1	The Global Tropospheric Ammonia Distribution as seen in the 13-year AIRS			
2	Measurement Record			
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- 32 Abstract:
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34 Ammonia (NH₃) plays an increasingly important role in the global biogeochemical cycle of 35 reactive nitrogen as well as in aerosol formation and climate. We present extensive and nearly 36 continuous global ammonia measurements made by the Atmospheric Infrared Sounder (AIRS) 37 from the Aqua satellite to identify and quantify major persistent and episodic sources as well as 38 to characterize seasonality. We examine the 13-year period from September 2002 through 39 August 2015 with a retrieval algorithm using an optimal estimation technique with a set of three, 40 spatially and temporally uniform a priori profiles. Vertical profiles show good agreement (~ 5 – 15%) between AIRS NH₃ and the in situ profiles from the winter 2013 DISCOVER-AQ 41 42 (DISCOVER-Air Quality) field campaign in central California, despite the likely biases due to 43 spatial resolution differences between the two instruments. The AIRS instrument captures the 44 strongest consistent NH₃ concentrations due to emissions from the anthropogenic (agricultural) 45 source regions, such as South Asia (India/Pakistan), China, the United States (U.S.), parts of Europe, Southeast (SE) Asia (Thailand/Myanmar/Laos), the central portion of South America, as 46 47 well as Western and Northern Africa. These correspond primarily to irrigated croplands, as well 48 as regions with heavy precipitation, with extensive animal feeding operations and fertilizer 49 applications where a summer maximum and a secondary spring maximum are reliably 50 observable. In the Southern Hemisphere (SH) regular agricultural fires contribute to a spring 51 maximum. Regions of strong episodic emissions include Russia and Alaska as well as parts of 52 South America, Africa, and Indonesia. Biomass burning, especially wildfires, dominate these 53 episodic NH₃ high concentrations. 54 55 56 57 58 59

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63 1. Introduction

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65 Global ammonia (NH₃) emissions are increasing due to the increased agricultural livestock numbers coupled with the increasing use of nitrogen fertilization. Atmospheric ammonia has 66 67 impacts upon local scales, acidification and eutrophication of the ecosystems, and international 68 (transboundary), as well as local, scales through formation of fine ammonium containing 69 aerosols (Sutton et al., 2007, 2008). Ammonia reacts rapidly with sulfuric (H₂SO₄), nitric 70 (HNO₃), and hydrochloric (HCl) acids to form a large fraction of secondary aerosols, i.e., fine Particulate Matter (PM_{2.5}) (particles less than 2.5 micrometers in diameter) (Malm et al., 2004). 71 72 These ammonium containing aerosols affect Earth's radiative balance, both directly by scattering 73 incoming radiation and indirectly by acting as cloud condensation nuclei (e.g., Adams et al., 74 2001; Martin et al., 2004; Abbatt et al., 2006; Wang et al., 2008; Henze et al., 2012). A large 75 percentage of PM_{2.5} can penetrate human respiratory systems and deposit in the lungs and 76 alveolar regions, thus endangering public health (e.g., Pope et al., 2002). Ammonia deposition 77 modifies the transport lifetimes, and deposition patterns of sulfur dioxide (SO₂) and nitrogen 78 dioxide (NO_x) (Wang et al., 2008; Henze et al., 2012). Additionally, ammonia increases the concentrations of the greenhouse gas nitrous oxide (N₂O) (EPA, 2011) and, together with NH₄⁺ 79 80 content in soils, NH₃ is involved in CH₄ production and release (Fowler et al., 2009). NH₃ can 81 also contribute to increases in radiative forcing through conversion of organic carbon (OC) into 82 brown carbon (BrC) (Updyke et al., 2012). Therefore, monitoring NH₃ global distribution of 83 sources is important to human health, with respect to air and water quality, and climate change. 84 85 Atmospheric ammonia concentrations have been modeled from a three-dimensional coupled-

86 oxidant-aerosol model (GEOS-Chem) (Bey et al., 2001) to estimate natural and transboundary 87 pollution influences on sulfate-nitrate-ammonium aerosol concentrations in the United States 88 (U.S.) (Park et al., 2004). We used the simulated NH_3 fields from GEOS-Chem as the retrieval a 89 priori for this study. A number of ammonia related science studies and top-down inventory 90 studies are based on GEOS-Chem and its adjoint (Henze et al., 2009; Heald et al., 2012; Paulot 91 et al., 2013; Zhu et al., 2013; Paulot et al., 2014; Paulot and Jacob, 2014). The model's ammonia emissions were based on annual data from the 1990 1° x 1° GEIA inventory of Bouwman et al. 92 93 (1997). Table 1b from Park et al. (2004) shows a summary of global and contiguous U.S.

