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Evaluation of turbulent dissipation rate retrievals from Doppler Cloud Radar

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Abstract. Turbulent dissipation rate retrievals from cloud radar Doppler velocity measurements are evaluated using independent, in situ observations in Arctic stratocumulus clouds. In situ validation data sets of dissipation rate are derived using sonic anemometer measurements from a tethered balloon and high frequency pressure variation observations from a research aircraft, both flown in proximity to stationary, ground-based radars. Modest biases are found among the data sets in particularly low- or high-turbulence regimes, but in general the radar-retrieved values correspond well with the in situ measurements. Root mean square differences are typically a factor of 4–6 relative to any given magnitude of dissipation rate. These differences are no larger than those found when comparing dissipation rates computed from tethered-balloon and meteorological tower-mounted sonic anemometer measurements made at spatial distances of a few hundred meters. Temporal lag analyses suggest that approximately half of the observed differences are due to spatial sampling considerations, such that the anticipated radar-based retrieval uncertainty is on the order of a factor of 2–3. Moreover, radar retrievals are clearly able to capture the vertical dissipation rate structure observed by the in situ sensors, while offering substantially more information on the time variability of turbulence profiles. Together these evaluations indicate that radar-based retrievals can, at a minimum, be used to determine the vertical structure of turbulence in Arctic stratocumulus clouds.

1 Introduction

Turbulence plays a central role in the life cycle of clouds by influencing their formation, maintenance, and dissipation processes (Nicholls and Turton, 1986; Bretherton et al., 2004). Mixing associated with turbulent motions is responsible for entrainment (Nicholls and Turton, 1986; Stevens, 2002), which has direct bearing on the aerosols and moisture available to a cloud layer and thereby the cloud microphysical composition. Vertical mixing also shapes the atmospheric thermodynamic structure within which a cloud exists. There are multiple sources of turbulence generation within the cloudy atmosphere, including processes, such as cloud top radiative cooling, that are driven by the clouds themselves. In order to understand the physical processes operating within clouds, the coevolution of the turbulent state, cloud properties, and thermodynamic structure must be characterized.

A number of observational approaches are used to quantify atmospheric turbulence. While in situ measurements of turbulence are readily made from aircraft, balloon-borne, or surface-based instruments (e.g. Chen, 1974; Caughey et al., 1979; Fairall et al., 1980; Muschinski et al., 2001), these approaches provide an essentially one-dimensional picture and are unable to continuously monitor the vertical structure of turbulent properties over the long periods of time needed to statistically characterize cloud-turbulent processes. Better suited to this perspective is the ground-based active remote sensor approach, whereby the overlying atmosphere can be probed continuously for long periods of time. This approach has been applied to clear-air radar (e.g. Frisch and Clifford, 1974; Cohn, 1995), the spectral width
of hydrometeor-sensing Doppler radar (e.g. Brewster and Zrnic, 1986; Kollias et al., 2001), velocity time series measurements from Doppler lidar (e.g. Banakh and Smalikho, 1997; O’Connor et al., 2010) and Doppler radar (e.g. Frisch and Strauch, 1976; Bouniol et al., 2003), and velocity structure functions derived from Doppler lidar (Frehlich and Cornman, 2002) and Doppler radar (Lothon et al., 2005).

To facilitate studies of cloud life cycle processes, it is advantageous to employ an observing system that offers concurrent perspectives on both cloud and turbulence properties within an identical atmospheric volume. Short wavelength (<1 cm) cloud radars are well positioned to address this problem, as within a given atmospheric profile they contain information on the vertical location of clouds (Clothiaux et al., 2000), in-cloud vertical air motions and turbulence (e.g. Kollias et al., 2001; Deng and Mace, 2006), the phase of cloud particles (Shupe, 2007; Luke et al., 2010), and many microphysical properties (e.g. Comstock et al., 2007; Shupe et al., 2008a). Cloud radar Doppler spectral width measurements contain substantial information on turbulence; however, other processes such as wind shear and the distribution of cloud particle fall speeds can also contribute significantly to broadening of the spectral width. The latter is particularly true for precipitating or mixed-phase conditions (e.g. Gossard et al., 1997; Shupe et al., 2004). This convolution of information within a given pulse volume complicates cloud radar spectral-width based turbulence retrievals (e.g. Kollias et al., 2001).

