1 Heterogeneity and chemical reactivity of the remote troposphere defined by aircraft

2 measurements - Corrected

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Abstract. The NASA Atmospheric Tomography (ATom) mission built a photochemical 43 44 climatology of air parcels based on in situ measurements with the NASA DC-8 aircraft along objectively planned profiling transects through the middle of the Pacific and 45 46 Atlantic oceans. In this paper we present and analyze a data set of 10 s (2 km) merged and gap-filled observations of the key reactive species driving the chemical budgets of O_3 47 and CH₄ (O₃, CH₄, CO, H₂O, HCHO, H₂O₂, CH₃OOH, C₂H₆, higher alkanes, alkenes, 48 aromatics, NO₃, HNO₃, HNO₄, peroxyacetyl nitrate, other organic nitrates), consisting of 49 50 146,494 distinct air parcels from ATom deployments 1 through 4. Six models calculated the O_3 and CH_4 photochemical tendencies from this modeling data stream for ATom 1. 51 52 We find that 80 % – 90 % of the total reactivity lies in the top 50 % of the parcels; and 25 % - 35 %, in the top 10 %, supporting previous model-only studies that tropospheric 53 chemistry is driven by a fraction of all the air. Surprisingly, the probability densities of 54 species and reactivities averaged on a model scale (100 km) differ only slightly from the 55 56 2 km ATom 10 s data, indicating that much of the heterogeneity in tropospheric 57 chemistry can be captured with current global chemistry models. Comparing the ATom reactivities over the tropical oceans with climatological statistics from six global 58 59 chemistry models, we find generally good agreement with the reactivity rates for O_3 and CH₄. Models distinctly underestimate O₃ production below 2 km relative to the mid-60 troposphere, and this can be traced to lower NO_X levels than observed. Attaching 61 62 photochemical reactivities to measurements of chemical species allows for a richer, yet more constrained-to-what-matters, set of metrics for model evaluation. 63

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65 **Preface.** This paper presents a corrected version of the paper published under the same 66 authors and title (sans 'Corrected') as https://doi.org/10.5194/acp-21-13729-2021. While 67 68 continuing our analysis of the ATom data we found several major mistakes or decision errors. The main conclusions were unchanged except those regarding production of O_3 , 69 but most of the numbers and many of the figures changed slightly. A corrigendum to the 70 71 original 2021 paper was prepared, but the changes were extensive enough so that the ACP editors and the authors decided that a completely new paper should be produced and 72 the 2021 paper withdrawn. The errors that were corrected are described in this preface 73 74 and discussed at most briefly in the paper. First, we found that measurement errors in 75 PAN and HNO₄ were large (\sim 100 ppt), and when this occurred in the lower troposphere, the rapid thermal decomposition released large amounts of NOx. There is no easy fix for 76 77 this, and we developed a new protocol (RDS*) for computing reactivities by allowing the species to thermally decompose before use in the model, as described below. This fix 78 79 greatly reduced O_3 production (P-O3) in the lower troposphere. A second NOx problem involved the propagation of polluted profiles from the Los Angeles basin to gap filling 80 over the tropical eastern Pacific. This correction resulted in the update of the Modeling 81 Data Stream to version 2b. These NOx errors cause noticeable changes in reactivities, 82 especially P-O3. Other decision errors led us to decrease the southern latitude extent of 83 the Atlantic and Pacific transects from 54° S to 53° S to avoid spurious parcels being 84 included. Also, cosine of latitude weighting was applied to data for all figures and tables. 85 The UCI model now includes all higher alkanes and alkenes in the ATom data as C_3H_8 86 87 and C₂H₄, respectively. These last three decision errors had detectable but small impacts. 88

89 The most worrisome error was the evolution of the UCI CTM model's ATom version 90 from its use in the MDS-0 results shown here to the final calculations with MDS-2 as the UCI2* model in the 2021 paper. The first MDS-0 UCI model was taken directly from 91 92 the main CTM code line and developed for Prather et al. (2017; 2018) by Xin Zhu (not on the 2021 paper). This model was then further adapted and developed for the 2021 paper 93 94 and for additional complex sensitivity tests. At this stage (i.e., the UCI2* simulations in 95 the 2021 paper), the results failed several logic tests and were irreproducible. With the 96 decision to withdraw the paper, we returned to the MDS-0 UCI model, and Xin Zhu 97 adapted it to more efficient ATom runs as well as adding several new diagnostics and 98 checks to ascertain the ATom runs were being calculated correctly. As noted in the paper below, we carefully checked the O₃ budget in terms of rates and tendencies, and these are 99 now consistent in model UCIZ. Further, the sensitivity coefficients $(\partial ln R / \partial ln X$ and 100 $\partial^2 \ln R / \partial \ln X \partial \ln Y$ calculated for a subsequent paper are now closer to theoretical 101

- expectations for a quasi-linear system. The UCIZ* model results here are our best, 102 revised estimate of the ATom reactivities.
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1 Prologue 106

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108 This paper is based on the methods and results of papers that established an approach for analyzing aircraft measurements, specifically the NASA Atmospheric Tomography 109 Mission (ATom), with global chemistry models. Here we present a brief overview of 110 those papers to help the reader understand the basis for this paper. The first ATom 111 modeling paper ("Global atmospheric chemistry – which air matters", Prather et al., 2017, 112 hence P2017) gathered six global models, both chemistry-transport models (CTMs) and 113 114 chemistry-climate models (CCMs). The models reported a single-day snapshot for mid-August (the time of the first ATom deployment, ATom-1), and these included all species 115 relevant for tropospheric chemistry and the 24 h reactivities. We limited our study to 116 three reactivities (Rs) controlling methane (CH_4) and tropospheric ozone (O_3) using 117 specific reaction rates to define the loss of CH₄ and the production and loss of O₃ in parts 118 per billion (ppb) per day. The critical photolysis rates (J values) were also reported as 24 119 h averages.

120 121 $CH_4 + OH \rightarrow CH_3 + H_2O$ (1)122 L-CH4: 123 (2a) 124 P-O3: $HO_2 + NO \rightarrow NO_2 + RO$ $RO_2 + NO \rightarrow NO_2 + RO$ 125 (2b) where NO₂ + $hv \rightarrow$ NO + O and O + O₂ \rightarrow O₃ 126 (2c) 127 $O_2 + hv \rightarrow O + O (x 2)$ (2d) 128 L-03: $O_3 + OH \rightarrow O_2 + HO_2$ 129 (3a) $O_3 + HO_2 \rightarrow HO + O_2 + O_2$ 130 (3b) $O(^{1}D) + H_{2}O \rightarrow OH + OH$ 131 (3c)132 $O_3 + hv \rightarrow O(^1D) + O_2$ 133 J-01D: (4) 134

J-NO2:

$NO_2 + hv \rightarrow NO + O$

(5)

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138 Models also reported the change in O_3 over 24 h, and these match the P-O3 minus L-O3 values over the Pacific basin (a focus of this study). The models showed a wide range in 139 the three Rs average profiles across latitudes over the Pacific basin, as well as 2D 140 141 probability densities (PDs) for key species such as NOx (NO + NO₂) versus HOOH. A 142 large part of the model differences was attributed to the large differences found in chemical composition rather than the calculation of rates from that composition. We 143 144 found that single transects from a model through the tropical Pacific at different longitudes produced nearly identical 2D PDs, but these PDs were distinctly different 145 across models. This result supported the premise that the ATom PDs would provide a 146 useful metric for global chemistry models. 147

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In P2017, we established a method for running the chemistry modules in the CTMs and 149 150 CCMs with an imposed chemical composition from aircraft data: the ATom run, or "A 151 run". In the A run, the chemistry of each grid cell does not interact with its neighbors or with externally imposed emission sources. Effectively the CTM/CCM is initialized and 152 run for 24 h without transport, scavenging or emissions. Aerosol chemistry is also turned 153 154 off in the A runs. This method allows each parcel to evolve in response to the daily cycle of photolysis in each model and be assigned a 24 h integrated reactivity. The 155 instantaneous reaction rates at the time an air parcel is measured (e.g., near sunset at the 156 end of a flight) do not reflect that parcel's overall contribution to the CH₄ or O₃ budget; a 157 full diel cycle is needed. The A run assumption that parcels do not mix with neighboring 158 air masses is an approximation, and thus for each model we compared the A runs using 159 160 the model's restart data with a parallel standard 24 h simulation (including transport, scavenging, and emissions). Because the standard grid-cell air moves and mixes, we 161 compared averages over a large region (e.g., tropical Pacific). We find some average 162 biases of order $\pm 10\%$ but general agreement. The largest systematic biases in the A runs 163 are caused by buildup of HOOH (no scavenging) and decay of NOx (no sources). The A 164 runs are relatively easy to code for most CTM/CCMs and allow each model's chemistry 165 module, including photolysis package, to run normally. The A runs do not distinguish 166 between CTMs and CCMs, except that each model will generate/prescribe its own cloud 167 fields and photolysis rates. Our goal is to create a robust understanding of the chemical 168 statistics including the reactivities with which to test and evaluate the free-running 169 CCMs, and thus we do not try to model the specific period of the ATom deployments. 170 Others may use the ATom data with hindcast CTMs to test forecast models, but here we 171 want to build a chemical climatology. 172