94 ammonia emissions for 2001. The inventory's categories include anthropogenic sources: 95 domesticated animals, fertilizers, human bodies, industry, fossil fuels, and natural sources: 96 oceans, crops, soils, and wild animals. Additional emissions from biomass burning and biofuel 97 used were computed using the global inventories of Duncan et al. (2003) and Yevich and Logan (2003), with an emission factor of 1.3 g NH₃ per kilogram dry mass burned (Andreae and Merlet, 98 99 2001). For the emissions from domesticated animals and soils, the GEOS-Chem model used the 100 exponential dependencies on temperature reported by Aneja et al. (2000) and Roelle and Aneja 101 (2002), respectively. Ammonia emissions from crops and fertilizers were assumed to vary 102 seasonally with the number of daylight hours (Adams et al., 1999). Seasonal variations in 103 biomass burning and biofuel emissions in the model were specified based on satellite 104 observations (Duncan et al., 2003) and the heating degree-days approach (Park et al., 2004). The 105 GEOS-Chem model can be used to generate 3-D global monthly mean fields of NH₃ 106 concentrations, or higher temporal resolutions (e.g., daily or hourly), for various years. 107 108 Satellite remote sensing offers unique opportunities to monitor environmental variables with

109 relatively high temporal and spatial coverages. Ammonia measurements with large, daily global 110 coverage are challenging and lacking, partly due to the relatively short (hours to a day) lifetime 111 of NH₃ near the Earth's surface, and partly because its retrievals require high sensitivity that can 112 be only obtained from areas with high thermal contrast (TC, the temperature difference between 113 that of the surface temperature and of the first discernable atmospheric layer) near the surface 114 (Clarisse et al., 2010). First measurements of ammonia from space were reported over Beijing 115 and San Diego, CA areas, as examples, with the Tropospheric Emission Spectrometer (TES, 116 Beer et al., 2008) and in biomass burning plumes with the Infrared Atmospheric Sounding 117 Interferometer (IASI, Coheur et al., 2009) satellite. Shephard et al. (2011) documented the TES 118 ammonia retrieval methodology. TES NH_3 data has been utilized jointly with GEOS-Chem in 119 various emission source studies (e.g. Alvarado et al., 2011; Pinder et al., 2011; Walker et al., 120 2012; Zhu et al., 2013). Luo et al. (2014) compared TES NH₃ versus carbon monoxide (CO) 121 ratios, using data from the year 2007, to those of the GEOS-Chem model with a focus on 122 biomass burning emissions using TES representative volume mixing ratio values (Shephard et al., 123 2011).

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125 The first global map of ammonia was created from IASI measurements by correlating observed 126 brightness temperature differences between strong NH₃ absorbing channels and weak ones to 127 NH₃ total columns using averaged datasets from 2008 (Clarisse et al., 2009). It was later 128 concluded that this method tends to underestimate the global emission inventories at a number of 129 global NH₃ hotspots using IASI radiances. Clarisse et al. (2010) examined the ammonia amounts 130 in the San Joaquin Valley of California in the U.S. using an optimal estimation (OE) retrieval 131 method (Rodgers, 2000) with a global uniform a priori and IASI radiances and compared them 132 with TES measurements. They studied the factors influencing the ability to use satellite infrared 133 (IR) instruments to retrieve accurate NH₃ columns and concentrations, finding that the main 134 factors were NH₃ concentrations and thermal contrast. They concluded that through retrieval and 135 forward radiative transfer model runs, if both of the NH₃ concentrations and thermal contrast are 136 large enough, it is possible to quantify ammonia near the lowest level of the atmosphere. R'Honi 137 et al. (2013) discussed the elevated concentrations of NH₃ and HCOOH emitted by the 2010 138 Russian wildfires. Heald et al. (2012) used IASI ammonia products jointly with the GEOS-Chem 139 output to study inorganic aerosol loading and atmospheric ammonia concentrations over the U.S. 140

141 Global ammonia sources and variability based on continuous monitoring with longer than a 142 decade record (13 years) have not been hitherto available. This study introduces a newly 143 developed daily and global ammonia product from the Atmospheric Infrared Sounder (AIRS) on 144 the NASA EOS Agua satellite, spanning September 2002 through August 2015. The AIRS orbit 145 covers nearly the entire globe twice daily, and due to cloud clearing, recovers up to 70% of 146 cloudy coverage (Susskind et al., 2003; Warner et al., 2013). Additionally, AIRS is in the 147 afternoon Equator crossing time; and therefore, it offers high sensitivity due to higher surface 148 temperature and provides higher thermal contrast to NH₃ measurements.

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In the next section, we detail the methodology used to develop the global products of NH₃ and present the discussions for data quality. In Section 3, we show examples of validation cases using in situ data from a recent NASA aircraft mission – DISCOVER-AQ (Crawford et al., 2014) (http://discover-aq.larc.nasa.gov). Section 4 illustrates the global distributions of the NH₃ sources. We demonstrate the seasonal variability of NH₃ concentrations using AIRS 13 year measurements in Section 5, before summarizing results in Section 6.

157 2. Methodology

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159 The AIRS instrument is a grating spectrometer with 2378 separate spectral channels between $650-2670 \text{ cm}^{-1}$ (15.3-3.8 µm) with a spectral resolving power on the order of 1200. Twelve 160 channels of the AIRS radiances in the window regions $(860 - 875, 928 - 932, and 965 - 967 \text{ cm}^{-1})$ 161 162 ¹) are currently used to retrieve NH₃. These channels are carefully selected so that the retrievals 163 are based on the NH₃ sensitivity, while the effects of the surface and overlapping gases are 164 minimized. AIRS cloud clearing, described by Susskind et al. (2003), increases the data coverage 165 significantly to nearly 50 - 70% of the total measurements, instead of the pure clear coverage of approximately 10 – 15% at a 13.5 km² single-view pixel size (Warner et al., 2013). AIRS NH₃ 166 167 retrievals are based on the cloud-cleared radiances (CCRs) from AIRS L2 products. The 168 averaging kernel (AK) peaks at about 918 hPa giving AIRS good sensitivity to lower 169 tropospheric NH₃ because the planetary boundary layer generally extends above this altitude at 170 the overpass local time of 1:30 pm.