The focus here is, instead, on a technique to characterize turbulence from time series measurements of cloud radar Doppler velocity in order to evaluate the skill with which the turbulent dissipation rate – the rate at which turbulent kinetic energy is dissipated by viscosity at small scales in the atmosphere – can be retrieved. In this case, the technique is specifically applied to observations of Arctic mixed-phase stratocumulus clouds that contain both cloud liquid water and precipitating ice crystals. While there are generally few opportunities to evaluate such retrievals in Arctic environments, this study capitalizes on two experiments where independent measurements of turbulent dissipation rate were made in the vicinity of cloud radars. The ultimate aim of this study is to evaluate the ability of operational cloud radars (e.g. Kollias et al., 2007; Illingworth et al., 2007) to derive turbulence information within mixed-phase cloud environments.

2 Methods

Observations used in this study were obtained during two Arctic field campaigns. One of these was the Arctic Summer Cloud Ocean Study (ASCOS, Sedlar et al., 2011), which took place in late summer of 2008 in the Arctic sea-ice pack near 87.4°N, 8°W. During this campaign, ground-based sensors, including cloud radar, were deployed aboard the Swedish icebreaker R/V Oden to observe the atmospheric turbulent structure. Complementary turbulence measurements were made using a tethered balloon system and an instrumented meteorological tower installed on the adjacent sea-ice. The second campaign was the Mixed-Phase Arctic Clouds Experiment (MPACE, Verlinde et al., 2007), which occurred in October 2004 near the US. Department of Energy Atmospheric Radiation Measurement (ARM) program’s North Slope of Alaska (NSA) facility in Barrow, Alaska, USA. The basic experiment design consisted of flying a heavily instrumented research aircraft to measure cloud and atmosphere properties above the permanent, ground-based instrument suite at the NSA site.

2.1 Radar retrieval

Turbulent dissipation rates evaluated in this study are derived from identical, vertically-pointing, 35-GHz, Millimeter Cloud Radars (MMCR, Moran et al., 1998) operated during these two experiments. In each case the “stratus” operational mode is utilized, as it has been optimized for observing low-level clouds and is sensitive enough to observe most hydrometeors in the lower troposphere (see Table 1). The fundamental measurement of interest is the mean Doppler velocity, which characterizes the reflectivity-weighted, mean motion of hydrometeors within a quasi-cylindrical radar sample volume of 45-m vertical depth and 1- to 3-m radius depending on cloud height. Doppler velocity measurements are only possible when hydrometeors are present within the volume and measurements are only used in the retrieval if they have a signal-to-noise ratio greater than −13 dB. The variance of the measured mean Doppler velocity in time, $\sigma_{vm}^2$, can be represented as (Lothon et al., 2005)

$$\sigma_{vm}^2 = \sigma_w^2 + \sigma_{vt}^2 + 2\text{cov}(w, vt)$$

(1)

where $\sigma_w^2$ and $\sigma_{vt}^2$ are the variance contributions due to the vertical air motions (i.e. turbulence) and changes in the terminal fall speed of hydrometeors, respectively, and the final term is the covariance between vertical air motions and terminal fall speeds.

The retrieval applied to Arctic mixed-phase stratocumulus has been outlined in Shupe et al. (2008b) and is based on principles developed by Rogers and Tripp (1964), Bouniol et al. (2003), and O’Connor et al. (2005) for slightly different cloud regimes and radars. Briefly, it has been shown that the variance in measured mean Doppler velocity can be represented as

$$\sigma_{vm}^2 = \frac{1}{k} \int_{k_1}^{k} S(k) dk = \frac{3A}{2} \left( \frac{\varepsilon}{2\pi} \right)^{2/3} (L_1^{2/3} - L_s^{2/3}),$$

(2)

where the turbulent energy spectrum is $S(k) = A\varepsilon^{2/3} k^{-5/3}$, $A$ is the Kolmogorov constant which is assumed to be 0.5

$^1$Note that the dissipation rates presented in Shupe et al. (2008b) are moderately different from those presented here due to a different assumed value for the Kolmogorov constant.
show that the variance due to hydrometeor fall speeds is an order of magnitude smaller than the total variance of the mean Doppler velocity. Their measurements also indicate that while there is significant covariance between vertical air motions and hydrometeor fall speeds, as has also been observed for Arctic mixed-phase stratocumulus (Shupe et al., 2008c), the covariance acts on scales that are predominantly larger than the scales important for dissipation of turbulence. Thus, it is expected that the primary assumptions for the current retrieval will hold unless the radar is sampling eddies, via $L_1$, that are larger than the turbulent inertial subrange (O’Connor et al., 2005) or if the correlation scales between vertical motions and microphysical properties become small (Lothon et al., 2005).

