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Estimation of Rain Rate from PSD Airborne Doppler W-band Radar in CALWATER2 --Manuscript Draft--

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Luca Baldini, Italian National Research Council Editor, Atmospheric Section Journal of Atmospheric and Oceanic Technology AMS

Dear Sir

I wish to submit the paper *Estimation of Rain Rate from PSD Airborne Doppler W-band Radar in CALWATER2* to JTECH. I will be corresponding author.

Regards,

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Cost Estimation and Agreement Worksheet

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| 1 | Estimation of Rain Rate from PSD Airborne Doppler W-band Radar in CALWATER2. |
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ABSTRACT

17 The NOAA Physical Science Division (PSD) W-band radar was deployed on a NOAA P-3D 18 aircraft for 7 flights during a study of atmospheric rivers (AR's) associated with storm fronts off 19 the US West coast in 2015 as part of the CALWATER2 field program. This paper presents an analysis of processing measured equivalent radar reflectivity factor (Z_{em}) profiles to estimate 20 21 precipitation rate based on attenuation of Z_{em} due to absorption and scattering by raindrops at W-22 band. The first method uses the observed decrease of Z_{em} with range below the aircraft to 23 estimate column mean precipitation rates. The second method uses the difference in measured 24 and calculated normalized radar cross section ($NRCS_m$ and $NRCS_c$) retrieved from the ocean surface. Since NRCS_c is fairly well-characterized as a function of wind speed and off-nadir 25 26 angle, the difference $(NRCS_m - NRCS_c)$ represents a total column attenuation estimate which yields a total column average rain rate estimate below the aircraft. These W-band radar retrieved 27 rain rates are compared to estimates from two other systems on the P-3: a stepped frequency 28

29 microwave radiometer (SFMR) and a wide swath radar altimeter (WSRA). We also compute

30 mean profiles of Z_e , rain drop gravitational fall velocity, rain attenuation, and precipitation rate in

bins of rain rate. A method of correcting measured profiles of Z_{em} for attenuation to estimate

32 profiles of non-attenuated profiles of Z_e is examined.

34 1.0 Introduction

35 Precipitation is one of the most difficult and confounding meteorological variables to measure 36 accurately and to sample sufficiently for meaningful averages. Most applications (e.g., 37 hydrology, oceanic salinity budgets, global energy balances, soil moisture analysis) require gridaveraged precipitation rates. Because of the greatly patchy nature of precipitation, adequate 38 39 sampling makes the use of surface-based conventional rain rates problematic. Ground-based 40 scanning radars and satellite-borne radars can greatly improve sampling but introduce a host of 41 accuracy issues (e.g., Lee and Zawadzki, 2006; Haynes et al. 2009). Two common issues with 42 radar-based methods are the absolute calibration of the radar and the variation of radar-rain retrieval relationships with precipitation microphysics (Steiner et al. 2004; Lee and Zawadzki, 43 2006). Conventional raingauges have biases associated with wind effects on collection 44 efficiency that are geometry dependent (Koschmeider 1934) and they provide an estimate for 45 only rain rate. Disdrometers, which measure the rain drop size distribution (DSD) offer a 46 superior surface characterization of precipitation microphysics because both rain rate, R, and 47 equivalent radar reflectivity factor, Z_e , can be computed from the observations. 48

Whilst precipitation reaching the surface is the overarching variable in many weather 49 50 application, precipitation formation processes are a critical research topic. Observational 51 research into cloud/precipitation microphysical relationships has been dominated by airborne in situ DSD and ground-based mm-wavelength Doppler radar observing systems (Kollias et al., 52 2007). The advent of DSD and Doppler spectrum moment techniques (Frisch et al. 1995, 1998) 53 increased the utility of remote-sensing methods which have subsequently expanded to a variety 54 55 of approaches (including multi-wavelength, multi-Doppler peak, clear-air versus drop scattering modes; for more information, see Tridon et al. 2013, Williams 2016). Airborne mm-wavelength 56

radars (Galloway et al., 1999) have greatly expanded the scope of radars to investigate the spatial 57 distribution and vertical structure of precipitating cloud systems. One important weakness of 58 moment-based methods in estimating precipitation rate is that the 0th, 1st, and 2nd moments of the 59 radar reflectivity-weighted Doppler velocity spectrum are essentially the 6th, 7th, and 8th moments 60 of the DSD for the Rayleigh-type scattering (see Eq. 9 in Frisch et al. 1995). Thus, radar 61 moment methods may poorly constrain rain rate retrievals which is essentially the 3.67th moment 62 of the DSD. An independent constraint of one or more of the lower-order DSD moments could 63 improve radar rain rate retrievals. In this paper we use radar attenuation, which is approximately 64 65 the 1st moment of the DSD, as a constraint to estimate profiles and layer-averaged rain rates below an airborne W-band Doppler radar. 66

The observations we are using are from the NOAA Physical Science Division (PSD) W-67 band radar (Moran et al. 2012) deployed on a NOAA P-3D aircraft for 7 flights during the 68 CALWATER2 field program off the US West coast in 2015 (Ralph et al. 2016). This paper 69 presents an analysis of processing measured equivalent radar reflectivity factor profiles to 70 estimate precipitation rate using the observed decrease of Z_{em} with range below the aircraft. The 71 72 rain rate is approximately proportional to the attenuation coefficient in rain (i.e., the slope of the 73 reflectivity profile, assuming a prevalence of attenuation effects over changes of non-attenuated reflectivity Z_e) as described in Matrosov (2007). A second but related method to estimate rain 74 75 rate uses the measured normalized radar cross section $(NRCS_m)$ retrieved from the return of the 76 ocean surface. Since *NRCS* is fairly well-characterized as a function of wind speed and angle relative to nadir (Li et al. 2005), the calculated $NRCS_c$ is independent of radar attenuation. Thus, 77 the difference between the measured and calculated *NRCS* represents the total column 78 79 attenuation, which is also known as the path integrated attenuation (PIA). As with the

reflectivity gradient rain rate method, the estimated PIA is related to rain rate such that PIA
yields an estimate of the total column average rain rate below the aircraft (Meneghini et al.
1983). The total rain rate estimates retrieved from the W-band radar measurements are
compared to estimates from two other systems on the P-3: a stepped frequency microwave
radiometer (*SFMR*, Uhlhorn et al. 2007) and a wide swath radar altimeter (*WSRA*, Walsh et al.
2014).