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The first hard test of the A runs came with the second ATom modeling paper ("How well can global chemistry models calculate the reactivity of short-lived greenhouse gases in the remote troposphere, knowing the chemical composition", Prather et al., 2018, hence P2018). The UCI CTM simulated an aircraft-like data set of 14,880 air parcels along the International Date Line from a separate high-resolution (0.5°) model. Each parcel is defined by the following core species: H₂O, O₃, NOx, HNO₃, HNO₄, PAN (peroxyacetyl

nitrate), CH₃NO₃, HOOH, CH₃OOH, HCHO, CH₃CHO (acetaldehyde), C₃H₆O (acetone),

CO, CH₄, C₂H₆, alkanes (C₃H₈ and higher), C₂H₄, aromatics (benzene, toluene, xylene) 181 182 and C₅H₈ (isoprene), plus temperature. Short-lived radicals (e.g., OH, HO₂, CH₃OO) were initialized at small concentrations and quickly reached daytime values determined 183 184 by the core species. The six CTM/CCMs overwrote the chemical composition of a restart file, placing each pseudo-observation in a unique grid cell according to its latitude, 185 longitude, and pressure. If another parcel is already in that cell, then it is shifted east-186 west or north-south to a neighboring model cell. For coarse-resolution models, multiple 187 restart files and A runs were used to avoid large location shifts. CTM/CCMs usually 188 have a locked in 24 h integration step starting at 0000 UTC that is extremely difficult to 189 190 modify in order to try to match the local solar time of observation, especially as it changes along aircraft flights. We tested the results with a recoded UCI CTM to start at 191 1200 UTC but retain the same clouds fields over the day and found only percentage-level 192 differences between a midnight or noon start. 193

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These A runs averaged over cloud conditions by simulating 5 d in August at least 5 d 195 apart. Assessment of the modeled photolysis rates and comparison with the ATom-196 197 measured J values is presented in Hall et al. (2018, hence H2018). All models agreed that a small fraction of chemically hot air parcels in the synthetic data set controlled most 198 of the total reactivity. Some models had difficulty in implementing the A runs because 199 200 they overwrote the specified water vapor with the modeled value, but this problem is fixed here. In both P2017 and P2018, the GISS-E2 model stood out with the most 201 unusual chemistry patterns and sometimes illogical correlations. Efforts by a co-author 202 to clarify the GISS results or identify errors in the implementation have not been 203 successful. GISS results are included here for completeness in the set of three papers but 204 are not reconciled. Overall, three models showed remarkable inter-model agreement in 205 206 the three Rs with less than half of the RMSD (root-mean-square difference) as compared with the other models. UCI also tested the effect of different model years (1997 and 207 2015 versus reference year 2016), which varies the cloud cover and photolysis rates, and 208 209 found an inter-year RMSD about half of that of the core model's RMSD. Thus, there is a fundamental uncertainty in this approach due to the inability to specify the 210 cloud/photolysis history seen by a parcel over 24 h, but it is less than the inter-model 211 212 differences among the most similar models.

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214 **2 Introduction**

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216 The NASA Atmospheric Tomography (ATom) mission completed a four-season deployment, each deployment flying from the Arctic to Antarctic and back, traveling 217 south through the middle of the Pacific Ocean, across the Southern Ocean and then north 218 219 through the Atlantic Ocean, with near-constant profiling of the marine troposphere from 0.2 to 12 km altitude (see Fig. S1). The DC8 was equipped with in situ instruments that 220 documented the chemical composition and conditions at time intervals ranging from <1221 to about 100 seconds (Wofsy et al., 2018). ATom measured hundreds of gases and 222 aerosols, providing information on the chemical patterns and reactivity in the vast remote 223 ocean basins, where most of the destruction of tropospheric ozone (O_3) and methane 224 225 (CH₄) occurs. Reactivity is defined here as in P2017 to include the production and loss of O₃ (P-O3 and L-O3, ppb/d) and loss of CH₄ (L-CH4, ppb/d). Here we report on this 226

- 227 model-derived product that was proposed for ATom, the daily averaged reaction rates
- determining the production and loss of O_3 and the loss of CH_4 for 10 s averaged air
- parcels. We calculate these rates with 3D chemical models that include variations in
- clouds and photolysis, and then assemble the statistical patterns describing the
- heterogeneity (i.e., high spatial variability) of these rates and the underlying patterns of
- reactive gases.

Tropospheric O_3 and CH_4 contribute to climate warming and global air pollution (Stocker 233 et al., 2013). Their abundances in the troposphere are controlled largely by tropospheric 234 235 chemical reactions. Thus, chemistry-climate assessments seeking to understand past global change and make future projections for these greenhouse gases have focused on 236 the average tropospheric rates of production and loss and how these reactivities are 237 distributed in large semi-hemispheric zones throughout the troposphere (Griffiths et al., 238 2021; Myhre et al., 2014; Naik et al., 2013; Prather et al., 2001; Stevenson, et al., 2006; 239 Stevenson, et al., 2013; Stevenson, et al., 2020; Voulgarakis et al., 2013; Young et al., 240 2013). The models used in these assessments disagree on these overall CH_4 and O_3 241 reactivities (a.k.a. the budgets), and resolving the cause of such differences is stymied 242 243 because of the large number of processes involved and the resulting highly heterogeneous distribution of chemical species that drive the reactions. Simply put, the models use 244 emissions, photochemistry, and meteorological data to generate the distribution of key 245 species such as nitrogen oxides ($NO_x = NO + NO_2$) and hydrogen peroxide (HOOH) 246 (step 1) and then calculate the CH_4 and O_3 reactivities from these species (step 2). There 247 248 is no single average measurement that can test the verisimilitude of the models. Stratospheric studies such as Douglass et al. (1999) have provided a quantitative basis for 249 250 testing chemistry and transport, and defining model errors; but few of these studies have 251 tackled the problem of modeling the heterogeneity of tropospheric chemistry. The major 252 model differences lie in the first step, because when we specify the mix of key chemical species, most models agree on the CH₄ and O₃ chemical budgets (*P2018*). The intent of 253 254 ATom was to collect an atmospheric sampling of all the key species and the statistics defining their spatial variability, and thus that of the reactivities of CH₄ and O₃. 255

Many studies have explored the ability of chemistry-transport models (CTMs) to resolve 256 finer scales such as pollution layers (Eastham and Jacob, 2017; Rastigejev et al., 2010; 257 Tie et al., 2010; Young et al., 2018; Zhuang et al., 2018), but these have not had the 258 259 chemical observations (statistics) to evaluate model performance. In a great use of chemical statistics, Yu et al. (2016) used 60 s data (~12 km) from the SEAC⁴RS aircraft 260 mission to compare cumulative probability densities (PDs) of NOx, O₃, HCHO and 261 isoprene over the Southeast US with the GEOS-Chem CTM run at different resolutions. 262 They identified clear biases at the high and low ends of the distribution, providing a new 263 264 test of models based on the statistics rather than mean values. Heald et al. (2011) gathered high-resolution profiling of organic and sulfate aerosols from 17 aircraft 265 266 missions and calculated statistics (mean, median, quartiles) but only compared with the modeled means. The HIAPER Pole-to-Pole Observations (HIPPO) aircraft mission 267 (Wofsy, 2011) was a precursor to ATom with regular profiling of the mid-Pacific 268 including high-frequency 10 s sampling that identified the small scales of variability 269 throughout the troposphere. HIPPO measurements were limited in species, lacking O₃, 270 NOx and many of the core species needed for reactivity calculations. ATom, with a full 271

suite of reactive species and profiling through the Atlantic basin, provides a wealth ofchemical statistics that challenge the global chemistry models.

274 One main task here is the assembly of the modeling data stream (MDS), which provides flight-wise continuous 10 s data (air parcels) for the key reactive species. The MDS is 275 based on direct observations and interpolation methods to fill gaps as documented the 276 277 Supplement. Using the version 0 of the MDS, we have six chemical models calculating 278 the 24 h reactivities, producing a reactivity data stream (RDS version 0) using protocols noted in the Prologue (P2017) and described further in Sect. 3.2. There, we describe the 279 280 updated modeling protocol RDS* necessary to address measurement noise in PAN and HNO₄, which can be very short-lived. In Sect. 4, we examine the statistics of reactivity 281 over the Atlantic and Pacific oceans, focusing on air parcels with high reactivity; for 282 example, 10% of the parcels produce 25-35% of total reactivity over the oceans. We 283 compare these ATom-1 statistics, species and reactivities with August climatologies from 284 six global chemistry models. In one surprising result, ATom-1 shows a more reactive 285 tropical troposphere than found in most models' climatologies associated with higher 286 NOx levels than in the models. Section 5 concludes that the ATom PDs based on 10s air 287 parcels do provide a valid chemistry metric for global models with 1° resolution. It also 288 289 presents some examples where ATom measurements and modeling can test the chemical relationships and may address the cause of differences in the O₃ and CH₄ budgets 290 currently seen across the models. With this paper we release the full ATom MDS-2b 291 from all four deployments along with the updated RDS-2b reactivities from the UCI 292 293 model.