These assumptions will be evaluated using an example mixed-phase stratocumulus cloud that occurred on 28 August 2008 during ASCOS. A time-height plot of the radar-derived turbulent dissipation rate for this case is shown in Fig. 1c. The basic structure of the cloud consisted of a 300–400 m thick layer of super-cooled liquid water ($T \approx -10^\circ C$) within which ice crystals formed and then fell down towards the surface. This structure is typical of Arctic mixed-phase stratocumulus (e.g. Shupe et al., 2006). On this day there was a distinct transition in the turbulent structure at about 06:00 UTC associated with a moderate lifting of the cloud layer as weak easterly winds flowed under the otherwise northerly winds associated with the cloud layer.

The wide range of derived dissipation rates during this case allows for a nice evaluation of the basic retrieval assumptions; namely, that the variance in measured mean Doppler velocity is dominated by turbulence (i.e. it follows a typical Kolmogorov form with a turbulent inertial subrange having a $-5/3$ slope) and that the length scales sampled for the retrieval reside within the inertial subrange. Power spectra have been calculated via fast Fourier transforms of $10^11$ samples (~2h) of radar mean Doppler velocities at a given height (Fig. 2). Time series for these analyses have been selected both above and below the cloud base at times before and after the transition at 06:00 UTC in order to examine a range of conditions. In each case, the high frequency end of the spectra have an approximate $-5/3$ slope, which is characteristic of the inertial subrange. Horizontal wind speeds during this case were approximately 4 m s$^{-1}$, such that the largest scale sampled for the radar retrieval was 240 m. It is clear that in each case the transition from inertial subrange to outer turbulent scales occurs at scales longer than 240 m. Thus, both primary assumptions are well supported by these examples.

Theoretical retrieval uncertainties due to measurement errors are also evaluated here following the methods outlined by O’Connor et al. (2010) for a similar retrieval applied to Doppler lidar. The basic steps are only briefly covered here, while a much more detailed description and derivation is available in O’Connor et al. (2010). A first order of business is to evaluate the radar noise contribution to the calculated variance of Doppler velocities as

Table 1. MMCR specifications for the “stratus” operational mode.

<table>
<thead>
<tr>
<th>Specification</th>
<th>Value</th>
</tr>
</thead>
<tbody>
<tr>
<td>Wavelength</td>
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</tr>
<tr>
<td>Beamwidth</td>
<td>0.31°</td>
</tr>
<tr>
<td>Dwell time</td>
<td>1 s</td>
</tr>
<tr>
<td>Time resolution</td>
<td>4 s</td>
</tr>
<tr>
<td>Range gate length</td>
<td>45 m</td>
</tr>
<tr>
<td># of Coherent Averages</td>
<td>6</td>
</tr>
<tr>
<td># of Spectral Averages</td>
<td>10</td>
</tr>
<tr>
<td># of FFT points</td>
<td>256</td>
</tr>
<tr>
<td>Nyquist velocity</td>
<td>5.27 m s$^{-1}$</td>
</tr>
</tbody>
</table>

(Sreenivasan, 1995), $\varepsilon$ is the turbulent dissipation rate, $k$ is the wave number, and $L$ is the length scale given by $L = 2\pi/k$. Two length scales of interest are $L_s$, which is the length of the scattering volume for the 1-s radar dwell time including larger eddies passing through the observation volume, and $L_1$, which represents the larger eddies passing through the effective sample volume that results from averaging radar observations over 60 s. Following Taylor’s frozen turbulence hypothesis (Taylor, 1935), these length scales can be related to the sampling volume geometry and the horizontal wind speed by $L = Ut + 2R \sin(\theta/2)$, where $U$ is the horizontal wind speed, $t$ is the sample time (1 or 60 s), $R$ is the range to the pulse volume, and $\theta$ is the radar beamwidth. Horizontal wind speed is interpolated to the radar time-height grid from collocated wind profiler measurements (449-MHz profiler at ASCOS, 915-MHz profiler at MPACE) with nominal 30-min time resolution; however, if wind profiler measurements are not available or inconsistent in time, winds are derived via interpolation from the nearest in time radiosoundings. Rearranging Eq. (2) provides a simple equation for the dissipation rate as

$$\varepsilon = 2\pi \left( \frac{2\sigma_{vm}^2}{3A (L_1^{2/3} - L_s^{2/3})} \right)^{3/2}.$$  (3)

Fundamental assumptions used to derive these equations are that the length scales of the turbulent eddies observed by the radar (i.e. $L_1$ and $L_s$) reside within the inertial subrange of the turbulence spectrum and that turbulent air motions, as opposed to variability in particle terminal fall speeds due to cloud microphysical properties, are the dominant contribution to variability of the mean Doppler velocity in Eq. (1) on the scales of interest.