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172 The algorithm used in this AIRS NH₃ study was based on a retrieval module developed for AIRS 173 carbon monoxide (CO) products (Warner et al., 2010). This module was built upon and added to 174 the current AIRS operational system or team algorithm (Susskind et al., 2003), but used a 175 different minimization method. The NH₃ module uses AIRS Version 6 (V6) Level 2 (L2) 176 profiles and errors from the previous retrieval steps (i.e., surface, clouds, water vapor, ozone, 177 methane, CO) as input to the AIRS forward model - the Stand-alone AIRS Radiative Transfer 178 Algorithm (SARTA) (Strow et al., 2003). We used SARTA with the addition of NH_3 as a 179 variable gas, which was carried out by co-author Strow and co-workers, since the official AIRS 180 forward model does not include NH₃ absorption as a variable. AIRS NH₃ retrievals use an OE 181 method following the formulations given by Rodgers (2000), and also described by Pan et al., 182 (1998). The OE retrieval output quantities not only include the NH₃ concentrations, but also 183 provide the AKs, the error covariance, and the degrees of freedom for signal (DOFS), which 184 benefit model verifications and data assimilation by using well-quantified errors.

Given a model of the instrument's signals, in the OE method, the forward equation for the NH₃profile retrieval problem can be written as:

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189
$$y = f(x, b) + n_{,}$$
 (1)

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where **y** is the vector of measured radiances, **x** is the state vector (variables to be retrieved from the measurements), **b** represents all other parameters used by the forward model, $\mathbf{f}(\mathbf{x}, \mathbf{b})$ is the forward model function, and **n**, is the instrument noise. For the variables that obey a Gaussian distribution, this inverse problem is equivalent to the maximum likelihood solution. By using a Newtonian iteration; the solution to equation (1) can be written as (Rodgers, 2000):

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$$X_{n+1} = x_a + C_a K_n^T (K_n C_a K_n^T + C_e)^{-1} [y - y_n - K_n (x_a - x_n)]$$
 (2)

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where n is the order of iteration and C_e is the measurement error covariance matrix.

200 Kn = $\partial f(\mathbf{x},\mathbf{b})/\partial \mathbf{x}$ is the jacobian matrix for iteration *n*, which is the sensitivity matrix of the

forward model to the state vector \mathbf{x} . $\mathbf{x}_{\mathbf{a}}$ is the mean of the a priori distribution and $\mathbf{C}_{\mathbf{a}}$ is the a

202 priori error covariance matrix for x_a .

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As defined by the retrieval formulations, the AKs are computed using the following:

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$$206 \quad \mathbf{A} = \mathbf{C}_{\mathbf{a}} \mathbf{K}^{\mathrm{T}} \left(\mathbf{K} \mathbf{C}_{\mathbf{a}} \mathbf{K}^{\mathrm{T}} + \mathbf{C}_{\mathbf{e}} \right)^{-1} \mathbf{K}$$
(3)

207

208 and,

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$$\mathbf{x}' \approx \mathbf{A}\mathbf{x} + (\mathbf{I} - \mathbf{A})\mathbf{x}_{\mathbf{a}},\tag{4}$$

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where **I** represents the identity matrix and **x** is the true state. Equation (4) states that in the absence of other error sources the retrieved state is a weighted mean of the true state and the a

214 priori state, with the weight **A** for the true state and **I-A** for the a priori. This shows the

- 215 importance of AKs as diagnostics of the retrieval. The closer the matrix A is to the identity
- 216 matrix the more the retrieved state resembles the true state.

218 The optimal estimation method requires an a priori mean profile and a corresponding error 219 covariance matrix that represent the current knowledge of the geophysical property, i.e., NH₃, 220 prior to the retrieval. Due to the high spatial variability and short lifetime of NH₃, a simple fixed 221 a priori for all emission scenarios is not appropriate. We developed a global mean, multi-year 222 averaged (2003-2012), three-tier a priori from GEOS-Chem model (v9-02) simulations for high, 223 moderate, and low pollutions. We used GEOS-5 MERRA datasets from the NASA Global 224 Modeling and Assimilation Office (Rienecker et al., 2011) to drive the meteorological fields in 225 the GEOS-Chem simulations. Figure 1 shows the a priori mean profiles (solid curve with 226 squares) and the error covariance matrices (horizontal bars) for the low (left panel), the moderate 227 (middle panel), and the high pollution (right panel), respectively. The high pollution range was 228 defined by profiles with Volume Mixing Ratios (VMRs) greater than or equal to 5 parts-per-229 billion-volume (ppbv) at the surface. The moderate pollution range includes the profiles with 230 surface VMRs greater than or equal to 1 ppby but less than 5 ppby, or greater than 1 ppby at any 231 level between the surface and 500hPa. The low pollution is then defined as being lower than the 232 lower bounds of the moderate pollution range. The profiles were adjusted to match AIRS 233 forward model levels. The modeled profiles are extrapolated near the surface with additional 234 constraints to eliminate high values in the model near the surface, which are likely seen by 235 satellite sensors.