294 3 Models and data

295 **3.1 The modeling data stream (MDS)**

296 The ATom mission was designed to collect a multi-species, detailed chemical climatology that documents the spatial patterns of chemical heterogeneity throughout the 297 298 remote troposphere. Figure S1 in the Supplement maps the 48 research flights, and the 299 Supplement has tables summarizing each flight. We required a complete set of key 300 species in each air parcel to initialize the models that calculate the CH_4 and O_3 reactivities. We choose the key reactive species (H₂O, O₃, CO, CH₄, NO_x, NO_xPSS, 301 302 HNO₃, HNO₄, PAN, CH₂O, H₂O₂, CH₃OOH, acetone, acetaldehyde, C₂H₆, C₃H₈, *i*-C₄H₁₀, *n*-C₄H₁₀, alkanes, C₂H₄, alkenes, C₂H₂, C₅H₈, benzene, toluene, xylene, 303 CH₃ONO₂, C₂H₅ONO₂, RONO₂, CH₃OH) directly from the ATom measurements and 304 then add corollary species or other observational data indicative of industrial or biomass 305 burning pollution or atmospheric processing (HCN, CH₃CN, SF₆, relative humidity, 306 aerosol surface area (four modes), and cloud indicator). We choose 10 s averages for our 307 308 air parcels as a compromise and because the 10 s merged data are a standard product (Wofsy et al., 2018). A few instruments measure at 1 s intervals, but the variability at 309 this scale is not that different from 10 s averages (Fig. S2). Most of the key species are 310 reported as 10 s values, with some being averaged or sampled at 30 s or longer such as 311 ~90 s for some flask measurements. 312

Throughout ATom, gaps occur in individual species on a range of timescales due to
 calibration cycles, sampling rates or instrument malfunction. The generation of the MDS

uses a range of methods to fill these gaps and assigns a flag index to each species and

- data point to allow users to identify direct measurements and methods used for gap-
- filling. Where two instruments measure the same species, the MDS selects a primary
- measurement and identifies which instrument was used with a flag. The methodology
- and species-specific information on how the current MDS version 2 (MDS-2) is
- 320 constructed, plus statistics on the 48 research flights and the 146,494 10 s air parcels in
- 321 MDS-2 are given in the Supplement.

Over the course of this study, several MDS versions were developed and tested, including 322 323 model-derived RDSs from these versions, some of which are used in this paper. In early ATom science team meetings, there was concern about the accuracy of NO_2 direct 324 measurements when at very low concentrations. A group prepared an estimate for NOx 325 using the NO and O₃ measurements to calculate a photostationary value for NO₂ and thus 326 NOx. This PSS-NOx became the primary NOx source in version 0 (i.e., MDS-0). With 327 MDS-0, we chose to gap-fill using correlations with CO to estimate the variability of the 328 missing measurement over the gap. The science team then rejected PSS-NOx as a proxy, 329 and we reverted to the observed NO + NO₂ resulting in NOx values that are 25 % larger 330 on average than in MDS-0 (unweighted mean of 66 vs. 52 ppt). This change affected P-331 332 O3 most and L-CH4 least. We then estimated errors in the gap-filling and found that CO had little skill as a proxy for most other species. With MDS-2, we optimized and tested 333 the treatments of gap-filling and lower limit of detection, along with other quality 334 controls. With continued analysis of the unusually reactive East Pacific region, we 335 336 determined that the method of long-gap filling for NOx resulted in propagation of high NOx levels from the over-land profiles into the over-water profiles in the tropics. We 337 338 separated these two set of profiles used for long-gap NOx filling and created an updated 339 version 2b. This experience points to the importance of having reliable, continuous NOx 340 measurements. MDS-2b is fully documented in the Supplementary Information. 341

342 **3.2** The reactivity data stream (RDS)

343 The concept of using an MDS to initialize 3D global chemistry models and calculate an RDS was developed in the pre-ATom methodology papers (P2017; P2018). In this 344 paper, we use the original six models for their August chemical statistics, and we use 5 of 345 them plus a box model to calculate the reactivities, see Table 1. The RDS is really a 346 protocol applied to the MDS. It is introduced in the Prologue and the details can be 347 found in P2018. A model grid cell chosen to be close to the measured parcel is initialized 348 with all the core reactive species needed for a regular chemistry simulation. The model is 349 350 then integrated over 24 h without transport or mixing, without scavenging, and without emissions. Each global model uses its own varying cloud fields for the period to 351 calculate photolysis rates; but the F0AM box model simply takes the instant J-values as 352 measured on the flight and applies a diurnal scaling. We initialize with the core species 353 and let the radicals (OH, HO₂, RO₂) come quickly into photochemical balance. The 24 h 354 integration is not overly sensitive to the start time of the integration, and thus models do 355 356 not have to synchronize with the local time of observation (see P2018's Fig. S8 and Table 357 S8).

The initial ATom-1 reactivities came from MDS-0 and six of the models in Table 1.

- 359 Although these RDS-0 model results are now out of date because of the move to MDS-
- 2b, they provide critical information on how models agree, or disagree, in calculating the
- RDS using the ATom protocol. Thus we include them here as a cross-model comparison.
- Given the excellent agreement at the parcel level using three models (GC, GMI, UCI),
- and with a desire to avoid wasting the community's time, we continued the analysis of
- 364 MDS-2b with just our local UCI CTM. This decision may need to be revisited.
- Statistics for the three reactivities for six models using MDS-0 are given in Table 2 and 365 Table S8 for three domains: global (all points), Pacific (oceanic data from 53° S to 60° N) 366 and Atlantic (same constraints as Pacific). The statistics try to achieve equal latitude-by-367 pressure sampling by weighting each ATom parcel inversely according to the number of 368 parcels in each 10° latitude by 100 hPa bin, and each point is also cosine(latitude) 369 weighted. We calculate the means and medians plus the percent of total reactivity in the 370 top 10 % of the weighted parcels (Table 2) and also the mean reactivity of the top 10 %, 371 percent of total reactivity in the top 50 %, 10 % and 3 % plus the mean J values (Table 372
- 373 S8).

These six-model version 0 statistics are shown alongside the version 2b results using the 374 375 current UCIZ model but with a new protocol designated RDS*. While investigating sensitivities in the RDS, we found an inconsistency between the reported concentrations 376 of both pernitric acid (HNO₄) and peroxyacetyl nitrate (PAN) with respect to the 377 chemical kinetics used in the models. High concentrations (100 ppt, attributed to 378 379 instrument noise) were reported under conditions where the thermal decomposition frequency was > 0.4 per hour in the lower troposphere (> 253 K for HNO₄ and > 291 K 380 381 for PAN). Thus, these species instantly become NOx. While these measurements are clearly spurious, there is no easy fix. We developed a new protocol, RDS*, that allows 382 both species to decay for 24 h using their local thermal decomposition rate before being 383 384 used in the model. This protocol avoids much of the fast thermal release of NOx in the lower atmosphere during the first 24 h of the RDS calculation, but does not affect the 385 release of NOx from photolysis or OH reactions in the upper troposphere where thermal 386 decomposition in inconsequential. It is possible that some of the high concentrations of 387 HNO₄ and PAN in the lower troposphere are real and that we are missing this large 388 source of NOx with the RDS* protocol, but we find no obvious sources of these species 389 390 in the remote oceanic regions that would produce enough to match the thermal loss. Both this problem and its solution do not affect the initial NOx values. 391

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We present the RDS-2b reactivities calculated under the RDS* protocol with the UCI

394 CTM developed by Xin Zhu for P2017 and P2018 (designated UCIZ*) as our best results

in the final column of Tables 2 and S8. We added diagnostics that give us confidence in

396 our O₃ reactivities: the approximate P-O3 and L-O3 based on the limited reactions (rates

2abd and 3abc above) actually predict the calculated 24 h O_3 tendency, see Fig. S6.

398 Considering the ocean basin observations only, P-L ranges from -12 to +15 ppb/d. The

- mean error in P-L is about -0.01 ppb/d, and the root-mean-squared error is about 0.04 method.
- 400 ppb/d, convincing us that we have correctly diagnosed the P-O3 and L-O3 terms.
- Following the practice of the GMI model, we also record the initial and 24-hour

abundances of all the ATom species to check that nothing unusual altered the species 402 403 abundance in each cell over the 24 hours.