2.2 Evaluating retrieval assumptions and uncertainty

The two primary assumptions made in this retrieval have been shown to hold for ice clouds and drizzling stratocumulus (Bouniol et al., 2003; O’Connor et al., 2005), both of which have some properties that are similar to mixed-phase stratocumulus. Lothon et al. (2005) used focused aircraft in situ measurements in drizzling stratocumulus to show that the variance due to hydrometeor fall speeds is an order of magnitude smaller than the total variance of the mean Doppler velocity. Their measurements also indicate that while there is significant covariance between vertical air motions and hydrometeor fall speeds, as has also been observed for Arctic mixed-phase stratocumulus (Shupe et al., 2008c), the covariance acts on scales that are predominantly larger than the scales important for dissipation of turbulence. Thus, it is expected that the primary assumptions for the current retrieval will hold unless the radar is sampling eddies, via $L_1$, that are larger than the turbulent inertial subrange (O’Connor et al., 2005) or if the correlation scales between vertical motions and microphysical properties become small (Lothon et al., 2005).

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\[ \sigma_e^2 = \frac{\Delta v^2 \sqrt{8}}{\alpha N_s} \left(1 + \frac{\alpha}{\sqrt{2\pi}}\right)^{3/2} \]  

(4)

\[ \alpha = \frac{\text{SNR} \ B}{\sqrt{2\pi \Delta v}} \]  

(5)

where \( \Delta v \) and SNR are the spectrum width and signal-to-noise ratio measurements, respectively, \( B \) is the receiver bandwidth, which is twice the Nyquist velocity, and \( N_s \) is equal to the SNR multiplied by the number of radar pulses for a given sample, which is the product of the number of spectral averages, coherent averages, and FFT points given in Table 1. The noise contribution to the variance has been included in each panel of Fig. 2 for reference. It is clear that under conditions of moderate to high turbulence the noise contribution to the velocity variance is not significant relative to the turbulent contribution. However, under lower turbulence conditions, the high frequency end of the power spectrum in Fig. 2d becomes approximately constant at the computed noise level. This behavior is expected if the velocity measurements and their measurement error are uncorrelated (Frehlich, 2001). Moreover, the fact that the computed variance due to noise is consistent with the observed high end of this spectrum indicates that Eq. (4) is a reasonable approximation of the noise contribution. This noise variance is subtracted from the calculated velocity variance when used in Eq. (3), a correction that generally has little impact except for at the smallest dissipation rates.

For a given velocity variance calculation, the noise contribution is taken here as the average \( \sigma_e \) over all points included in the sample. The total measurement error in velocity variance is then estimated as (Lenschow et al., 2000; O’Connor et al., 2010)

\[ \Delta \sigma_{vm}^2 \approx \sigma_{vm}^2 \sqrt{\frac{4 \ \sigma_e^2}{N \ \sigma_{vm}^2}}, \]  

(6)

where \( N \) is the number of mean Doppler velocities used to compute the variance. Finally, to determine the total fractional error in the dissipation rate retrieval, standard error propagation is applied to a simplified version of Eq. (3) that assumes \( L_l \gg L_s \). Given the large difference in relative sampling times for each length scale, this assumption is valid. Thus, the fractional error in dissipation rate is given as

\[ \frac{\Delta \varepsilon}{\varepsilon} = \frac{3 \Delta \sigma_{vm}}{\sigma_{vm}} + \frac{\Delta L_1}{L_1}. \]  

(7)

The fractional error in determining \( L_l \) is directly related to the error in measurement of horizontal wind speed. While instantaneous measurements of wind speed from wind profilers...
or radiosondes are expected to have a relatively small error, the primary contribution here is likely from variability of the wind speeds during the wind profiler’s averaging time period (~30 min) or from temporal interpolation of radiosonde winds. Here we assume that this error is approximately 50%.