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237 The same set of the three-tier a priori profiles is used globally and throughout the AIRS data 238 record. Thus, any spatial and temporal NH₃ variations detected using this algorithm are from 239 AIRS measurements. To select one of the three a priori profiles for each AIRS pixel, we examine 240 the brightness temperature difference between a strong and a weak channel, divided by the 241 measurement noise of the strong channel, defined as a "difference of brightness temperature 242 index" (DBTI). This is similar to the method used by TES NH₃ and described by Shephard et al. 243 (2011). The DBTIs vary with meteorological conditions and, most importantly, the thermal 244 contrast at the surface. To take into account of these effects, we simulate the relationship 245 between the brightness temperature differences and TC under various meteorological conditions 246 using SARTA. We randomly picked 13790 profiles from AIRS L2 products over land from the 247 months of January, April, July, and October in years 2003, 2008, and 2011. We then perturbed

the NH₃ values spanning the three a priori mean profiles using the range of 0 – 100 ppbv
multiplied by a random number for each atmospheric profile. The observed brightness
temperatures are compared with the simulated values at a given TC to determine the level of a
priori for the full retrievals. Figure 2 depicts a relationship between the DBTI and DOFS for the

three emission levels with low emissions in blue, moderate emissions in green, and high

253 emissions in red. The higher DBTIs are correlated with higher DOFS, which represent higher

surface thermal contrast (Deeter et al., 2007).

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256 The NH₃ retrieval quality assurance levels are determined based on the retrieval sensitivities 257 under various meteorological and surface conditions using the AKs and the DOFS. We also take 258 into account the performance of the retrievals against surface thermal contrasts from AIRS products. Additionally, we examine the retrieval residuals, χ^2 , and the number of iterations to set 259 proper quality assurance flags. The retrieval residuals in Kelvin (K) are defined by the square 260 261 root of the mean variance of the observed brightness temperatures minus calculated. The NH₃ 262 retrieval quality is affected by the meteorological properties, such as the vertical temperature and 263 water vapor profiles, surface temperatures, and emissivity, which are used to model the 264 atmosphere. We also adapt the error information provided by the AIRS CCR for the relevant 265 channels, which includes meteorological quantities that are used in deriving the AIRS CCR 266 (http://disc.sci.gsfc.nasa.gov/AIRS/documentation/v6 docs/v6releasedocs1/V6 Level 2 Cloud 267 Cleared Radiances.pdf). This error information is flagged by Q0, Q1, and Q2 with Q0 having the highest quality and Q2 being unusable. In the remaining discussions of this study, we used γ^2 268 269 between 0.9 and 27, considering that the channels used are not all spectrally independent. The 270 number of iterations limit was set at 10, meanwhile, only the cases with retrieval residuals less 271 than 1 K are used. We also excluded cases with the surface thermal contrast between -4 and +4 K, 272 to avoid ambiguous a priori levels; however, this primarily affects areas over the global oceans. 273 Any additional screening of the data for higher quality requirements, e.g., the use of DOFS, will 274 be discussed case by case. Although we have developed AIRS NH₃ products for all available 275 datasets, only the daytime and land cases are discussed in this study. Additionally, only radiances 276 with quality flag as Q0 are selected for the discussions in the following sections to ensure the 277 best accuracy.

3. Validation with in situ measurements

- 281 Validations of retrievals using in situ measurements are vital to quantifying uncertainties in the 282 concentrations, sources, transport patterns, and trends using satellite data. Direct measurements 283 of tropospheric NH₃ are relatively sparse and in situ measurements above the ground level, 284 necessary to validate satellite retrievals, are available for only limited locations and time periods 285 (e.g. Nowak et al., 2007, 2010, and 2012). Validation of AIRS NH₃ datasets with available in 286 situ measurements is a continuous effort as more in situ measurements become available. As an 287 example of our validation effort, we use the DISCOVER-AQ NH₃ measurements over California 288 (https://www-air.larc.nasa.gov/cgi-bin/ArcView/discover-aq.ca-2013--). The sampling inlet and 289 NH₃ calibration set-up used during DISCOVER AO with the cavity ring down spectrometer 290 (CRDS) (G2103, Picarro Inc.) is the same as used with the Chemical Ionization Mass 291 Spectrometry (CIMS) and described in Nowak et al. (2007). The CRDS, aboard the NASA P-3B 292 aircraft during DISCOVER-AQ CA, data period covers January 16 to February 06, 2013. The in-293 situ NH3 vertical profiles were made in the Southern San Joaquin Valley of California. This 294 region inside the central valley of California, between the coastal mountains in the west and the 295 Sierra Nevada Mountains in the east, consists largely of farmland with scattered dairy 296 farms. Although most of the area is rural, the profiles were made near the small cities of Hanford 297 and Corcoran. We only select spiral profiles from the flights within 45 km of the center of the 298 retrieved AIRS profiles, for the closest match, and within 3 hours of the measurement window, 299 similar to the method used for AIRS CO validation (Warner et al., 2006).
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301 Figure 3 shows four retrieval profiles that show high NH₃ concentrations and meet the matching 302 criteria, where the red curves represent AIRS retrieved profiles, gray curves are the a priori 303 profiles, green solid lines are in situ spiral profiles, and the blue dashed lines are the convolved 304 in situ profiles by AIRS NH₃ AKs. The in situ spiral profiles are taken by flying an aircraft in the 305 spiral shape in descending or ascending order near a central location, hence are the closest to 306 being the true vertical profiles. Note that in Fig. 3, the x-axis is linear from 0 to 25 ppbv and logarithmic from 25 to 150 ppbv. The convolved in situ profiles take into account satellite 307 308 retrieval sensitivities, making them appropriate to compare against satellite retrievals (Rodgers

and Connor, 2003). The convolution calculations follow Eq. (3) and (4) in Sec. 2. The top left