86 2.0 Experimental Details

a. CALWATER2

The CalWater-2015 field deployment off the US West coast included NOAA's flagship 88 89 Research Vessel Ronald H. Brown (RHB), as well as a P-3 and G-IV aircraft. The DOE-90 sponsored Atmospheric Radiation Measurement (ARM) Cloud Aerosol Precipitation Experiment (ACAPEX) campaign provided the DOE ARM Mobile Facility 2 (AMF2) observing system, 91 92 mounted on the NOAA vessel, as well as the DOE G-1 aircraft and support for aerosol and 93 microphysics sensors at the coast. The NASA ER-2 aircraft flew several missions as well with remote sensors tailored partly for validation of a prototype space-based sensor being tested on 94 the International Space Station. The California Department of Water Resources (DWR)-95 sponsored statewide extreme precipitation network, tailored to observe landfalling ARs, was a 96 foundation of the experiment. The observation period was January through March, 2015. Here 97 98 we discuss measurements taken on the NOAA P-3 aircraft.

b. P-3 measurements

100 NOAA's WP-3D Orion aircraft are equipped with a unique array of scientific

101 instrumentation, radars and recording systems for both *in situ* and remote sensing measurements

of the atmosphere, the earth and its environment (<u>http://www.omao.noaa.gov/learn/aircraft-</u>
<u>operations/aircraft/lockheed-wp-3d-orion</u>). Rain rate values were estimated from two systems
on the P-3: the SFMR and the WSRA. These estimate rain rate averaged over altitudes below
the aircraft. *In situ* sensors provided flight level meteorological and navigation information. The
P-3 also deployed 80 dropsonde profilers during the period in the region near 37° N Latitude and
127° W Longitude.

The observations we are focusing on are from the NOAA Physical Science Division (PSD)
W-band radar deployed on the P-3 for 7 flights between January 27 and February 9, 2015. The
radar is described in depth by (Moran et al. 2012). Initial deployments were ship-based (Moran
et al. 2012; Ghate et al. 2014) but aircraft deployments began in 2013 (Fairall et al. 2014).
Aircraft deployments include tropical storm Karen, hurricane Patricia, and CALWATER2.

113 c. *Radar Settings*

The W-band radar operated in one Doppler spectra mode with a focus on measuring rain below the aircraft. Doppler spectra were recorded to disk every 0.3 seconds and the first 3 moments (i.e., 0th, 1st, and 2nd) were calculated to estimate reflectivity, mean Doppler velocity, and mean Doppler velocity spectrum width. Pertinent radar operating parameters are listed in Table 1. Note that the first range gate was set to 489 m below the aircraft to avoid destroying the receiver from strong surface returns when the aircraft was below 500 m altitude.

120

3. Radar-Precipitation Relationships

121 *a. Processing for Radar Reflectivity and Surface Cross-section*

122 For distributed targets within a radar resolution volume, the measured reflectivity factor, 123 $Z_{em}(r) \,(\text{mm}^6 \,\text{m}^{-3})$, at range $r \,(\text{km})$ is related to the received power, $P_r(r)$, via

124
$$Z_{em}(r) = C_{radar} \frac{\lambda^4}{\pi^5 |K|^2} P_r(r) r^2$$
 (1)

125 where $|K|^2 = 0.82$ is the magnitude squared of the complex refractive index of water at the radar 126 operating wavelength λ =3.17 mm, and C_{radar} is the radar calibration constant that incorporates 127 all radar gains and losses. After calibrating the PSD W-band radar antenna at an antenna range 128 and with careful determination of system losses (including a 1.6 dB radome loss – see section 129 3c), absolute reflectivity accuracy is expected to be approximately ±1 dB. Due to attenuation at 130 W-band frequencies, the equivalent reflectivity factor, $Z_e(r)$ at range r, is given as

131
$$Z_e(r) = Z_{em}(r) \exp[0.2\ln(10)\int_0^r \gamma_{total}(s)ds]$$
 (2)

where γ_{total} is the total specific attenuation (dB km⁻¹) at range *s* (km) of length *ds* (km) and is composed of specific attenuations from oxygen γ_0 , water vapor γ_{vapor} , cloud γ_{cloud} , and precipitation γ_{rain} . The total specific attenuation can be expressed at

135
$$\gamma_{total}(s) = \gamma_o(s) + \gamma_{vapor}(s) + \gamma_{cloud}(s) + \gamma_{rain}(s)$$
 (3)

With regard to surface returns, the W-band radar observes a strong spike in measured reflectivity factor, Z_{em} , from the ocean surface (Fairall et al, 2013) which is referred to as the ocean scattering cross section, $\sigma_0 = \eta_0 * dR$ (where dR is the radar range gate thickness). Measured reflectivity factor is converted to measured normalized radar cross-section (*NRCS_m*) using

141
$$NRCS_m = 10*\log_{10}(\sigma_0) = 10*\log_{10}[\frac{\pi^5 |K^2|}{\lambda^4} dR] + dBZ_{em} - 180 + Corrections$$
 (4)

where $dBZ_{em} = 10\log_{10}(Z_{em})$, 180 is a conversion factor converting reflectivity factor from mm⁶ m⁻³ to m³ and the corrections include 1.6 dB for the radar window in the belly of the aircraft 2way attenuation plus combined attenuation along the beam by water vapor, oxygen, rain, and clouds. At W-band and with 25 m range resolution, the first term on the right hand side of (4) is 137.9. The equation to estimate *NRCS_m* is

147
$$NRCS_m = dBZ_{em} + 137.9 - 180 + 1.6 + G(h)$$
 (5)

where G(h) is the total path-integrated attenuation (PIA) by water vapor, oxygen, clouds, and rain.