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405 **3.3 Inter-model differences**

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Variations in reactivities due to clouds are an irreducible source of uncertainty: 407 predicting the cloud-driven photolysis rates that a shearing air parcel will experience over 408 409 24 h is not possible here. The protocol uses 5 separated 24 h days to average over synoptically varying cloud conditions. The standard deviation (σ) of the 5 d, as a 410 411 percentage of the 5 d mean, is averaged over all parcels and shown in Table S9 for the five global models. Three central models (GC, GMI, UCI) show 9 %-10 % σ (Js) values 412 and similar $\sigma(Rs)$ values as expected if the variation in J values is driving the reactivities. 413 Two models (GISS, NCAR) have 12 %-17 % σ (Js), which might be explained by more 414 opaque clouds, but the amplified $\sigma(R)$ values (14 %–32 %) are inexplicable. This 415 discrepancy needs to be resolved before using these two models for ATom RDS analysis. 416

417

418 Inter-model differences are shown in the parcel-by-parcel root-mean-square (rms)

differences for RDS-0 in Table 3. Even when models adopt standard kinetic rates and 419 cross sections (i.e., Burkholder et al., 2015), the number of species and chemical 420

421 mechanisms included, as well as the treatment of families of similar species or intermediate short-lived reaction products, varies across models. For example, UCI 422 considers about 32 reactive gases, whereas GC and GMI have over 100, and F0AM has 423

424 more than 600. The other major difference across models is photolysis, with models having different cloud data and different methods for calculating photolysis rates in 425 cloudy atmospheres (H2018). The three central models (GC, GMI, UCI) in terms of their 426 427 5 d variability (Table S9) are also most closely alike in these statistics with rms = 20 % –

30 % for L-CH4 up to 26 %–35 % for P-O3. These rms values appear to be about as 428 close as any two models can get. The intra-model rms for different years (UCI 2016 429 430 versus 1997) is 10 % –13 % and shows that we are seeing basic differences in the chemical models across GC, GMI, and UCI. FOAM is the next closest to these central 431 models, but it will inherently have a larger rms because it is a 1 d calculation and not a 5 432 433 d average. NCAR's rms is consistently higher and likely related to what is seen in the 5 d σ values in Table S9. GISS is clearly different from all the others (L-CH4 rms > 100 % 434 while L-O3 rms < 66 %).

- 435
- 436

437 4 Results

438

Our analysis of the reactivities uses the six-model RDS-0 results to examine the 439 440 consistency in calculating the Rs across models. Thereafter, we rely on the similar results from the three central models (GC, GMI, UCI) to justify use of UCIZ* with MDS-2b as 441 our best estimate for ATom reactivities. The uncertainty in this estimate can be 442 443 approximated by the inter-model spread of the central models as discussed above. When evaluating the model climatologies for chemical species, we use MDS-2b. A summary of 444 the key data files used here, as well as their sources and contents, is given in Table 4. 445 446

4.1 Probability densities of the reactivities 447

- 449 The reactivities for three large domains (Global, Pacific, Atlantic) from the six-model RDS-0 are summarized in Tables 2 and S8. Sorted PDs for the three Rs and Pacific and 450 451 Atlantic Ocean basins are plotted in Fig. 1 and show the importance of the most reactive 452 "hot" parcels with deeply convex curves and the sharp upturn in R values above 0.9 cumulative weight (top 10%). Both basins show a similar emphasis on the most reactive 453 454 hot parcels: 80% - 90% of total R is in the top 50\% of the parcels, 25% - 35% is in 455 the top 10 %, and about 10 % - 14 % is in the top 3 %. The corollary is that the bottom 50 % parcels control only 10 % -20 % of the total reactivity, which is why the median is 456 457 less than mean (except for P-O3 in the Atlantic).
- 458

The enhancement factor for the top 50 % L-CH4 parcels is 2.0 (84 % of reactivity in 42 459 % of mass) given that our 53 °S - 60 °N transects cover 83 % of the air mass below 200 460 hPa and assuming that L-CH4 is negligible poleward of these transects. This 461 enhancement factor is a large-scale feature because the tropical lower troposphere, being 462 warm and wet with high sun, dominates the budget. It is seen in previous model 463 464 intercomparisons that calculate budgets in large tropospheric blocks like Voulgarakis et al. (2013) with 63 % of L-CH4 in 31 % of the air mass (500 hPa-surface, 30 °S - 30 °N). 465 The impact of the extremely hot parcels and the heterogeneity seen in the ATom 10 s 466 parcels is evident in the steep slopes above the 90th percentile, yielding enhancement 467 factors of 3 to 4. 468

469

470 Each R value and each ocean has a unique shape; for example L-O3 in the Atlantic is almost two straight lines breaking at the 50th percentile. In Fig. 1 the agreement across 471 all models (except GISS) is clear, indicating that the conclusion in P2018 (i.e., that most 472 473 global chemistry models agree on the O₃ and CH₄ budgets if given the chemical 474 composition) also holds for the ATom-measured chemical composition. Comparing the brown (UCI, RDS-0) and black-dashed (UCIZ, RDS*-2) lines, we find that the shift from 475 476 MDS-0 to MDS-2b plus the new RDS* (HNO₄+PAN) protocol produces large reductions in P-O3 for all cumulative weights and small reductions in L-CH4 for the upper 5th 477 percentile. We conclude that accurate modeling of chemical composition of the 80th and 478 greater percentiles is important but that modest errors in the lowest 50th percentile are 479 inconsequential; effectively, some parcels matter more than others (P2017). 480

481

How well does this ATom analysis work as a model intercomparison project? Overall,

we find that most models give similar results when presented with the ATom-1 MDS.

484 The broad agreement of the cumulative reactive PDs across a range of model

formulations using differing levels of chemical complexity shows this approach is robust.

The different protocols for calculating reactivities as well as the uncertainty in cloud

fields appear to have a small impact on the shape of the cumulative PDs but are

- informative regarding the minimum structural uncertainty in estimating the 24 h
- 489 reactivity of a well-measured air parcel.

490 **4.2 Spatial heterogeneity of tropospheric chemistry**

491 A critical unknown for tropospheric chemistry modeling is what resolution is needed to 492 correctly calculate the budgets of key gases. A similar question was addressed in Yu et 493 al. (2016) for the isoprene oxidation pathways using a model with variable resolution 494 (500 km, 250 km and 30 km) compared to aircraft measurements; see also ship plume chemistry in Charlton-Perez et al. (2009). ATom's 10 s air parcels measure 2 km 495 496 (horizontal) by 80 m (vertical) during most profiles. There are obviously some chemical structures below the 10 s air parcels. Only some ATom measurements are archived at 1 497 Hz, and we examine a test case using 1 s data for O₃ and H₂O for a mid-ocean descent 498 499 between Anchorage and Kona in Fig. S2a in the Supplement. Some of the 1 s (200 m by 500 8 m) variability is clearly lost with 10 s averaging, but 10 s averaging preserves most of the variability. Lines in Fig. S2 demark 400 m in altitude, and most of the variability 501 502 occurs on this larger, model-resolved scale. Fig. S2b shows the 10 s reactivities during that descent and also indicates that much of the variability occurs at 400 m vertical scales. 503 A more quantitative example using all the tropical ATom reactivities is shown in

A more quantitative example using all the tropical ATom reactivities is sho comparisons with probability densities below (Fig. 5).

How important is it for the models to represent the extremes of reactivity? While the
sorted reactivity curves (Fig. 1, Tables 2 & S8) continue to steepen from the 90th to 97th

percentile, the slope does not change that much. Thus we can estimate the 99^{th} +

percentile contributes <5% of the total reactivity. Thus, if our model misses the top 1 %

of reactive air parcels (e.g., due to the inability to simulate intensely reactive thin

pollution layers) then we miss at most 5 % of the total reactivity. This finding is new and

encouraging, and it needs to be verified with the ATom-2, 3, and 4 data.

The spatial structures and variability of reactivity as sampled by the ATom tropical
transects (central Pacific, eastern Pacific and Atlantic) are presented as nine panels in Fig.
2. Here, the UCIZ RDS*-2 reactivities are averaged and plotted in 1° latitude by 200 m
thick cells, comparable to some global models (e.g., GMI, NCAR, UCI). We separate the
eastern Pacific (121° W, research flight (RF) 1) from the Central Pacific (RFs 3, 4 and 5)
because we are looking for contiguous latitude-by-pressure structures.

519 In the central Pacific (Fig. 2adg), highly reactive (hot) P-O3 parcels (> 6 ppb/d) occur in larger, connected air masses at latitudes 20°-22°N and pressure altitudes 2-3 km and in 520 521 more scattered parcels (> 3 ppb/d) below 5 km down to 20°S. High L-O3 and L-CH4 coincide with this 20°-22°N air mass and also with some high P-O3 at lower latitudes. 522 This pattern of overlapping extremes in all three Rs is surprising because the models' 523 mid-Pacific climatologies show a separation between regions of high L-O3 (lower-middle 524 troposphere) and high P-O3 (upper troposphere, as seen in P2017's Fig. 3). The obvious 525 explanation is that the models leave most of the lightning-produced NOx in the upper 526 527 troposphere. The ATom profiling seems to catch reactive regions in adjacent profiles

separate by a few hundred kilometers, scales easily resolvable with 3D models.

In the eastern Pacific (Fig. 2beh), the overlap of outbound and return profiles enhances the spatial sampling over the 10 h flight. The region of very large L-O3 (> 5 ppb/d) is extensive, beginning at 5–6 km at 10°N and broadening to 2–8 km at 28°N. The region of L-CH4 is similar, but loss at the upper altitudes of this air mass is attenuated because of the temperature dependence of L-CH4 and possibly because of differing OH:HO₂ ratios with altitude. Large P-O3 (> 3 ppb/day) occurs only in the center of this highly

reactive L-O3/L-CH4 region, suggesting that NOx is not as evenly distributed as is HOx.