Time-height fields for both the fractional measurement error in velocity variance and the fractional error in dissipation rate are shown for the 28 August 2008 case in Fig. 1b and d, respectively. This case suggests increased errors under conditions of low dissipation rate. More general results, derived from multiple days’ worth of retrievals for each experiment, are exhibited in Fig. 3. These demonstrate a clear increase in error as dissipation rate decreases. Additionally, distributions of fractional error in dissipation rate show relatively more high errors during ASCOS relative to MPACE, in part due to a higher fractional occurrence of the lowest dissipation rates. In general, fractional errors are less than 250%, although these errors could be somewhat different if the contribution due to uncertainty in wind speed varies from the assumed 50%. It is also important to note that the extent of fractional errors in dissipation rate is limited here because the radar measurements are limited to relatively large signals (i.e. SNR greater than −13 dB).

2.3 Evaluation measurements and methods

Before introducing specific data sets, it is important to note that because the dissipation rate values considered here occur over as many as five orders of magnitude, the logarithms (base 10) of the dissipation rates are used in most figures, tables, and discussions. This logarithmic perspective more clearly reflects the differences and/or uncertainties in the data relative to their magnitude over a very wide range. To illustrate this point, a factor of 2 difference at a dissipation rate of $1 \times 10^{-6}$ m$^2$s$^{-3}$ is much smaller than a factor of 2 difference at a dissipation rate of $1 \times 10^{-3}$ m$^2$s$^{-3}$, while in a relative sense they are equivalent. This perspective should be kept in mind when interpreting the information provided in the following discussions. For example, a root mean squared (RMS) difference of 1.0 between two logarithmic data sets implies differences of an order of magnitude in the raw data, while an RMS of 0.6 implies differences of a factor of 4 (i.e. $10^{0.6} = 4.0$).

During ASCOS, a tethered SkyDoc aerostat balloon was flown from a station on the sea-ice approximately 160 m from the icebreaker. Hanging 10 m below the balloon was an instrument package that included a Gill Instruments Windmaster sonic anemometer housed in an aerodynamic enclosure along with purpose-built control and data acquisition electronics (hereafter referred to as the “tethersonde”). A serial communications interface allows the system to be configured from a laptop in the field, while data is recorded internally on a micro-SD data card. Power is provided from an external, rechargeable 12-V battery pack, allowing rapid replacement between flights and almost continuous operation. The sonic anemometer measures the 3 components of the turbulent wind at 40 Hz then internally averages these to 10 Hz before recording.

On a moving platform, measured wind components are contaminated by the motion and changing orientation of the sensor. Dissipation rate can be determined from the measured power spectral density $S$ without motion correcting the wind measurements by utilizing a portion of the inertial subrange at frequencies higher than those that characterize the platform motion (e.g. Yelland et al., 1994). Here, the portion of the spectrum used in these calculations is restricted to frequencies greater than 2 Hz. For a large fraction of its flight time, the tethersonde was operated in a profiling mode — ascending or descending at a mean rate of approximately 0.3 m s$^{-1}$. The averaging period used to calculate the dissipation rate is thus a tradeoff between minimizing the uncertainty in each individual estimate (longer averaging times) and localizing the estimate vertically (shorter averaging times). A 2-min averaging period has been adopted here, providing a vertical resolution of approximately 36 m during profiling, broadly comparable to the 45-m vertical resolution of the radar. Comparisons are made during cases on 24–30 August 2008.

In order to check the validity of the tethersonde dissipation rate estimates, they are compared with those determined from similar Gill and Metek sonic anemometers mounted at 15 m and 30 m, respectively, on meteorological towers installed on the sea-ice surface approximately 225–275 m from the balloon launch site. All data points included in this comparison are for the tethersonde at altitudes within 15 m of the tower-mounted anemometers. The general correspondence of tethersonde and tower-derived dissipation rates is good with a correlation coefficient of 0.71 (Fig. 4). Most of the statistical measures in Table 2 indicate that the agreement between these measures becomes somewhat worse at the highest observed values. The RMS difference for the full dataset...
is 0.75 log (m$^2$ s$^{-3}$), which indicates that the RMS is on the order of a factor of 5.5 times the dissipation rate at any given value.