150 b. Rain Profile Retrievals using Reflectivity Gradient

151 After correcting for attenuation, the simplest rain rate R in mm hr⁻¹ retrievals are typically 152 based on Z_e -R power-law relationships of the form

$$153 Z_e = a_z R^{b_z} (6)$$

154 Z_e -R relationships are estimated in several ways: e.g., fitting observed Z_e versus surface-based 155 rain measurements or using airborne or ground-based measurements of the rain DSD to compute 156 non-attenuated values of Z_e and R. Rain rate can be expressed as a function of Z_e by inverting (6)

157
$$R = [Z_e / a_Z]^{1/b_z} = a_Z^{-1/b_Z} Z_e^{1/b_Z}$$
(7)

Note that expression (7) is poorly posed for retrieving rain rate at W-band, in part, because Z_e at W-band includes both Rayleigh scattering regime for small raindrops and Mie scattering regime for drops greater than about 0.8 mm in diameter. The Mie scattering regime reduces the value of Z_e as rain rate increases. Dual-polarization methods can alleviate some of these problems and improve rain rate estimates (Bringi and Chandrasekar 2001), but thesemethods are not applicable at nadir views.

164 The relationship between rain specific attenuation and rain rate can be expressed with a165 power-law of the form (Matrosov 2007)

$$166 \qquad \gamma_{rain} = a_{\gamma} R^{b_{\gamma}} \tag{8}$$

167 Some estimated coefficients from previous studies are given in Table 2. Given a data scatter in 168 the $\gamma_{rain} - R$ correspondence the relation (8) could be assumed to be linear with $b_{\gamma} = 1$ (Matrosov 169 2007). Thus, a linearized mean relationship between the attenuation coefficient γ_{rain} and rain rate 170 is

171
$$R = c\gamma_{rain} [\frac{1.1}{\rho_a(z)^{0.45}}]$$
 (9)

where c=1.11 km/dB mm/h as estimated from T-matrix modeling using drop size distributions (DSDs) collected with the Joss-Waldvogel disdrometer during a Hydrometeorology Test Bed (HMT) field project in California (Matrosov 2010), and the term on the right is a dimensionless correction factor accounting for an increase in rain drop fall velocity as the air density ρ_a (in kg m⁻³) decreases with height *z*, above the surface. For linear $\gamma_{rain} - R$ relationships, a density correction of 1.04 was used which corresponded to an altitude of 1.0 km and CALWATER2 atmospheric conditions.

Since attenuation coefficients are usually specified in dB/km, they can be related to the
vertical gradient of measured *dBZ_{em}* as

181
$$\frac{d(dBZ_{em})}{dz} = \frac{d(dBZ_{e})}{dz} + 2(\gamma_{rain} + \gamma_{v})$$
(10)

where the first term in the right hand side describes changes of non-attenuated reflectivity dBZ_e , assuming the cloud attenuation can be neglected compared to rain attenuation, and the factor of 2 in this equation arises because the radar has a two-way path; $\gamma_v = \gamma_o + \gamma_{vapor}$. A stratus cloud with a liquid water content of 0.1 g/m³ would have an attenuation of approximately 0.4 dB/km – roughly comparable to rain with rate of 0.5 mm/hr (e.g., Matrosov 2009). If the vertical gradient of dBZ_e (non-attenuated reflectivity) is small compared to that due to attenuation, the rain attenuation can be computed from the slope of dBZ_{em} vs altitude

189
$$\gamma_{rain} = 0.5 \frac{d(dBZ_{em})}{dz} - \gamma_{v}$$
(11)

190 where each term in (11) is height dependent.

The 'Bootstrap' values given in Table 2 are obtained from relationships based on NRCS rain rates and observed attenuation and reflectivity, i.e., solely determined by Calwater2 W-band observations. The P-3 values are computed from a Droplet Measurement Technologies Precipitation Imaging Probe (PIP) which sizes drops in 62 equally-spaced bins from 0.10 to 6.2 mm diameter.

196 *c. Path Integrated Rain Retrievals*

197 The radar backscatter from the sea surface allows another method to compute the path-198 averaged rain rate from the total attenuation from the aircraft to the surface. For our purposes 199 here we restrict the analysis to nadir pointing profiles only, so at a given wavelength the $NRCS_c$ 200 is a function of wind speed only.

201
$$NRCS_c = |F(0)|^2 / mss = f(U_{10})$$
 (12)

where U_{10} is the wind speed at a height 10 m above the ocean, $F(0)^2=0.32$ is the Fresnel reflection coefficient at 20 C for seawater at W-band at normal incidence and *mss* is the mean squared slope of the surface waves. Thus, the difference between the measured *NRCS_m* and the value, *NRCS_c*, gives a path-integrated attenuation (PIA)

$$206 \quad PIA_{R} = NCRS_{c} - NCRS_{m} - G_{v}(h) \tag{13}$$

207 where G_{ν} is the gaseous attenuation.

208
$$G_{\nu}(h) = 2* \int_{0}^{h} \gamma_{\nu}(h) dh$$
 (14)

Values of γ_v were obtained using the atmospheric absorption methods from the International 209 Telecommunications Union (/www.itu.int/dms_pubrec/itu-r/rec/p/R-REC-P.676-3-199708-210 211 S!!PDF-E.pdf). For CALWATER2 we computed $G_v = 2.2$ dB for h=alt=2.5 km using the mean water vapor, temperature and pressure profiles from 19 CALWATER2 sondes dropped in the 212 213 observation region by the NOAA G-IV on 05 Feb. 2015 (precipitable water path of 2.2 cm from the surface to 2.5 km altitude). Profiles of dBZ_{em} were corrected by 1.6 dB+ $G_v(h)$ +0.6 dB. The 214 value 1.6 dB is the transmission window loss and 0.6 dB is a correction to force observed NRCS 215 to agree with experimental values in Li et al. (2005) at a wind speed of 1.0 m/s. $G_{\nu}(h)$ was 0.07 216 dB at the first radar range gate and 2.20 dB at the surface. 217