310 panel shows a case measured on January 16, 2013 with the retrieval quality at 0, DOFS at 0.64, χ^2 at 1.91, the retrieval residual at 0.07 K, and the measurement time differences at 1.31 hours. 311 The distance between the in situ profile and the center of the AIRS profile is approximately 13.5 312 313 km. The top right panel shows four in situ profiles from January 21, 2013 with AIRS retrieved profile quality at 0, DOFS at 0.66, χ^2 at 1.26, the retrieval residual at 0.07 K, the time differences 314 ranging from 0.58 to 1.68 hours, and the distance differences at approximately 56 km for all four 315 316 profiles. The two profiles in the bottom left panel are also from January 21, 2013, with quality at 0, DOFS at 0.83, χ^2 at 0.31, the retrieval residual at 0.06 K. The time differences to the AIRS 317 retrieved profile are 1.02 and -1.25 hours, and the distances are 38.3 and 38.7 km, respectively. 318 319 In the bottom right panel, there are four profiles taken from February 4, 2013, with the retrieval profile quality at 0, DOFS at 0.84, χ^2 at 1.1, and the retrieval residual at 0.05 K. The time 320 321 differences between the in situ and the retrieved profiles are 1.63, 1.40, -0.47, and -0.71, and the 322 distances are 5.1, 45.2, 4.9, and 45.2 km, respectively. Some of the AIRS retrievals collocate 323 with several in situ profiles, and these show substantial spatial variability.

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325 Over regions with high NH₃ in situ concentrations, the convolved in situ profiles agree with the retrievals within <1 to ~3 ppbv ($\sim5-15\%$) near the top of the boundary layer, as seen in the top 326 two panels in Fig. 3. These two AIRS NH₃ profiles show good retrieval sensitivities with DOFS 327 at approximately 0.64 and 0.66, χ^2 at 1.91 and 1.26, and the residual at 0.07 K, respectively. The 328 top left in situ profile is relatively close (13.5 km) to the center of the AIRS pixel, whereas the 329 330 top right in situ profiles are further away (~46 km) from the center of the AIRS pixel. When the 331 NH₃ amount is low and there is very little sensitivity in AIRS measurements, the convolved 332 profiles converge to the a priori profiles, as seen in the profiles with low NH₃ concentrations in 333 the top right panel and in the bottom left panel. In the bottom right panel, there are four in situ 334 profiles close to the AIRS profile - the AIRS pixel measures the average effect of the area 335 represented by the four in situ profiles. Below 925 - 950 hPa in height, the in situ NH₃ mixing 336 ratios are significantly higher than the retrieved profiles, indicating a limitation of satellite 337 remote sensing in capturing near surface composition properties. Note again that each AIRS profile covers a surface area of 45 km² where in situ observed NH₃ amounts can vary by a factor 338 339 of ten. The aircraft in situ flights sometimes are biased by their proximity to strong local point 340 sources. Therefore, the differences between the retrievals and in situ measurements are likely due to sampling issues, although the retrieved profile matches the average of the in situ profiles as

discussed above. Nonetheless, the vertical profiles show good agreement ($\sim 5 - 15\%$) between

343 AIRS NH₃ and the in situ profiles in the examples given above.

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345 4. Global Ammonia Concentrations

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347 The AIRS global NH₃ VMRs at 918 hPa, averaged from September 2002 through August 2015, 348 are shown in the upper panel of Fig. 4. The lower panel in Fig. 4 shows the total occurrences of 349 elevated concentrations (VMRs \geq 1.0 ppbv at 918 hPa) for the same dataset. The occurrences, in 350 numbers of days, are good indicators of the types of emission sources either due to recurring 351 agricultural practices or episodic forest fires. It is important to analyze the NH₃ VMRs together 352 with the occurrences to identify major emission sources. Another important quantity used in the 353 NH₃ source analysis is the retrieval DOFS. Figure 5 shows the AIRS NH₃ DOFS values being in 354 a range of 0.1 to slightly above 1.0. The regions with DOFS greater than 0.4 are generally 355 associated with high NH₃ concentrations and strong signal to noise ratios. We used a threshold 356 level of DOFS of 0.1 to screen the retrievals in the Fig. 4 top panel to eliminate noise and to 357 focus on where AIRS sensitivity is high. Areas with DOFS < 0.1 in the whole data record are 358 indicated in white. The AIRS retrievals are sensitive to NH₃ concentrations in the lowest layer of 359 the atmosphere between 850 hPa and the surface, with sensitivity peaking at approximately 918 360 hPa based on the retrieved AKs (not shown). Therefore, we use NH₃ VMRs at this level for all 361 discussions in this study. There are diurnal variations in the datasets (not shown) that may be due 362 to a number of factors including the day-night differences of emissions and chemical reactions 363 and possibly measurement sensitivities, which are beyond the scope of this paper and will be 364 studied at a later time. Also note that the missing data over land in certain regions are either due 365 to high elevation (above the 918 hPa altitude level), and therefore not shown, or persistent 366 cloudy days.