The error in individual dissipation rates derived from sonic anemometers is expected to be very small because the measurement error in $S$ is much smaller than $S$ itself. Thus, spread in the comparison is likely due to both the horizontal separation of the sensors and vertical averaging of the tethersonde data in a near-surface environment that can have large vertical gradients in dissipation rate. To examine the spatial issues in more detail, a lag analysis was applied to the tethersonde and tower-mounted observations in this comparison as an approximation of spatial differences. The lag analysis effectively compares the dissipation rates determined from one 2-min sample with those from following samples made by the same sensor. Results are consistent for both tower and tethersonde measurements, showing RMS values of 0.3 and 0.36 log (m$^2$ s$^{-3}$) at 2- and 4-min lag, respectively. These values indicate that a significant portion of the difference between tethersonde- and tower-derived dissipation rates is likely related to spatial differences.

For point-to-point comparisons and statistics relating the ASCOS radar retrievals and tethersonde measurements, the radar retrievals are simply averaged over the same 2-min time period as the tethersonde measurements since the latter were typically made within a few hundred meters of the vertical radar beam. This approach has previously been used with the same tethersonde to evaluate dissipation rates from a ground-based Doppler lidar (O’Connor et al., 2010).

During MPACE, turbulent dissipation rate was derived from high frequency true airspeed measurements made using pitot tubes at both nose and wing locations onboard the University of North Dakota Citation research aircraft. Turbulence calculations assume isotropy and are based on structure functions applied to the airspeed measurements over running 10-s (~800 m) windows reported every 1 s (e.g. Poellot and Grainer, 1991; Shupe et al., 2008b). Sources of noise or bias in the turbulence are due to noise in the airspeed measurements, which is low (M. Poellot, personal communication, 2007). Comparisons of dissipation rates derived from identical measurements at the aircraft nose and wing show high consistency with a RMS difference of 0.23 log (m$^2$ s$^{-3}$), or less than a factor of 2 at any given dissipation rate, and a correlation coefficient of 0.92. This difference in measurements between the two aircraft locations provides an estimate of the measurement uncertainty in aircraft dissipation rates used here.

Aircraft observations were filtered to remove time periods when icing affected the pressure measurement ports. For comparisons made here, only observations within 20 km laterally of the NSA radar are included and are labelled with their distance from the radar. To account for some of the spatial differences, all point-to-point comparisons and statistics are conducted using 15-min medians of the radar retrievals surrounding each aircraft observation. Aircraft flights used in the comparison occurred on 5, 6, 8, 9, and 10 October 2004.

Table 2. Statistics comparing dissipation rates derived from tethersonde measurements with 15- and 30-m tower measurements during ASCOS. Statistics are representative of tower values within specified ranges of the tethersonde-derived dissipation rates given in the left-most column. All statistics are computed using the logarithms (base 10) of the dissipation rates and include the total number of observations ($N$), median (Med), interquartile range (IQR), mean absolute difference (MAD), root mean square difference (RMS), and relative bias between data sets (Bias). For these calculations: MAD = $\sum |x - y|/N$, RMS = $\left[\sum (x - y)^2/N\right]^{1/2}$, and Bias = 2.0/$N$ $\cdot$ $\sum (x - y)/(x + y)$, where $x$ is the tethersonde data, $y$ is the tower data, and $N$ is the number of samples. All values are in units of log (m$^2$ s$^{-3}$) except for $N$ and Bias. The latter can be thought of as a factor relative to the mean value in the range of interest. A positive bias in this case, due to the fact that the logarithms are themselves negative, indicates that the tower-derived dissipation rate is larger than that from the tethersonde.

<table>
<thead>
<tr>
<th>Log($\varepsilon$) Bin</th>
<th>$N$</th>
<th>Med</th>
<th>IQR</th>
<th>MAD</th>
<th>RMS</th>
<th>Bias</th>
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<tbody>
<tr>
<td>$-5.7$ to $-5.2$</td>
<td>34</td>
<td>$-5.3$</td>
<td>0.63</td>
<td>0.43</td>
<td>0.54</td>
<td>0.04</td>
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<tr>
<td>$-5.2$ to $-4.7$</td>
<td>48</td>
<td>$-5.3$</td>
<td>0.96</td>
<td>0.51</td>
<td>0.62</td>
<td>$-0.05$</td>
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<tr>
<td>$-4.7$ to $-4.2$</td>
<td>36</td>
<td>$-4.0$</td>
<td>1.81</td>
<td>0.88</td>
<td>1.07</td>
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</tr>
<tr>
<td>$-4.2$ to $-3.7$</td>
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<td>$-3.4$</td>
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<td>0.47</td>
<td>0.59</td>
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<tr>
<td>$-3.2$ to $-2.7$</td>
<td>261</td>
<td>$-2.9$</td>
<td>0.67</td>
<td>0.64</td>
<td>0.81</td>
<td>$-0.07$</td>
</tr>
<tr>
<td>All data</td>
<td>787</td>
<td>$-3.1$</td>
<td>0.91</td>
<td>0.59</td>
<td>0.75</td>
<td>0.04</td>
</tr>
</tbody>
</table>