218 The NRCS – based rain rate can be computed as

219
$$R_{nc} = c k(z) \frac{NRCS_c - NRCS_m - G_v(h)}{alt}$$
(15)

The advantage of (15) is that it does not require near-uniform vertical profiles of rain, but givesmean rain rate between the aircraft and the surface. The disadvantage is that it requires a

specification of $NRCS_c$. $NRCS_m$ is computed from Z_{em} at the surface as per (4). The model for $NRCS_c$ we are using is

224
$$NRCS_c = 14.1 - 0.2 * U_{10} - .004 * U_{10}^2;$$
 (16)

based on fits to *NRCS_m* for clear sky data in previous flights (but bias corrected as described above); U_{10} is obtained from the SFMR measurements. The coefficients in (16) correspond to U_{10} in m/s. If (15) yields a negative number, we set it to zero.

228 d. Profiles of
$$Z_e$$
 vs Z_{em}

A considerable amount of work is in the literature concerns retrieving the true (i.e., nonattenuated) Z_e profile from the radar-observed profile. The simplest approach is to combine (10) with a specification of attenuation in terms of Z_e as in (11)

232
$$\gamma_{rain} = \alpha_{\gamma} Z_e^{\beta_{\gamma}}$$
 (17)

In this case, Iguchi and Meneghini (1994) show that the Hitschfeld and Bordan (1954) relationcan be expressed as

235
$$Z_e(h) = \frac{Z_{em}(h)}{\left[1 - qS(h)\right]^{1/\beta_{\gamma}}}$$
 (18)

where

237
$$S(h) = \int_{0}^{h} \alpha_{\gamma} Z_{em}^{\beta_{\gamma}}(h') dh'$$
(19)

238 and

239 $q = 0.2\beta_{\gamma} \ln(10)$ (20)

Note that the integral S(h) is in terms of the <u>measured</u> Z_e , so the right hand side of (18) is solely in terms of measured quantities. For example, if we take the linear attenuation coefficient - rain rate relationship and the bootstrap Z_e -R relationship from Table 2, then, $1/\beta_{\gamma} = 1.0$, $\alpha_{\gamma} = 0.035$ and q=0.46.

The integral given by (19) is related to the attenuation. Using (18) we can compute an integral estimation of attenuation

246
$$\gamma_{\rm int} = -\frac{1}{qh} \ln[1 - qS(h)]$$
 (21)

From which we can calculate a layer-averaged profile of rain rate at each timestep. If we set *h* to the altitude of the aircraft, then (21) yields an average attenuation coefficient which can be used to estimate rain rate similar to the NRCS approach. The advantage of using (21) is that it does not require that vertical changes in unattenuated Z_e are small compared to reflectivity changes due to attenuation (as the gradient methods require).

252 4.0 Processing and Analysis

Only two flights (Feb 05 hrs 19, 20, 21; and Feb 06 hr 19) yielded significant 'stratiform' 253 254 rain that is suitable for our analysis. Here we use the term stratiform to describe wide-scale, weakly convective precipitation associated with mid-latitude AR's. We are not using it in the 255 usual radar jargon referring to broad areas of precipitation in outflow regions from deep tropical 256 convection. The flight on Feb 07 had significant rainfall which is suitable for applying the 257 258 NRCS approach but too patchy to be able to claim relative vertical homogeneity (i.e., the presence of uniform rain everywhere in a layer from the aircraft altitude to the surface). On Feb. 259 05 the aircraft was flying below a large region of precipitating clouds (i.e., it was not in cloud). 260

In some periods there were low-level 'scud' clouds below the aircraft with tops around 0.5 km.
Radar measurements from the NOAA ship *Ronald H. Brown* indicated cloud tops at 7 km
altitude with a freezing level bright band at about 3 km altitude.

264 An example of a radar profile measurements is shown in Fig. 1. The P-3 location during the flight is shown in Fig. 2 with indications of 10-m wind speed from the SFMR in Fig. 2a and a 265 266 visible satellite image in Fig. 2b. Measured and parameterized values of NRCS are shown in 267 Fig. 3a with resultant rain rate in Fig. 3b. In Fig. 4 we show rain rate estimates from the SFMR and the WSRA for the entire 3-hr period. The WSRA has been biased corrected for slow 268 269 variations in the transmit power. Some elements were not operating correctly and the problem was intermittent. The comparison between NRCS and SFMR retrievals is better but still not 270 271 good for lighter rain rates. At rain rates greater than about 2 mm/hr the agreement is better. The correlation coefficient between NRCS and SFMR rain rates is 0.71 while for NRCS - WSRA 272 rain rates it is 0.60. 273

The peak NRCS rain rate in Fig. 4 is about 10 mm/hr which is the approximate limit of the radar when flying at 2.5 km with 20 m/s 10-m wind speed. This is because the surface return is no longer detectable for greater rain rates (e.g., see gap in the surface return line at 19 hrs 20 min UTC in Fig. 1).

278 *a. Processing Methods*

We have examined several methods to estimate rain rate for the measured reflectivity profiles from two points of view: 1) time series of layer-averaged rain rate computed from each profile of Z_{em} and 2) profiles of radar variables averaged in bins of rain rate. The time series methods are:

1) Compute a linear regression for each observation of dBZ_e vs h of the form

284
$$dBZ_{em} = dBZ_{emi} + slope * h$$

285 where the slope of the regressions is
$$slope = \frac{d(dBZ_{em})}{dh} = -\frac{d(dBZ_{em})}{dz}$$

Rain rate is then estimated from this slope using (9) after accounting for the gaseous attenuation. The intercept, dBZ_{emi} , is reflectivity at the aircraft height (*h*=0) which is an estimate of the unattenuated dBZ_e (valid when rain is observed in the first range gate and assumes that rain is present in the whole layer from the aircraft altitude to the surface).