367

368 Globally, AIRS shows strong NH₃ hotspots from biogenic and anthropogenic sources including

369 South Asia (India/Pakistan), East Asia (China), the central U.S., parts of Europe, Southeast Asia

370 (Thailand/Myanmar/Laos), the central portion of South America, and Western and Northern

371 Africa, where both the NH₃ VMRs and the frequent occurrences are high. The primary sources

- 372 for these regions are from human activities, e.g., livestock waste management and other
- agricultural activities. The NH₃ concentrations over these hot spots vary from ~2.5 to above 10
- 374 ppbv, averaged over 13 years covering both strong and weak emission periods. Also seen are
- 375 large regions of high NH₃ concentrations due to biomass burning events over Russia, Alaska,
- 376 South America, Africa, and Indonesia, represented by high VMRs and low occurrences. High
- 377 concentrations of NH₃ are persistent over South America and reflect emissions from biomass
- 378 burning that are trapped by the Andes
- 379 <u>http://earthobservatory.nasa.gov/IOTD/view.php?id=8033&eocn=image&eoci=related_image.</u>
- 380 The hot spot over South Asia corresponds to the heavily populated Indo-Gangetic Plain with
- 381 plentiful, fertile croplands and extensive livestock, and bounded on the north by the Himalayas
- 382 (Yamaji et al., 2004). The absolute maximum on Fig. 4 is found over the Punjab which has the
- 383 highest population density in Pakistan.
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385 To understand the persistent emission sources, we filtered the NH₃ VMRs with the collocated 386 occurrences of elevated concentrations (≥ 1.4 ppbv) greater than 40 days; and the results are 387 shown in Fig. 6 top panel. Although a sufficient concentration (≥ 1.4 ppbv) threshold is used to 388 calculate occurrences of the persistent sources, we used all VMR values, with DOFS greater than 389 0.1, for the VMR maps. The persistent NH₃ sources not only include those large regions listed 390 above, but also include small geographical areas such as in the San Joaquin Valley of central 391 California in the U.S. (with low sulfur emissions and where livestock are plentiful); the Po 392 Valley, Italy; Fergana Valley, Uzbekistan; Azerbaijan; the Nile Delta and along the banks of the 393 Nile River in Egypt; and the Sichuan Basin in China. Some of these source locations are 394 consistent with those previously reported by Clarisse et al. (2009). These emission hotspots are 395 compared with the "Pasture and Cropland Map" (see middle panel in Fig. 6), posted by 396 http://OurWorldInData.org, located at the Institute for New Economic Thinking at the Oxford 397 Martin School. AIRS NH₃ source regions are strongly correlated with cropland areas, e.g., over 398 India, China, the middle U.S., Western Africa, eastern South America, and Europe. Note that 399 four of the strongest emission regions correspond to high percentage irrigated agricultural areas 400 (see bottom panel in Fig. 6), i.e., over Pakistan, India, northern Italy, and Azerbaijan adjacent to 401 the Caspian Sea. The irrigated agricultural land includes that irrigated by controlled flooding. 402 These data are provided by the World Bank (data.worldbank.org) where the color values are the

403 percent agricultural irrigated land of total agricultural land. These irrigation activities are

404 associated with periods of fertilization and ammonia release. Sommer et al. (2004) studied the

relationship between the fertilizing time and the ammonia release time and indicated that the

406 fertilizers applied in March can be released in the June to August time frame depending on the

407 amount of precipitation. The irrigation practices may have the same effect as high amounts of

- 408 precipitation.
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410 Over China, the AIRS retrieval can match high-resolution inventories distinguishing the two 411 major animal husbandry areas in east-central China (Henan, Shandong, and Hebei provinces) as 412 well as Sichuan to their southwest (Huang et al., 2012). Additional weaker, but persistent, NH₃ 413 sources are also seen in the Fig. 6 top panel that are likely related to livestock and agriculture 414 practices. These source regions include areas in eastern North Carolina (consistent with Wu et al., 415 2008), Arizona near Phoenix, in the east coast of Spain near Barcelona and Águilas, and over 416 large areas in the Netherlands, in Mozambique in Africa, and the Gambela National Park region 417 between Ethiopia and South Sudan.

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419 **5.** Seasonal Variability

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421 Seasonal variations are shown in Fig. 7 in the four NH₃ VMR maps, averaged between Sept. 422 2002 and Aug. 2015, for December-January-February (DJF, upper left panel), March-April-May 423 (MAM, upper right panel), June-July-August (JJA, lower left panel), and September-October-424 November (SON, lower right panel), respectively, with DOFS greater than 0.1 and no cutoff for 425 the VMRs. Globally, the highest concentrations are in the NH summer and spring seasons, with 426 the exception from strong biomass burning (BB) sources, i.e., over South America, the Southeast 427 Asia, and Russia in the NH fall season. The highest NH₃ concentrations over non-BB dominant 428 regions occur over India, China, the Mid-West U.S., and part of Europe in the summer months. 429 The longest high concentration seasons are over northern India, collocated with the measurement of high NH₄⁺ in the precipitation over India reported by Kulshrestha et al. (2005). The seasonal 430 431 NH₃ VMR distributions in China, Europe, and the U.S. are also consistent, to a large extent, with 432 the Paulot et al. (2014) study of agricultural emissions inventory derived by high-resolution 433 inversion of ammonium wet deposition data. This is especially true for the spring season, as seen in Fig. A1 of Paulot et al. (2014), showing MASAGE_NH3 (Magnitude and Seasonality of
Agricultural Emissions for NH₃, https://fpaulot.bitbucket.org/MASAGE/) emissions of NH₃ from
fertilizers.