Fig. 4. Point-to-point comparisons of dissipation rate derived from the tethersonde and meteorological tower measurements at ASCOS. The tower measurements are made at 15 (blue) and 30 m (red). The one-to-one line is included.
3 Results

During the 28 August 2008 case at ASCOS the tethered balloon was flown through a series of three ascent-descent patterns up to heights of 500–600 m. Dissipation rates measured by the tethersonde system are shown in Fig. 1f, while radar-based retrievals subsampled at the same heights and 2-min time windows as the tethersonde measurements are given in Fig. 1e. The two independent measures of dissipation rate show broad agreement both in magnitude and in vertical and temporal changes observed during this case. Additionally, the full time-height display of radar retrievals (Fig. 1c) reveals a wealth of additional detail that is not obtainable from the tethersonde measurements.

More detailed vertical profile comparisons in a range of conditions further reveal that the radar-based retrievals are able to capture the vertical turbulent structure with some integrity. On 5 and 6 October 2004, the Citation aircraft flew multiple spiraling profiles near the NSA facility, for no more than one hour on each day, which offer a good opportunity for comparison with ground-based retrievals. Similarly, two cases were selected from the ASCOS experiment with multiple tethered-balloon soundings. The time periods for these cases on 27–28 and 29 August 2008 were chosen such that the dissipation rate profiles were relatively consistent in time for up to 12 h according to the radar retrievals, with no major transitions such as the one shown in Fig. 1. For all of these cases, radar-derived dissipation rates sampled at all heights over the time periods when in situ observations were made are statistically represented in each panel of Fig. 5.

It is noteworthy that nearly all tethersonde and aircraft samples during these cases lie within the range (5th to 95th percentile) of retrieved dissipation rates. On 5 October 2004 and 27–28 August 2008 the retrievals indicate relatively little vertical change in turbulence distributions at altitudes below about 900 m, consistent with the in situ observations. On the other hand, during 6 October 2004 the retrievals successfully represent the observed turbulence minimum in the middle of the cloud layer, while on 5 October 2004 the retrievals capture an observed increase and then decrease with ascending height near the cloud top. Lastly, while there were a few individual tethersonde measurements in disagreement, the radar suggests a diminishing amount of turbulence from 400 m down to the lower limit of the radar data at 100 m that is consistent with most of the observations on 29 August 2008.

Point-to-point comparisons between radar retrieved and in situ observed dissipation rates demonstrate reasonable correspondence in a mean sense with the primary clusters of points falling along the one-to-one lines (Fig. 6). These comparisons will be explored in more depth with the aid of scatter plots (Fig. 6), histograms (Fig. 7), and statistical summaries (Tables 3 and 4). The scatter plots and tables contain statistical information characterizing subranges of the observed dissipation rates, while the histograms and tables contain statistical information characterizing the full comparison data sets. RMS differences, mean absolute differences (MAD), and relative biases are computed according to the equations given in the caption for Table 2 using the logarithm (base 10) of the dissipation rate.

Starting with the MPACE comparison, it is apparent that the retrievals have a tendency to underestimate low, and mildly underestimate high, dissipation rates (Fig. 6a). Both data sets exhibit multi-modal distributions that have peaks at nearly identical values (Fig. 7a). However, the radar retrievals are distributed over a narrower range, failing to produce the

Table 3. Statistics comparing radar retrievals of dissipation rate with in situ observations from aircraft at MPACE. All details are similar to Table 2 with the statistics computed for the radar retrievals within bin ranges defined by the aircraft values. A positive bias indicates that the radar retrieval is larger than the aircraft measurement.