- 537 12 km) and only in the sub-tropics. ATom-1 RF1 (29 Jul 2016) occurred during the
- 538North American Monsoon when there was easterly flow off Mexico, thus the high
- reactivity of this large air mass indicates that continental deep convection with lightning
- 540 NOx is a source of high reactivity for both O_3 and CH_4 .

541 In the Atlantic (Fig. 2cfi) we also see similar air masses through successive profiles,

- 542 particularly in the northern tropics. The Atlantic P-O3 shows high-altitude reactivity
- similar to the eastern Pacific. Likewise, the large values of L-O3 and L-CH4 match the
- eastern Pacific and not central Pacific. Unlike either Pacific transect, the Atlantic L-O3
 and L-CH4 show some high reactivity below 1 km altitude. Overall, the ATom-1
- 546 profiling clearly identifies extended air masses of high L-O3 and L-CH4 extending over
- 2-5 km in altitude and 10° of latitude. The high P-O3 regions tend to be much more
- 548 heterogeneous with greatly reduced spatial extent, likely of recent convective origin as
- 549 for eastern Pacific.
- 550 Overall, the extensive ATom profiling identifies a heterogeneous mix of chemical
- composition in the tropical Atlantic and Pacific, with a large range of reactivities. What
- is important for those trying to model tropospheric chemistry is that the spatial scales of
- variability seen in Fig. 2 should be within the capability of modern global models.

554 **4.3 Testing model climatologies**

- 555 The ATom data set provides a unique opportunity to test CTMs and CCMs in a
- climatological sense. In this section, we compare ATom-1 data and the six models'
- chemical statistics for mid-August used in P2017. The ATom profiles cannot be easily
- 558 compared point by point with CCMs, and we use statistical measures of the three
- reactivities in the three tropical basins: mean profiles in Fig. 3 and PDs in Fig. 5.

560 **4.3.1 Profiles**

- For P-O3 profiles (top row, Fig. 3), the agreement between models and measurements is 561 562 passable except for the 0–2 km region in both Central and Eastern Pacific, where the models fail to predict the observed 2 ppb/d O_3 production. In the Central Pacific at 3–12 563 km, ATom-1 results agree with models, showing ozone production of about 1 ppb/day. 564 565 In the Eastern Pacific and Atlantic at 3–12 km, ATom-1 results also agree with models, but at a higher ozone production of about 2 ppb/day. This pattern indicates that in the 566 Central Pacific, the NOx+HOx combination that produces ozone is suppressed below 2 567 568 km in all the models. In the upper troposphere, 10–12 km, of the Eastern Pacific and Atlantic, ATom P-O3 values show a jump to 3 ppb/d, which is only partly reproduced in 569 the models. We take this pattern as evidence for lightning NOx production and export 570
- 571 over the adjacent continents.
- 572 For L-O3 (middle row, Fig. 3) in the central Pacific, ATom-1 results match the
- throughout the 0–12 km range (except GISS). Moving to the eastern Pacific and Atlantic,
- 574 most models show a mid-level peak above 2 km, while ATom-1 shows even larger peak
- L-O3, especially in the Eastern Pacific at 3-6 km where L-O3 > 4 ppb/d. This mid-
- tropospheric peak is evident in the curtain plots of Fig. 2 and likely due to easterly mid-
- tropospheric flow from convection over Mexico at that specific time (29 July 2016).

578 Similarly, the ATom reactivity at 1–3 km in the Atlantic is associated with biomass

579 burning in Africa and was measured in other trace species. Thus, in terms of L-O3, the

580 ATom–model differences may be due to specific meteorological conditions, and this

- could be tested with CTMs using 2016 meteorology and wildfires.
- 582

583 For L-CH4 (bottom row, Fig. 3), the ATom-model patterns are similar to L-O3, including the large ATom-only losses (> 1.5 ppb/d over 3-6 km) in the eastern Pacific, but with 584 585 higher reactivities occurring at slightly lower altitudes because of the large negative temperature dependence of reaction (1). L-O3 is dominated by O(1D) and HO₂ loss, 586 587 while L-CH4 is limited to OH loss. Overall, there is clear evidence that the Atlantic and Pacific have very different chemical mixtures controlling the reactivities and that 588 convection over land (monsoon or biomass burning) creates air masses that are still 589 590 highly reactive a day or so later.

591

592 **4.3.2 Key species**

593 The deficit in modeled P-O3 in the central and eastern Pacific at 0-2 km altitude points to 594 a NOx deficiency in the models, and this becomes obvious in the comparison of the PD histograms for NOx shown in Fig. 4. Over 0–12 km (first row), ATom has a reduced 595 frequency of parcels with 1–10 ppt and a corresponding increase in parcels with 20-60 596 ppt; this discrepancy is amplified in the lower troposphere, 0-4 km (second row). The 597 obvious source of this oceanic NOx is lightning since oceanic sources of organonitrates 598 599 or other nitrate species measured on ATom could not supply this amount. The ATom statistics indicate such a lightning source must be mixed down into the boundary layer. 600 In the eastern Pacific and Atlantic, the full troposphere PD more closely matches the 601 602 models, including bump in 100–300 ppt NOx which is probably direct outflow from very 603 deep convection with lightning over the neighboring continents. Overall, the models 604 appear to be missing significant NOx sources in all three regions below 4 km.

605

In Fig. 4, we also look at the histograms for the key HOx-related species HOOH (third
row) and HCHO (fourth row). For these species, the ATom-model agreement is
generally good. If anything, the models tend to have too much HOOH. ATom shows
systematically large occurrences of low HOOH (50–200 ppt, especially central Pacific)

610 indicating, perhaps, that convective or cloud scavenging of HOOH is more effective than

611 is modeled. HCHO shows reasonable agreement in the Atlantic, but in both central and

- eastern Pacific, the modeled low end (< 40 ppt) is simply not seen in the ATom data.
- Also, the models are missing a strong HCHO peak at 300 ppt in the eastern Pacific,
- 614 probably convection-related specific to that time period. Thus, in terms of these HOx
- 615 precursors, the model climatologies appear to be at least as reactive as the ATom data.

616 While the ATom-1 data in Fig. 4 are limited to single transects, the model NOx

discrepancies apply across the three tropical regions, and the simple chemical statistics

for these flights alone are probably enough to identify measurement-model discrepancies.

For the HOx-related species, the models match the first-order statistics from ATom. In

terms of using ATom statistics as a model metric, it is encouraging that where some

621 individual models tend to deviate from their peers, they also deviate from the ATom-1

622 PDs.

623 4.3.3 Probability densities

Mean profiles do not reflect the heterogeneity seen in Fig. 2, and so we also examine the 624 625 PDs of the tropical reactivities (Fig. 5). The model PDs (colored lines connecting open circles at the center of each bin) are calculated from the 1 d statistics for mid-August 626 (P2017) using the model blocks shown in Fig. S1. The model grid cells are weighted by 627 air mass and cosine(latitude) and limited to pressures greater than 200 hPa. The ATom 628 PDs (black lines connecting black open circles) are calculated from the 10 s data 629 630 weighted by (but not averaged over) the number of points in each 10° latitude by 200 hPa 631 pressure bin, and then also by cosine (latitude) to compare with the models. In addition, a PD was calculated from the 1° by 200 m average grid-cell values in Fig. 2 (black Xs), 632 and this is also cosine(latitude)-weighted. To check if the high reactivities in the eastern 633 Pacific affected the whole Pacific PD, a separate PD using only central Pacific 10 s data 634 was calculated (gray lines connecting gray open circles). The mean reactivities (ppb/d) 635 from the models and ATom are given in the legend; note that the model values are based 636 on the August climatologies (P2017) and not the MDS-0 values in the table. The 'ATom' 637 legend values are the same as in Table 2. The PD binning is shown by the open circles, 638 and occurrences of off-scale reactivities are included in the last point. 639

640

641 For the Pacific (eastern + central, left columns, Fig. 5), the modeled PD climatologies are 642 similar for each of the reactivities (except GISS), and there is fairly good agreement with 643 the ATom-1 PDs. For the Atlantic (right columns, Fig. 5), the models show a larger 644 spread presumably due to the differing influence of pollution from neighboring continents. The ATom-1 Atlantic PDs also show slightly larger disagreement with the 645 646 models (e.g., the maximum in P-O3 at 1–2 ppb/d and minimum in L-O3 at 2–3 ppb/d) 647 and the notably higher frequency of hot spots with L-O3 > 5 ppb/d. The influence of the 648 extreme eastern Pacific reactivities are seen in the statistics generated from the central Pacific values only (CPac, gray circles), e.g., the mean value for L-O3 drops from 1.42 to 649 650 1.17 ppb/d.