- 2) Compute a layer-averaged attenuation as a ratio= $(dBZ_{em}(i) dBZ_{em}(j))/(alt(i) alt(j))$ and 2) get an estimate of rain rate from the ratio using (9). This estimate is somewhat akin to the 2) *NRCS* estimate but does not depend on a surface backscatter model. Here we have used
- range gates at altitudes of 1.83 and 0.20 km.
- 294 3) Compute the integral of parameterized attenuation via (19) and estimate layer-averaged
 295 attenuation/rain rate via (21).
- 296 The bin-averaged methods use rain rate from the NRCS method:
- 4) Average the reflectivity, $\langle dBZ_{em} \rangle$, profiles in bins of rain rate; the mean attenuation profile for that bin is $d(\langle dBZ_{em} \rangle)/dh$. Thus, it yields *profiles* of mean attenuation (and therefore rain rate) for the average sample.
- 300 5) Average profiles of the derivative of the dBZ_{em} in bins of rain rate, $\langle d(dBZ_e)/dh \rangle$.

Note that the surface reference (i.e., NRCS) and reflectivity gradient approaches have been usedwith the spaceborne W-band radar aboard CloudSat.

304 *b.* Rain rate Time Series

305 An important issue to solve is how to treat the non-ideal nature of the non-attenuated 306 reflectivity profiles in the processing (Matrosov 2009). Examples of three types of dBZ_e profiles 307 are shown in Fig. 5. A glance at Fig. 1 shows periods when there is no rain at aircraft flight level or the first observable range gate (e.g., the period from 19 hrs 5 min to 13 min UTC). Thus, a 308 309 vertical derivative will indicate negative attenuation near the first range that has precipitation 310 (see the red profile in Fig. 5). Other periods (e.g., 19 hrs 55 min to 60 min) have no return in the 311 entire profile – that is, zero rain rate. The blue line in Fig. 5 shows a profile where rain only 312 occupies the height region above 1 km. The black line in Fig. 5 shows a case with significant return throughout the profile; there is a hint of sea spray causing an increase below 200 m. 313

314 *c. Time Series*

We have examined rain rate estimates using methods 1 and 2. These are pure rain dBZ_e 315 316 gradient based approaches. Both methods can produce negative rain rates and substantial overestimates of the rain rate when the precipitation below the aircraft is inhomogeneous (i.e., 317 rain is present not everywhere below the aircraft). One simple check to avoid the worse cases is 318 to require the gradient be positive or to require that the dBZ_{em} at the first usable range gate has 319 measurable rain and that the dBZ_{em} at that range gate exceeds the value of dBZ_{em} near the surface. 320 321 For example, we require $dBZ_{em}(i)>0$ and $dBZ_{em}(i)-dBZ_{em}(j)>-5$ dB (not zero because the lower range gates have higher noise levels – green line if Fig. 5). For values that do not meet the 322 criteria, we set the rain rate =0. Fig. 6 shows the rain rate time series with methods 1 and 2 as 323 defined earlier and the NCRS-based method. The three methods give roughly similar results 324 325 when the rain is reasonably homogeneous although the gradient methods are noisier. Note

overestimates with the gradient methods at the edges of rain sections for which rain is present atall altitudes and recall the NRCS method does not rely on rain being present at all altitudes.

328 Another issue is the consistency of the NRCS – based rain rate and the dBZ_e and attenuation 329 relationships (Eqs. 6 and 8). Shown in Fig. 7a is the <u>intercept</u> of the linear fit of dBZ_{em} with range versus NRCS rain rate; the intercept occurs at h=0 so it is unaffected by attenuation. Fig. 330 331 7b shows a scatterplot of attenuation coefficient as determined by the slope of the dBZ_{em} profile 332 at every time step versus rain rate. Fig. 8 is a plot of the attenuation vs the dBZ_{em} intercept; this relationship is used in the attenuation correction for the dBZ_{em} profile (Eq. 18). Note that for 333 reflectivities greater than about 60 mm⁶m⁻³ (~17.8 dBZ), the derived power-law fit between 334 attenuation coefficient and reflectivity is generally not appropriate. This may be a consequence 335 336 of non-Rayleigh backscatter at W-band, unmeasured absorption between the aircraft and the first range gate, or the effects of wetting of the radar window when flying in heavy rain. 337

338 *d.* Bin-averaged Profiles

Fig. 9 shows profiles of dBZ_{em} and vertical Doppler velocity *w* averaged in bins of rain rate as determined by the NRCS method for the three hour period on Feb. 5. The bin edges for these results are rain rate = [0, 0.25, 0.7, 1.5, 3, 6, 13] mm/hr; all rain rate averages in the remainder this paper use these edge limits. The SFMR- and WSRA-based rain rates were too noisy and uncertain to use as an index for bin averaging. The measured Doppler vertical velocity is corrected for the pitch component of aircraft motion relative to the air via

345
$$w_c = w_m + \sin(pitch)[-SOG * \cos(\psi - COG) + U_w * \cos(\psi - Dir)]$$
 (22)

The residual given by (22) should be the mean gravitational velocity of the precipitation. Here *SOG* is the aircraft speed over ground (between 100 and 140 m/s), COG is the aircraft course over ground, *pitch* is the aircraft pitch angle, ψ aircraft heading, U_w and *Dir* are the wind speed (taken from the SFMR) and wind direction (taken from the P-3 flight level data). Eq. 22 is derived from the corrections in Fairall et al. (2013) when aircraft roll=0. Some factors to note in Fig. 9:

- 1) The mean reflectivity value near the surface for the maximum rain rate is -16 dBZ which 352 353 is greater than, but close to, the radar noise level (-24 dBZ see Fig. 5). 2) The slopes at lower rain rates are confined to the upper part of the profile and are 354 actually larger than the slopes for intermediate rain rates. This likely indicates 355 356 inhomogeneous profiles with most of the rain confined within 1 km below the aircraft. Thus, attenuation deduced from this regime is not reliable (i.e., gradients of non-357 358 attenuated reflectivities are not small compared to the gradients due to attenuation). The increase in fall velocity as the drops approach the surface suggests evaporation, which 359
- 360 preferentially removes smaller drops.
- 361 3) The dBZ_{em} values at the top of the measured profiles for the two largest rain rate bins are 362 about the same. The slope for the highest rain rate shows much more attenuation so a lot 363 of the signal has been lost between the aircraft and the first range gate (about 10 dB).
- 4) Fall velocities are between 1 and 3 m/s and roughly increase with rain rate. These
 correspond to fall velocities for 0.2-0.4 mm diameter droplets which are typical for light
 rain. The W-band radar is less sensitive (relative to the Rayleigh scattering regime) to
 droplets larger than about 1 mm. Thus, smaller drops with lower fall velocities are more
 heavily weighted than for radars at longer wavelengths (e.g., K_a-band).

