020. Fountoukis, et al ACP., 7: 4639-59, 2007

# Summary and Outlook

- AMATI is intended to provide a simplified access to the E-AIM model (not unlike the E-AIM website) for researchers interested in applying it to large datasets. It requires Igor Pro running on a Windows PC.
- The implementation of the AMATI input panel and the iterative model run framework is largely concluded, work on more extended and user friendly diagnostics is ongoing.
- The use of parallelization is currently being explored. While AMATI performance for typical ground campaign datasets (e.g. 20k points) is fast (less than 3 min for full inputs, 10-200 min in iterative mode, depending on the type of data), for larger datasets (aircraft/multiyear ground) parallelization would have a clear benefit.
- AMATI is currently in early beta stage with a general release targeted for Fall 2022. If you are interested in using AMATI before that and would like to help us test it, please contact us.
- While not intended for the initial release next year, AMATI has the capability built in to model mixed organic/inorganic systems (Clegg and Seinfeld, 2006a and b). An implantation of AMATI where the concentrations of different PMF Factors can be assigned to specific model compounds (e.g. oxalate for LOOOA) is both possible and planned.