437

438 High average concentrations (Fig. 7) with low frequencies of occurrences (Fig. 8) generally 439 indicate NH₃ from biomass burning (BB). The greatest emissions from BB in the NH appear in 440 the summer months over Siberia and eastern Russia as well as over Alaska, U.S. The highest 441 concentrations due to BB in the SH appear over South America in September to November 442 (spring for the SH) when precipitation is minimal and burning extensive (Oliveras et al., 2014). 443 Over SE Asia where the dry season and most BB occur in March to May, we find another local 444 maximum (Lin et al., 2013). Over Africa high concentrations from BB occur in the Western and 445 Central regions, although both high concentrations and frequencies of occurrences appear in the 446 Sahel just south of the Sahara in the NH winter. In that region persistent burning of agricultural 447 waste has been reported (Haywood et al., 2008); see also http://rapidfire.sci.gsfc.nasa.gov/cgi-448 bin/imagery/firemaps.cgi.

449

450 Ammonia seasonal variations are presented (Fig. 9) using the monthly mean VMRs averaged 451 over the 13-year period. Simple hemispheric averages of NH₃ concentrations for all cases do not 452 accurately reflect the seasonality of the important agricultural activities in the NH, due to the 453 mixing with BB cases and low NH₃ regions, as well as regions with missing values due to weeks 454 of persistent cloud cover. To understand how NH₃ emissions vary seasonally due to human 455 activities, we focus on the NH₃ concentrations from the continuous emission sources. As in the 456 case of Fig. 6, where we showed continuous sources using screening by the occurrences of 457 elevated concentrations, we select the occurrence thresholds at concentration levels higher than 458 1.4 ppbv on at least 40 days of the 13-year record. Figure 9 shows the monthly mean variations 459 of NH₃ (solid line) in both the NH (upper panel) and the SH (lower panel); the dashed lines show 460 the $\pm 1\sigma$ (standard deviation, STD) and the shaded areas represent the maximum and minimum 461 range of each dataset. In the NH, the high emission period starts in April and the NH₃ 462 concentrations peak in June. The NH average of the VMR concentrations from April through 463 July is in the range of 3.7 - 4.0 ppby; and it gradually decreases to the minimum of below 2 ppby 464 in November-December-January. The range of monthly mean variability between different years

465 is also larger from April to September (at \sim 1 ppbv) than in the winter months (at \sim 0.4 ppbv). The 466 STD decreases from the summer values of 0.6 ppbv to 0.3 ppbv in the winter.

467

468 Seasonal variation in the SH (lower panel in Fig. 9) shows that the primary sources of NH₃ 469 emission are from BB, as was seen in the NH₃ seasonal maps (e.g., Fig. 7). Although the filtering 470 for the continuous emission sources eliminated some large occasional fires (i.e., over Indonesia), 471 there are still regularly occurring fires, such as those over the central part of South America. The 472 NH₃ concentrations in the SH peaks in September with an average value near 3.5 ppbv and 473 decreases sharply after the SH spring season. The season of high concentrations in the SH is 474 much shorter than in the NH, as demonstrated by the widths of the seasonal distribution curves. 475 The largest STD occurs in September with a magnitude of 2 ppby, but the variation between 476 different years in the winter is very small (~0.25 ppbv).

477

478 **6.** Summary

479

480 The AIRS ammonia (NH₃) measurements with a 13-year data record provide global daily maps, 481 identify major source regions, and show seasonal cycles. This enables studies for detailed 482 locations of the sources and their spatial and temporal variations. The AIRS NH₃ products using 483 the optimal estimation (OE) retrievals provide retrieval sensitivity properties, in addition to NH_3 484 concentrations, such as: the averaging kernels (AKs), error covariance matrices, and the degrees 485 of freedom for signal (DOFS). This will facilitate sensor inter-comparisons, model verifications, 486 and data assimilation of satellite retrievals. AIRS measurements can not only capture high 487 biomass burning emissions (e.g., over Russia, Alaska, South America, Africa, and Indonesia) 488 and/or accumulated concentrations such as in various valleys (e.g., San Joaquin Valley, 489 California in the U.S., the Po Valley, Italy, Fergana Valley, Uzbekistan, and the Sichuan Basin in 490 China), but also emissions due to routine animal feeding and agriculture activities (e.g., 491 Azerbaijan, Nile Delta and along the banks of the Nile River in Egypt, the Mid-West U.S., North 492 Carolina, U.S., the east coast of Spain, in the Netherlands, in Mozambique and Ethiopia, Africa, 493 and especially the Indo-Gangetic Plain of South Asia). Over China, the AIRS retrieval can match 494 high-resolution inventories distinguishing the two major animal husbandry areas in east-central 495 China and the Sichuan Basin. Preliminary validation results show excellent agreement with in