Finally, we present attenuation profile and rain rate profiles obtained by averaging the profile of the vertical derivative of *dBZ_{em}* in rain rate bins (method 5). While individual 0.3 s *dBZ_{em}*

profiles yield a noisy derivative profile, when averaged the results are reasonably smooth (see
Fig. 10a). We then use (9) and (11) to compute profiles of rain rate (Fig. 10b). In the latter case
we have multiplied the rain rate by the fraction of bins with detectable rain to yield an actual rain
rate including the dry periods.

375 e. Attenuation Corrections of Observed Reflectivity

376 In order to apply (18) to correct the measured dBZ_{em} for attenuation we must integrate along the entire propagation path from the aircraft to the surface. However, the radar's first range gate 377 is 0.5 km below the aircraft. Thus, we need to fill in the dBZ_{em} profile from the aircraft out to the 378 379 first range gate. We have done this by fitting a linear regression to the mean dBZ_{em} profile starting at range gate 6 and ending at range gate 25. Then, using the slope and intercept of the fit 380 to the profile, we extrapolate dBZ_{em} values in 19 additional range gates between range gate 1 and 381 the aircraft altitude. This is a total of 169 range gates going from the surface to the aircraft 382 altitude. This is illustrated in Fig. 11 where rain rate bin-averaged profiles of mean dBZ_{em} are 383 384 shown for 6 selected rain rate bin mean values. The extrapolated portion of the profiles are shown as dotted symbols. Two versions are shown: 1) the mean dBZ_{em} when rain is present and 385 the threshold conditions (SNR>-10 dB and reflectivity at the 5th range gate is -5 dB greater than 386 387 the near-surface atmospheric reflectivity) are met and 2) a mean that is the average normalized by the number of profiles that pass the criterion divided by the total number of profiles. The 388 normalization affects the values of dBZ_{em} but not the slope. For the lowest rain rate bin 27% of 389 the profiles meet the threshold criterion; for the highest bin 100% do so. 390

We have used the average measured dBZ_{em} profiles in rain rate bins and applied (18) to yield 'true' dBZ_e (i.e., with attenuation removed). We experimented with different versions of the γ - Z_e given in (17); α_{γ} =0.050, β_{γ} =1.0 and α_{γ} =0.026, β_{γ} =1.1. The first set of coefficients produced

394 larger corrections to the lower part of the profile for the cases with greater rain rates. If we increase from $\alpha_{\gamma}=0.026$ to $\alpha_{\gamma}=0.055$, then the results are similar. The main thing to notice from 395 Fig. 12 is that the corrected profiles are not vertically homogeneous. The most inhomogeneous is 396 the profile for the highest rain rate bin (average 7.8 mm/hr). In principle, we might remove some 397 398 of the vertical gradient by adjusting the coefficients. It turns out this quickly leads to a 399 singularity because qS(h) > 1.0. For example, this occurs for the higher rain rates profile if we 400 increase $\alpha_{\gamma}=0.050$ to $\alpha_{\gamma}=0.055$. It is clear that, given uncertainties in the form and coefficients of (18) and extrapolation between the aircraft and the first range gate, that there is a practical limit 401 on the total dBZ_e correction that can be made. For example, a 20 dB correction would require 402 403 1-qS(h) = 0.01, which is likely beyond the accuracy limit. Iguchi and Meneghini (1994) 404 provide an alternative to (18) where dBZ_e is known at the end of the path. Thus we could explore using NRCSm/NRCS to fix the bottom of the corrections. 405

Fig. 13 shows a layer-averaged rain rate using (21) and (9) where h=2.3 km. This approach gives a smoother representation than methods 1 and 2. However, it suffers from the same ambiguity problem as the profile retrieval method when q*S approaches 1.0.

409 f. Summary Rain rate Statistics

In Table 3 we compare simple statistics for the different rain rate estimates. We have added one estimate that is independent of the W-band radar, Rain2 – the mean of WSRA and SFMR rain rates. Rain2 has the same mean rain rate as rain from NRCS. The grand mean rain rate across all methods is 1.12 ± 0.16 mm/hr; the mean while raining is 2.26 ± 0.27 mm/hr. Note the correlation with the NRCS rain rate is lower while raining for methods 1 and 2 and the integral method. This is because the excursions from zero to finite numbers between non-rainy and rainy

416 periods add correlation for those methods. When the zero periods are eliminated, the correlation417 decreases.