651

The ability to test a model's reactivity statistics with the ATom 10 s data is not obvious, 652 but the PDs based on 1° latitude by 200 m altitude cells (the black Xs) are remarkably 653 654 close to the PDs based on 2 km (horizontal) by 80 m (vertical) 10 s parcels. With the coarser resolution, we see a slight shift of points from the ends of the PD to the middle as 655 expected, but we find once again, that the loss in high-frequency, below-model grid-cell 656 resolution is not great. Both ATom-derived PDs more closely resemble each other than 657 any model PD. Thus, current global chemistry models with resolutions of about 100 km 658 by 400 m should be able to capture much of the wide range of chemical heterogeneity in 659 the atmosphere, which for the oceanic transects is, we believe, adequately resolved by the 660 10 s ATom measurements. Perhaps more surprising, given the different mean profiles in 661 Fig. 3, is that the five model PDs in Fig. 5 look very much alike. 662

- 664 **5 Discussion and path forward**
- 665
- 666 5.1 Major findings
- 667

This paper opens a door for what the community can do with the ATom measurements 668 669 and the derived products. ATom's mix of key species allows us to calculate the reactivity of the air parcels and hopefully may become standard for tropospheric chemistry 670 671 campaigns. We find that the reactivity of the troposphere with respect to O_3 and CH_4 is dominated by a fraction of the air parcels but not by so small and infrequent a fraction as 672 to challenge the ability of current CTMs to simulate these observations and thus be used 673 to study the oxidation budgets. In comparing ATom results with modeled climatologies, 674 675 we find a systematic ATom-model difference: models show a large relative drop in O₃ production below 2 km over the tropical oceans but ATom shows an increase (C.Pac.), no 676 677 change (E.Pac.) or a much lesser drop (Atl.). We traced this result to the lack of NOx at 20–60 ppt levels in the models below 4 km and believe it provides a clear challenge in 678 modeling ozone. 679

Building our chemical statistics (PDs) from the ATom 10 s air parcels on a scale of 2 km 680 by 80 m, we can identify the fundamental scales of spatial heterogeneity in tropospheric 681 chemistry. Although heterogeneity occurs at the finest scales (such as seen in some 1 s 682 observations) the majority of variability in terms of the O₃ and CH₄ budgets occurs across 683 scales larger than neighboring 2 km parcels. The PDs measured in ATom can be largely 684 captured by a global models' 100 km by 200 m grid cells in the lower troposphere. This 685 surprising result is evident by comparing the ATom 1D PDs – both species and 686 reactivities – with those from the models' climatologies (Fig. 5). These comparisons 687 show that the modeled PDs are consistent with the innate chemical heterogeneity of the 688 689 troposphere as measured by the 10 s parcels in ATom. A related conclusion for biomass burning smoke particles is found by Schill et al. (2020), where most of the smoke appears 690 in the background rather than in pollution plumes, and therefore much of the variability 691 692 occurs on synoptic scales resolved by global models (see their Fig. 1 compared with Fig. 693 2 here).

694 **5.2 Opportunities and lessons learned**

As a quick look at the opportunities provided by the ATom data, we present an example 695 696 based on the Wolfe et al (2019) study, which used the F0AM model and semi-analytical arguments to show that troposphere HCHO columns (measurable by satellite and ATom) 697 are related to OH columns (measured by ATom) and thus to CH₄ loss. Fig. 6 extends the 698 Wolfe et al study using the individual air parcels and plotting L-CH4 (ppb/d) versus 699 HCHO (ppt) for the three tropical regions where most of the CH_4 loss occurs. The 700 relationship is linear but with a lot of scatter and has slopes ranging from 3.5 to 4.4 per 701 702 day over the three tropical regions; but for the largest reactivities (0-4 km, 1-3 ppb/d), L-CH4 is not so well correlated with HCHO. 703

704

As is usual with new model intercomparison projects, we have an opportunity to identify model 'features' and identify errors. In the UCI model, an error in the lumped alkane formulation (averaging alkanes C_3H_8 and higher) did not show up in P2018, where UCI supplied all the species, but when the ATom data were used, the UCI model became an

outlier. Once found, this problem was readily fixed (hence the current UCIZ model

version). Inclusion of the F0AM model with its extensive hydrocarbon oxidation

711 mechanism provided an interesting contrast with the simpler chemistry in the global

- 712 CCM/CTMs. For a better comparison of the chemical mechanisms, we should have
- FOAM use 5 d of photolysis fields from one of the CTMs. The anomalous GISS results
- have been examined by a co-author, but no clear causes have been identified as of this
- publication. The problem goes beyond just the implementation of the RDS protocol, as it
- shows up in the model climatology (Fig. 4 & 5, also in P2017).
- 717 Decadal-scale shifts in the budgets of O_3 and CH_4 are likely to be evident through the
- statistical patterns of the key species, rather than simply via average profiles. The
- via underlying design of ATom was to collect enough data to develop such a multivariate
- chemical climatology. As a quick look across the four deployments, we show the joint
 2D PDs on a logarithmic scale as in P2017 for HOOH versus NOx in Fig. 7. The patterns
- for the tropical central Pacific are quite similar for the four seasons of ATom
- deployments, and the fitted ellipses are almost identical for ATom 2, 3 and 4. Thus, for
- these species in the central Pacific, we believe that ATom provides a benchmark of the
- 725 2016-2018 chemical state, one that can be revisited with an aircraft mission in a decade to
- 726 detect changes in not only chemical composition but also reactivity.
- ATom identifies which 'highly reactive' spatial or chemical environments could be
 targeted in future campaigns for process studies or to provide a better link between
 satellite observations and photochemical reactivity (e.g., E. Pacific mid-troposphere in
 August, Fig. 2). The many corollary species measured by ATom (not directly involved in
 CH₄ and O₃ chemistry) can provide clues to the origin or chemical processing of these
 environments. We hope to engage a wider modeling community beyond the ATom
 science team, as in H2018, in the calculation of photochemical processes, budgets, and
- feedbacks based on all four ATom deployments.
- 735
- 736 *Data Availability*. The MDS-2b and RDS*-2b data for ATom 1, 2, 3 and 4 are presented
- here as core ATom deliverables, and are posted temporarily on the NASA ESPO ATom
- 738 website (<u>https://espo.nasa.gov/atom/content/ATom</u>) and permanently on DRYAD|UCI
- 739 (<u>https://doi.org/10.7280/D1B12H</u>). This publication marks the public release of the
- reactivity calculations for ATom 2, 3 and 4, but we have not yet analyzed these data, and
- thus users should be aware and report any anomalous features to the lead authors via
- 742 <u>haog2@uci.edu</u> and <u>mprather@uci.edu</u>. Details of the ATom mission and data sets are
- found on the NASA mission website (https://espo.nasa.gov/atom/content/ATom) and at
- the final archive at Oak Ridge National Laboratory (ORNL;
- 745 <u>https://daac.ornl.gov/ATOM/guides/ATom_merge.html</u>). The MATLAB scripts and data
- sets used in the analysis here are posted on Dryad (<u>https://doi.org/10.7280/D1Q699</u>).
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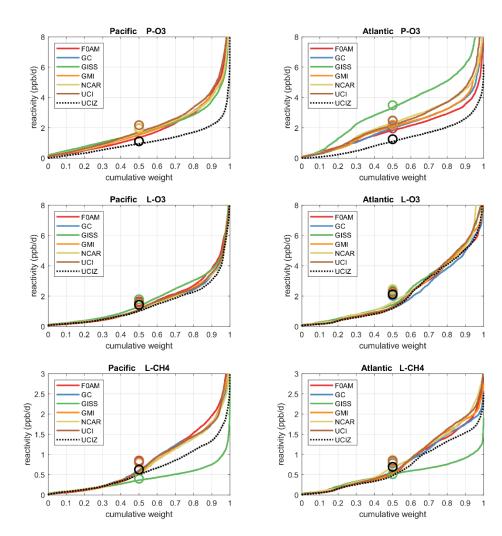
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924 Figures and Tables



Fig. 1. Sorted reactivities (P-O3, L-O3, L-CH4, ppb/day; three successive rows) for the Pacific
and Atlantic domains (53° S-60° N, two columns) of ATom-1. Each parcel is weighted,
including cosine(latitude), see text. Results from six models using MDS-0 and the standard RDS
protocol are shown with colored lines; the updated UCIZ CTM using MDS-2b with the RDS*
protocol (HNO₄ and PAN damping) is shown as a black dashed line. The mean value for each
model is shown with an open circle plotted at the 50th percentile. (Flipped about the axes, this is a
cumulative probability density function.)