- situ airborne measurements (to within 5-15% of the retrieved profiles). Note that since each
 AIRS profile covers a surface area of 45 km² where the NH₃ amounts can vary largely, the
 simple numerical differences may not be the optimal way to validate satellite ammonia products.
- 499

500 We use frequent occurrences of NH₃ elevated concentrations to select persistent sources. This 501 distinguishes the NH₃ emissions due to human activities versus occasional fires or retrieval noise. 502 We show the persistent ammonia sources correlate well with cropland usage, particularly in 503 regions where irrigation is a routine practice. We show the hemispheric seasonal variation using 504 sources screened by the high NH₃ frequent occurrences. The NH high NH₃ concentrations occur 505 in the spring and summer with highest from April to July and lowest in November through 506 January. In the SH, the NH₃ concentration is highest in September, this is most likely due to BB 507 emissions shown by the high VRMs and relatively low frequent occurrences.

508

509 Detailed examinations of specific regions are needed and will be included in future studies to 510 improve our understanding of the processes that control the NH₃ distribution and variability. The 511 recent NH₃ trends from AIRS 13-year measurements will also be a subject of future studies since 512 the scope of this paper is to focus on the algorithm details and the global distributions. Results in 513 this study are focused on land and daytime only. Future studies will include more complicated 514 surface types, i.e., ocean surfaces and regions with lower thermal contrast. The diurnal variations 515 will also be an important topic in the future studies. We have used the pixels with the highest quality cloud-cleared radiances (at 45 km² spatial resolution) defined by the earlier steps of AIRS 516 517 retrievals, while a future direction will be to also use the higher spatial resolution single-view pixels (at 13.5 km²) under clear-sky conditions (Warner et al., 2013). 518

519

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521

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749				
750	Figure Captions:			
751				
752	Fig.1. The <i>a priori</i> profiles and the square root of the diagonal terms of the error covariance			
753	matrices for the low pollution (left panel), the moderate pollution (middle panel), and the high			
754	pollution scenarios (right panel), respectively.			
755				
756	Fig. 2. Correlation between the DBTI (Difference of Brightness Temperature Index) and DOFS			
757	(Degrees Of Freedom for Signal) for the three emission scenarios with low pollution in blue,			
758	moderate pollution in green, and high pollution in red.			
759				
760	Fig. 3. AIRS NH ₃ validation against CRDS (the cavity ring down spectrometer) spiral profiles			
761	collected during the DISCOVER-AQ CA (01/16-02/06, 2013). The red curves represent AIRS			
762	retrieved profiles, gray curves are the <i>a priori</i> profiles, green solid lines are <i>in situ</i> spiral profiles,			
763	and the blue dashed lines are the convolved profiles using AIRS NH ₃ AKs. The x-axis is linear			
764	from 0 to 25 ppbv and logarithmic from 25 to 150 ppbv.			
765				
766	Fig. 4. Upper panel: AIRS global NH ₃ VMRs at 918 hPa, averaged from September 2002			
767	through August 2015. The colorbar is linear from 0 to 5 ppbv and 5 to 10 ppbv, but with			
768	different increments. Lower panel: The total occurrences (number of days) of high			
769	concentrations (VMRs > 1.0 ppbv at 918 hPa) in the 13-year period. Red/blue colors indicate			

770	relatively high/low	occurrences of high concentration	s respectively
,,0	ionaci vory mgm/10 m	occurrences of mgn concentration	, iespeceriery.

- Fig. 5. AIRS NH₃ DOFS values averaged over September 2002 August 2015 period. Red/blue
 colors indicate relatively high/low DOFS, respectively.
- 774
- **Fig. 6.** Top panel: The NH₃ VMRs from the persistent sources filtered with the collocated
- occurrences of elevated concentrations (\geq 1.4 ppbv) using a threshold of greater than 40 days;
- 777 Middle panel: Pasture and Cropland Map (<u>http://OurWorldInData.org</u>); and Bottom panel:
- irrigated agricultural land areas (data.worldbank.org).
- 779
- **Fig. 7.** AIRS NH₃ VMRs at 918 hPa averaged between September 2002 and August 2015 for
- 781 December-January-February (DJF, upper left panel), March-April-May (MAM, upper right

panel), June-July-August (JJA, lower left panel), and September-October-November (SON,

- lower right panel), with DOFS greater than 0.1 and no cutoff limit for the VMRs. Red/purple
- colors indicate relatively high/low NH₃ VMRs.
- 785
- Fig. 8. As in Fig. 7 except for the occurrences of high concentrations (VMRs ≥1 ppbv). Red/blue
 colors indicate relatively high/low occurrences of high concentrations.
- 788
- **Fig. 9.** The NH₃ monthly mean variations (solid line) in the NH (upper panel) and the SH (lower
- panel), respectively. The long-dash lines show the 1σ standard deviation (STD); and the shaded
- areas represent the maximum and minimum range of each dataset.
- 792

793 **Footnotes for Figure 6:**

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- The World Bank provided the statement that the maps displayed on the World Bank web site are
- for reference only and do not imply any judgment on the legal status of any territory, or any
- rendorsement or acceptance of such boundaries.

