418 **5.0 Discussion and Conclusions**

419 In this paper we examined several approaches to estimating rain rate time series, profiles, and statistics using the radar reflectivity. The data are from the PSD W-band Doppler radar 420 421 deployed on a NOAA P-3 aircraft during the CALWATER2 field program. Our primary goal was to investigate the use of the radar signal attenuation to estimate rain rate below the aircraft 422 (observation altitude was 2.5 km). The analysis is limited to three hours from a flight in wide-423 424 scale frontal precipitation on Feb. 5, 2015. In principle, profiles of rain rate can be computed from the profile of attenuation. However, individual profiles (3 Hz acquisition rate) may be 425 poorly sampled because of the patchy nature of precipitation – this leads to noisy vertical 426 derivatives. 427

The relationship of attenuation coefficient to the rain rate was found to be near-linear and 428 quite robust with good comparisons of our observations with several others in the literature. At 429 430 rain rates near 1 mm/hr and below the observed attenuation coefficient levels off - a possible consequence of cloud attenuation. The relationships of reflectivity factor with rain rate or 431 attenuation coefficient were less robust. Our W-band radar measurements were not a good fit to 432 an assumed power law of $\gamma = \alpha_{\gamma} Z_{e}^{\beta_{\gamma}}$ (Fig. 8). This was not an issue with the fits to computations 433 using DSD's. Z_e -R relationships are rather flat because due to Non-Rayleigh scattering effects at 434 W-band reflectivity is weakly dependent on the larger rain drops. The significance is not 435 obvious because the results are somewhat sensitive to the criteria or thresholding used to 436 437 determine the slopes.

The NRCS method provided the most consistent estimate of layer-averaged rain rate from 438 439 the W-band. It is superior to Rain2, which is the average of rain rates derived from the SFMR and WSRA. However, WSRA based estimates might be superior if the instrument was operating 440 optimally. The three other methods (1, 2, 3) of estimating layer-averaged rainfall from W-band 441 dBZ_{em} profiles/gradients were not as effective as the NRCS method. The gradient methods were 442 443 unreliable in inhomogeneous rain distributions when rain is not present at all altitudes below the aricraft; the integral method had problems in the higher rain rates where it was very sensitive to 444 choice of coefficients in the $\gamma - Z_e$ relationship when $qS(h) \cong 1.0$. 445

446 Compositing
$$dBZ_{em}$$
, Doppler velocity, or $\frac{\partial dBZ_{em}}{\partial z}$ in bins of rain rate (Figs. 9 and 10a)

yields very clean profiles. The lower raintrates have anomalous gradients of dBZ_e in the upper 447 heights, presumably because light rain is occurring at higher altitudes but is not reaching the 448 449 surface. The profiles of mean gradient-derived rain rate in bins of NRCS rain rate (Fig. 10b) are smooth and the values are consistent (but about 10% higher than NRCS-based rain rate 450 451 estimates). The use of the Iguchi and Meneghini (1994) method to reconstruct un-attenuated 452 profiles of dBZ_e from the composited observed (attenuated values) was not very robust. The corrections tend to be small for the lower rain rates and subject to singularities for the higher rain 453 454 rates, for reasons explained by Iguchi and Meneghini (1994). There are more sophisticated methods to deal with this, but, in general, reconstruction methods at W-band remain 455 problematical. 456

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- 462 *Data Availability*. Raw and processed data for the PSD observations can be found at
- 463 <u>ftp://ftp1.esrl.noaa.gov/psd3/cruises/CALWATER_2015/</u>. Dropsonde profiles as Matlab.*mat*
- 464 files from the G-IV are at <u>ftp://ftp1.esrl.noaa.gov/psd3/cruises/CALWATER_2015/G4/data/</u>.
- 465 Wband radar data are at ftp://ftp1.esrl.noaa.gov/psd3/cruises/CALWATER_2015/P3/Wband/
- 466 with the moment files in netcdf format in the *mom* directory and the P-3 navigation and flight
- 467 level data in *.txt* files (which includes the SFMR) are in the *Aircraft* directory.

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- 540

| Table 1. Specifications of the PSD W-band radar for CALWATER2 flights. | | | |
|--|------------------------|--|--|
| Parameter | Value | | |
| Radar operating frequency | 94.56 MHz | | |
| Radar operating wavelength | 3.17 mm | | |
| Number of range gates | 150 | | |
| Range resolution | 25 m | | |
| Distance to first range gate | 489 m | | |
| Distance to last range gate | 4214 m | | |
| Number of Doppler velocity bins | 128 | | |
| Doppler velocity bin resolution | 0.12 m s ⁻¹ | | |
| Nyquist Velocity | 7.68 m s ⁻¹ | | |
| Number of spectral averages | 9 | | |
| Minimum detectable SNR | -20 dB | | |
| Minimum detectable reflectivity at 1 km | -34 dBZ | | |
| Dwell time per average spectrum | 0.3 s | | |
| Antenna diameter | 0.305 m | | |
| Antenna gain | 46 dB | | |
| Antenna beamwidth | 0.7 degrees | | |

Table 2. Coefficients for rain rate dependence of Z_e (6) and γ_{rain} (8) at W-band. 'Bootstrap' refers to relationship based on NRCS rain rates and observed attenuation and reflectivity. Llhermite and Kollias values are computed from Marshall-Palmer DSD. Matrosov (2007, 2010) values are computed from disdrometer DSD measurements. P-3 PIP calculations are from the airborne *in situ* DSD measurements on 6 February 2015. *Implies γ -Z_e coefficients computed from the Z_e-R and γ -R relationships.

| Source | az | bz | aγ | bγ | αγ | βγ |
|-------------------------------------|----|-------|-------|------|---------|-------|
| Lhermitte (2002) | 63 | 0.67 | 1.25 | 0.75 | 0.0121* | 1.12* |
| Kollias et al. (2003) | | | 0.89 | 0.83 | | |
| Matrosov (2007) | | | 0.81 | 1.00 | | |
| Matrosov (2010) | 36 | 1.03 | 1.13 | 0.89 | 0.051* | 0.86* |
| Direct γ - Z_e fit | | | | | 0.033 | 0.97 |
| Linear γ-R fit | | | 0.9 | 1.00 | 0.028* | 0.97* |
| Bootstrap | 25 | 0.91 | 0.93 | 1.00 | 0.026* | 1.10* |
| Direct γ - Z_e fit (Fig.8) | | | | | 0.035 | 1.0 |
| P-3 PIP | 23 | 0.94 | 0.70 | 1.00 | 0.026* | 1.05* |
| Direct γ - Z_e fit | | | | | 0.058 | 0.85 |
| linear γ - Z_e fit | | | | | 0.040 | 1.00 |
| Average Bold | 28 | 0.96 | 0.84 | 1.0 | 0.042 | 0.94 |
| Uncertainty | ±5 | ±0.04 | ±0.09 | | ±0.01 | ±0.06 |