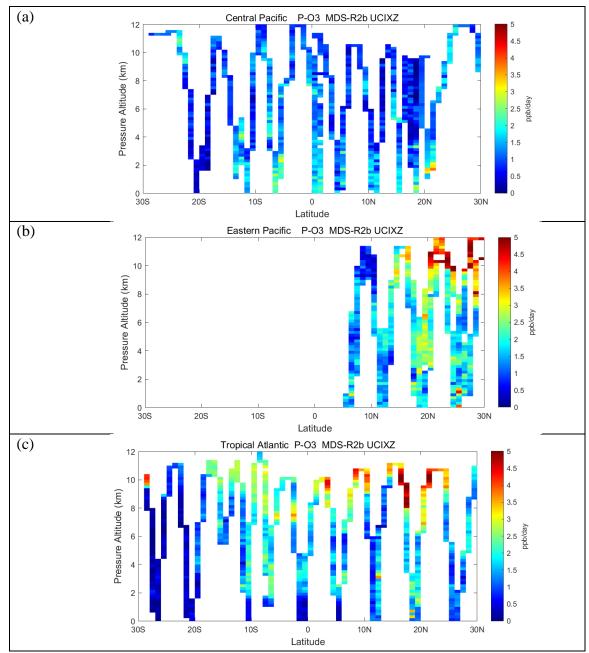
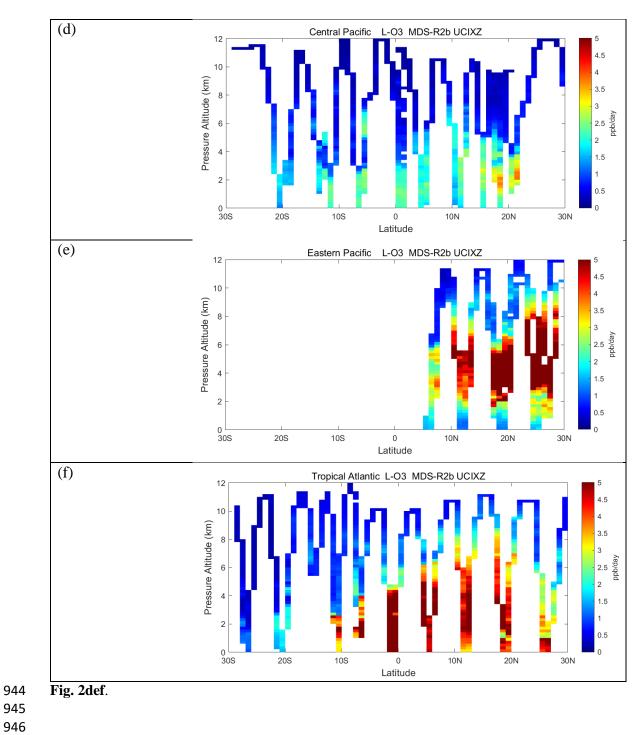
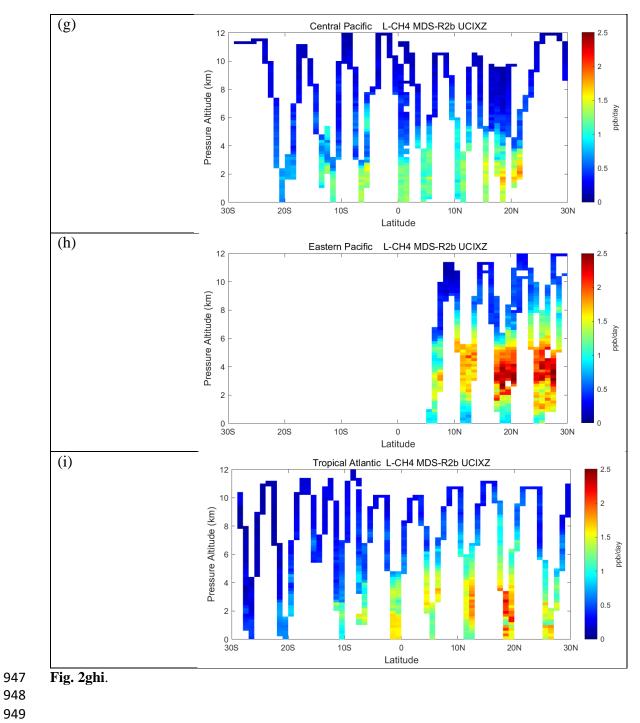


Fig. 2abc. Curtain plots for P-O3 (0–5 ppb/d; Fig 2abc), L-O3 (0–5 ppb/d; Fig 2def) and L-CH4
(0–2.5 ppb/d; Fig 2ghi) showing the profiling of ATom-1 flights in the central Pacific (RF 3, 4

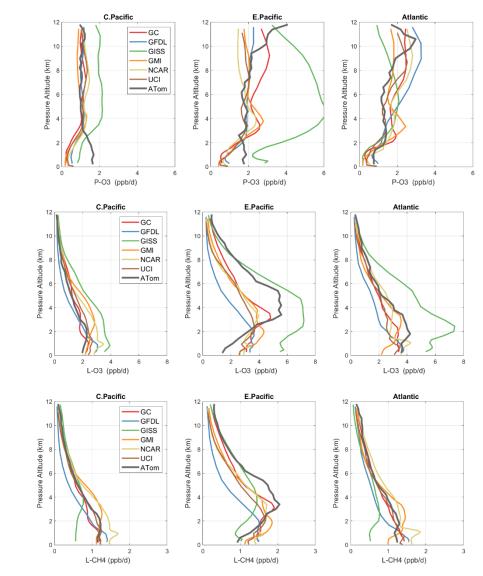
and 5; Fig 2adg), eastern Pacific (RF 1; Fig2 beh), and Atlantic (RF 7, 8, and 9; Fig2cfi).

941 Reactivities are calculated with the current UCIZ CTM model using MDS-2b and the RDS*
 942 protocol, see text. The 10 s air parcels are averaged into 1° latitude and 200 m altitude bins.



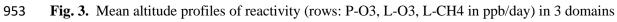








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954 (columns: C. Pacific, 30° S–30° N by 180°–210° E; E. Pacific, 0°–30° N by 230°–250° E;

Atlantic, 30° S- 30° N by 326° - 343° E; ranges are the model blocks). Air parcels are

956 cosine(latitude) weighted. ATom-1 (gray) results are from Fig. 2, while model results are taken

957 from the August climatologies in Prather et al. (2017).

958

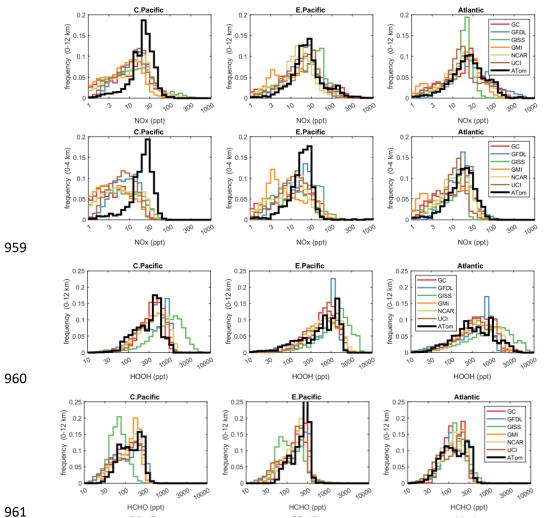
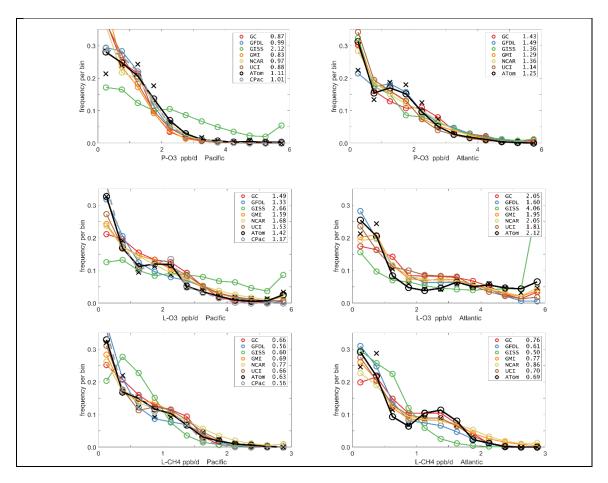
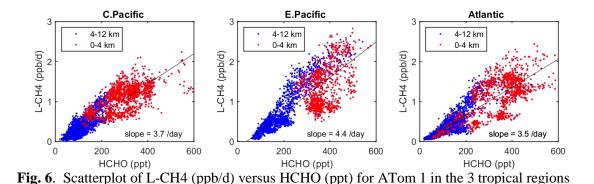


Fig. 4. Histograms of probability densities (PDs) of NO_x (0–12 km, row 1), NO_x (0–4 km, row 2), HOOH (0–12 km, row 3), and HCHO (0–12 km, row 4) for the three tropical regions (central Pacific, eastern Pacific, Atlantic). The ATom-1 data is plotted on top of the six global chemistry models' results for a day in mid-August and sampled as described in Fig. 3.



968

969 Fig. 5. Probability densities (PD, frequency of occurrence) for the ATom-1 three reactivities 970 (rows: P-O3, L-O3, L-CH4 in ppb/day) and for the Pacific and Atlantic from 53° S to 60° N 971 (columns left and right). Each air parcel is weighted as described in the text for equal frequency 972 in large latitude-pressure bins, and also by cosine(latitude). The ATom statistics are from the 973 UCIZ model, using MDS-2b and revised RDS* protocol (HNO4 and PAN damping). The Pacific 974 results (solid black) also show the central Pacific alone (dashed gray). The six models' values for 975 a day in mid-August are averaged over longitude for the domains shown in Fig. S1 in the Supplement, and then cosine(latitude) weighted. Mean values (ppb/day) are shown in the legend. 976 977 The PD derived from the ATom 10 s parcels binned into 1° latitude by 200 m altitude (as shown 978 for the tropics in Fig. 2) is typical of a high-resolution global model, and denoted by black Xs. 979



shown in **Fig. 3**. The air parcels are split into lower troposphere (0-4 km pressure altitude, red dots) where most of the reactivity lies and mid+upper troposphere (4-12 km, blue). A simple

linear fit to all data is shown (thin black line) and the slope is given in units of 1/day.