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Table 3. Comparison of mean rain rate (mm/hr) and correlation coefficients for the different methods. The mean while raining is computed by eliminating non-raining periods from the average.

| Method | NRCS | Meth. 1 | Meth. 2 | Meth. 3 | WSRA | SFMR |
|------------------------------|------|---------|-----------------|----------|------|------|
| | | Slope | ΔZ_{em} | Integral | | |
| Mean rain rate | 1.04 | 0.98 | 1.3 | 1.1 | 1.7 | 0.6 |
| Mean while raining | 2.1 | 2.4 | 3.2 | 2.5 | 2.0 | 1.4 |
| Correlation with NRCS | 1.0 | 0.50 | 0.58 | 0.62 | 0.60 | 0.71 |
| Correlation NRCS R>0.5 mm/hr | 1.0 | 0.36 | 0.35 | 0.47 | 0.65 | 0.73 |
| Correlation with Rain2 | 0.72 | 0.46 | 0.45 | 0.35 | 0.94 | 0.96 |



Figure 1. Time-range cross-section of reflectivity (dBZ_{em}) for hours 19, 20, and 21 on Feb 05. The vertical ordinate is height above the surface (altitude); the horizontal ordinate is minutes for each hour (UTC) on Feb 05. The surface return is apparent as the bright red line at altitude near 0. The aircraft descended from 5 km to 2.5 km in the beginning of the record. Banking maneuvers are visible as the short periods of extended range in the surface return (e.g., 20 hr 53 min). Note the period just after 19 hr 20 min where attenuation is so great there is no surface return.

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- Figure 2. Upper: Flight path of the NOAA P-3 for hours 19-22 Feb 05. The color of the path
- denotes 10-m wind speed (m/s) from the SFMR. Lower: Satellite visible image with tracks from
- four aircraft up to 1928 UTC on Feb. 5.



Figure 3. Upper panel: Sample time series of modeled $NRCS_c$ (blue) and $NRCS_m$ measured including attenuation (green) from Feb 05 Hr 19 in CALWATER2. Note a few missing values just after 19.35 where rain attenuation was sufficient to eliminate the surface return (you can see this as a notch in dBZ_{em} in Fig. 1 where the surface return disappears). At the end of the record there is no precipitation so the blue and green lines coincide. Lower panel: precipitation from $NRCS_c-NRCS_m$.





579 Figure 4. As in Fig. 3. Except a smoothed form of the NRCS rain rate is shown for the entire

period 1900 through 2200. The NRCS rain rate is in black, rain rate from the WSRA (upper
panel) and SFMR (lower panel) are in red.



Figure 5. Sample observed reflectivity profiles from hr 19 on Feb. 05. The green line indicates the noise level of the radar (in dBZ_{em} terms it increases with range from the radar). The red line is early in the record with light precipitation from the surface up to 0.6 km. The blue line is later with no precipitation below 1 km. The black line is later still with precipitation all the way to the surface. The legend shows the time within the hour.

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593 Figure 6. Layer mean radar-derived rain rate estimates from Feb. 05, 2016. The *NRCS* values

(black) are compared to two different dBZ_{em} gradient estimates: upper panel, slope method;

lower panel, 2-gate differnce method. For method 2 the difference in reflectivity is computed

between the two range gates at 1.83 and 0.20 km altitude.



599Figure 7. Results from analysis of each profile using regression fits of the form

600 $dBZ_{em} = dBZ_{emi} + slope * h$. Upper panel: W-band dBZ_{em} extrapolated to the aircraft altitude as 601 a function of NRCS rain rate. Lower panel: one-way attenuation coeffcient in dB/km vs rain 602 rate. Points plotted are restricted to cases where the linear regression is a good fit to the overall 603 profile. *Mean profiles* are the average of values taken from the rain rate-bin mean dBZ_{em} (11b) 604 and the rain rate-bin mean gradient of dBZ_{em} (Fig. 10a).

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609 Figure 8. Results from analysis of each profile using regression fits of the form

610 $dBZ_{em} = dBZ_{emi} + slope * h$ where attenuation vs Z_{emi} is shown. The lines are fits from Table 2 as

611 shown above: green – HMT direct fit (line 6); red – log-log linear regression; cyan – bootstrap

⁶¹² value (line 7): magenta – Lhermitte (line 1).





Figure 9. Profiles of bin-averages of dBZ_{em} (upper panel) and pitch-corrected Doppler vertical velocity (lower panel) for three hours on Feb. 05. The legend gives the mean rain rate in mm/hr for the bins. The bin edges for these results are rain rate = [0, 0.25, 0.7, 1.5, 3, 6, 13] mm/hr.





Figure 10. Rain rate-binned averaged profiles of *dBZ_{em}* slope (upper panel) and slope converted to rain rate (lower panel) using (9) and (11). The Upper panel is for when rain is present; the lower has the rainfree normalization.





Figure 11. Mean dBZ_{em} profiles in bins of rain_nc. The upper panel is average dBZ_{em} when precipitation is present where we require $dBZ_{em}(4) - dBZ_{em}(75) > -5 dB$. The lower panel is the

precipitation is present where we require $dBZ_{em}(4) - dBZ_{em}(75) > -5 dB$. The lower panel is the same except the mean is multiplied by the fraction of profiles that meet the dBZ_{em} criterion to all

profiles. The dotted portions of the profiles above 1.9 km are the extrapolations using the slope

and intercepts.



Figure 12. Profiles of mean dBZ_e (as per Fig. 10). The upper panel is raw mean dBZ_{em} ; the lower panel is corrected using (18) with $\gamma_R = 0.05 * Z_{em}^{1.0}$.





Figure 13. As in Fig. 6, but the Z-integral method is used to compute rain rate from attenuation,as per (21).