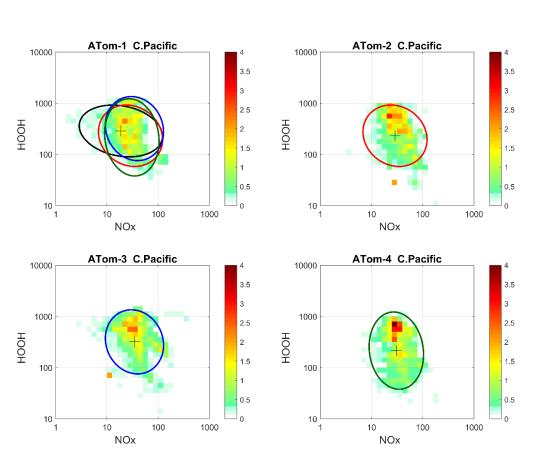


Fig. 7. 2D frequency of occurrence (PDs in log ppt mole fraction) of HOOH vs. NOx for the tropical Central Pacific for all 4 ATom deployments. The cross marks the mean (in log space), and the ellipse is fitted to the rotated PD having the smallest semi-minor axis. The semi-minor and semi-major axes are 2 standard deviations of PD in that direction. The ellipses from ATom-2 (red), ATom-3 (blue), and ATom-4 (dark green) are also plotted in the ATom-1 quadrant.

Table 1. Chemistry models						
Used for	ID	Model name	Mode I type	Meteorology	Model Grid	
clim	GFDL	GFDL- AM3	ССМ	NCEP (nudged)	C180 x L48	
clim, MDS-0	GISS	GISS- E2.1	ССМ	Daily SSTs, nudged to MERRA	2° x 2.5° x 40L	
clim, MDS-0	GMI	GMI-CTM	СТМ	MERRA	1° x 1.25° x 72L	
clim, MDS-0	GC	GEOS- Chem	СТМ	MERRA-2	2° x 2.5° x 72L	
clim, MDS-0	NCAR	CAM4- Chem	ССМ	Nudged to MERRA	0.47° x 0.625° x 52L	
clim, MDS-0 & 2b	UCI	UCI-CTM	СТМ	ECMWF IFS Cy38r1	T159N80 x L60	
MDS-0	F0AM	F0AM	box	MDS + scaled ATom Js	N/A	

The descriptions of models used in the paper. The first column denotes if the model's August climatology is used ('clim') and also the MDS versions used. F0AM used chemical mechanism MCMv331 plus J-HNO₄ plus O^1D)+CH₄. For the global models see P2017, P2017, and H2018.

		Models using MDS-0					MDS-2b			
Value	Region	F0AM	GC	GISS	GMI	NCAR	UCI	U15	U97	UCIZ*
P-O3, r	nean,									
ppb/d										
	Global	2.12	2.12	2.57	2.08	2.22	2.38	2.37	2.37	1.23
					e1.9					
	Pacific	1.96	2.00	1.99	6	2.01	2.17	2.13	2.15	1.11
	Atlantic	1.96	2.12	3.49	2.20	2.44	2.48	2.48	2.49	1.25
L-O3, n	nean,									
ppb/d	<u>.</u>		1.00	4.00	1 70	4 70	4 70		4 75	
	Global	1.81	1.63	1.93	1.70	1.76	1.76	1.74	1.75	1.61
	Pacific	1.65	1.51	1.79	1.55	1.52	1.58	1.53	1.56	1.42
	Atlantic	2.15	2.02	2.37	2.17	2.47	2.28	2.28	2.30	2.12
L-CH4, ppb/d	mean,									
	Global	0.81	0.76	0.43	0.75	0.73	0.79	0.78	0.78	0.61
	Pacific	0.85	0.82	0.40	0.80	0.79	0.82	0.80	0.81	0.63
	Atlantic	0.80	0.78	0.51	0.81	0.86	0.85	0.85	0.85	0.69
,	∕∕sum R									
in top 1										
	Global	35%	32%	31%	32%	30%	34%	34%	34%	33%
	Pacific	34%	28%	28%	29%	29%	30%	30%	30%	27%
	Atlantic	24%	25%	24%	26%	24%	27%	27%	28%	27%
L-O3, % in top 1	6sum R 0%									
•	Global	35%	35%	33%	35%	36%	36%	36%	36%	36%
	Pacific	33%	32%	29%	32%	31%	32%	32%	32%	32%
	Atlantic	28%	30%	29%	30%	34%	30%	30%	30%	29%
L-CH4, in top 1	%sum R 0%									
	Global	33%	30%	27%	31%	31%	32%	32%	32%	30%
	Pacific	32%	28%	26%	29%	29%	29%	29%	29%	27%
	Atlantic	27%	25%	21%	26%	27%	27%	27%	27%	25%

Global includes all ATom-1 parcels, Pacific considers all measurements over the Pacific Ocean from 53°S to 60°N, and Atlantic uses parcels from 53° S to 60° N over the Atlantic Ocean. All parcels are weighted inversely by the number of parcels in each 10° latitude by 100 hPa bin, and by cosine(latitude). Results from MDS-0 are shown because we have results from six models. Results from the updated MDS-2b are shown (UCIZ*) using the using the current UCI CTM model UCIZ and the RDS* protocol that preprocesses the MDS-2b initializations with a 24 h decay of HNO4 and PAN according to their local thermal decomposition frequencies, see text. See additional statistics in Table S8.

Table 3. Cross-model RMS differences (RMSDs as % of mean) forthe three reactivities using MDS-0.						
P-O3	F0AM	GC	GISS	GMI	NCAR	UCI
F0AM		48%	95%	45%	55%	42%
GC	48%		78%	26%	42%	32%
GISS	95%	78%		81%	72%	75%
GMI	45%	26%	81%		40%	35%
NCAR	55%	42%	72%	40%		42%
UCI	42%	32%	75%	35%	42%	(10%)
L-03						
F0AM		40%	44%	43%	76%	38%
GC	40%		33%	25%	60%	24%
GISS	44%	33%		36%	66%	30%
GMI	43%	25%	36%		62%	28%
NCAR	76%	60%	66%	62%		60%
UCI	38%	24%	30%	28%	60%	(11%)
L-CH4						
F0AM		47%	136%	48%	82%	45%
GC	47%		111%	20%	60%	27%
GISS	136%	111%		114%	110%	121%
GMI	48%	20%	114%		57%	30%
NCAR	82%	60%	110%	57%		68%
UCI	45%	27%	121%	30%	68%	(14%)
-	45%	-	121%	30%		

Matrices are symmetric. Calculated with the 31,376 MDS-0 unweighted ATom-1 parcels using the standard RDS protocol. F0AM lacks 5,510 of these parcels because there are no reported J-values. UCI shows RMSD between years 2016 (default) and 1997 as the value in parentheses on diagonal. The unweighted mean R from 3 core models (GC, GMI, UCI) are: P-O3 = 1.97, L-O3 = 1.50, L-CH4 = 0.66, all ppb/d. The three core-model RMSDs with respect to one another are less than 36% and boldened.

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Table 4. ATom data files used h	nere	
Primary Aircraft Data	Formatting and content	Comments
(a) Mor.all.at1234.2020-05-27.tbl (b) Mor.WAS.all.at1234.2020-05- 27.tbl (c) Mor.TOGA.all.at1234.2020- 05-27.tbl All from Wofsy et al., 2018.	 (a) 149133 records x 675 csv columns, 10 s merges of flight data plus chemistry & environmental measurements (b) 6991 records x 729 csv columns, 30-120 s intervals to fill flasks (c) 12168 records x 727 csv columns, 35 s intervals of instrument 	Core source of ATom measurements. irregular and difficult formatting; extremely long asci records; large negative integers or 'NA' for some non-data.
Modeling Data Stream (MDS-2b)		
(a) ATom_MDS2b.nc	 (a) netcdf file containing regularly spaced 10 s observations for ATom-1 (32383 records), ATom-2 (33424 records), ATom-3 (40176 records), ATom-4 (40511 records), 146,494 in total; includes physical flight data (11), chemical data (39), miscellaneous data including corrected HNO4 and PAN (6), flag data (50). 	Regular formatting; all data gap filled with flags to identify the method and extent of filling; NaN's only for flight 46; for use in modeling of the chemistry and related statistics from the ATom 10 s data.
Reactivity Data Stream (RDS-2b)		
(a) ATom_RDS2b.nc	 (a) netcdf file containing regularly spaced reactivities for 10 s parcels from ATom-1234 (146,494 in total); includes latitude, longitude and pressure of model grid cell used in the calculation; includes P-O3, L-O3, L-CH4, L-CO, J-O1D, plus dO3/dt = net O3 change over 24 h. Reactivities are given for 5 days separated by 5 days in the middle of each deployment, plus the 5-day mean. 	Results from newest UCI CTM version (UCIZ) run with RDS* protocol (PAN and HNO4 decay) and using MDS-2b. NaN's only for flight 46.