<table>
<thead>
<tr>
<th>Log(ε) Bin</th>
<th>N</th>
<th>Med</th>
<th>IQR</th>
<th>MAD</th>
<th>RMS</th>
<th>Bias</th>
</tr>
</thead>
<tbody>
<tr>
<td>−5.7 to −5.2</td>
<td>830</td>
<td>−5.1</td>
<td>0.48</td>
<td>0.45</td>
<td>0.59</td>
<td>0.08</td>
</tr>
<tr>
<td>−5.2 to −4.7</td>
<td>936</td>
<td>−4.8</td>
<td>0.55</td>
<td>0.40</td>
<td>0.51</td>
<td>0.05</td>
</tr>
<tr>
<td>−4.7 to −4.2</td>
<td>1095</td>
<td>−4.6</td>
<td>0.70</td>
<td>0.44</td>
<td>0.55</td>
<td>−0.01</td>
</tr>
<tr>
<td>−4.2 to −3.7</td>
<td>729</td>
<td>−4.2</td>
<td>0.91</td>
<td>0.49</td>
<td>0.62</td>
<td>−0.06</td>
</tr>
<tr>
<td>−3.7 to −3.2</td>
<td>762</td>
<td>−3.7</td>
<td>0.70</td>
<td>0.44</td>
<td>0.60</td>
<td>−0.10</td>
</tr>
</tbody>
</table>

For all these cases, radar-derived dissipation rates sampled at all heights over the time periods when in situ observations were made are statistically represented in each panel of Fig. 5.

It is noteworthy that nearly all tethersonde and aircraft samples during these cases lie within the range (5th to 95th percentile) of retrieved dissipation rates. On 5 October 2004 and 27–28 August 2008 the retrievals indicate relatively little vertical change in turbulence distributions at altitudes below about 900 m, consistent with the in situ observations. On the other hand, during 6 October 2004 the retrievals successfully represent the observed turbulence minimum in the middle of the cloud layer, while on 5 October 2004 the retrievals capture an observed increase and then decrease with ascending height near the cloud top. Lastly, while there were a few individual tethersonde measurements in disagreement, the radar suggests a diminishing amount of turbulence from 400 m down to the lower limit of the radar data at 100 m that is consistent with most of the observations on 29 August 2008.

Point-to-point comparisons between radar retrieved and in situ observed dissipation rates demonstrate reasonable correspondence in a mean sense with the primary clusters of points falling along the one-to-one lines (Fig. 6). These comparisons will be explored in more depth with the aid of scatter plots (Fig. 6), histograms (Fig. 7), and statistical summaries (Tables 3 and 4). The scatter plots and tables contain statistical information characterizing subranges of the observed dissipation rates, while the histograms and tables contain statistical information characterizing the full comparison data sets. RMS differences, mean absolute differences (MAD), and relative biases are computed according to the equations given in the caption for Table 2 using the logarithm (base 10) of the dissipation rate.

Starting with the MPACE comparison, it is apparent that the retrievals have a tendency to underestimate low, and mildly underestimate high, dissipation rates (Fig. 6a). Both data sets exhibit multi-modal distributions that have peaks at nearly identical values (Fig. 7a). However, the radar retrievals are distributed over a narrower range, failing to produce the
Fig. 6. Point-to-point comparisons of dissipation rate for all cases at (a and c) MPACE and (b and d) ASCOS. Statistics of the retrieved data in bins of the in situ data are given as box-and-whisker plots that show the median (middle bar), 25th and 75th percentiles (ends of box), 5th and 95th percentiles (whiskers), and the mean as a symbol. Points in panel a are colored according to the horizontal distance between the aircraft observation and the vertical radar beam, points in panel b are colored according to the day of observation during ASCOS, and points in panels c and d are colored according to the fractional error in dissipation rate calculated using Eq. (7). One-to-one lines are included in each panel.

Table 4. Statistics comparing radar retrievals of dissipation rate with in situ observations from the tethersonde at ASCOS. All details are similar to Table 2 with statistics computed for the radar retrievals within bin ranges defined by the tethersonde values. A positive bias indicates that the radar retrieval is larger than the tethersonde measurement.

<table>
<thead>
<tr>
<th>Log(ε) Bin</th>
<th>N</th>
<th>Med IQR</th>
<th>MAD</th>
<th>RMS</th>
<th>Bias</th>
</tr>
</thead>
<tbody>
<tr>
<td>−5.7 to −5.2</td>
<td>37</td>
<td>−5.5</td>
<td>1.77</td>
<td>0.89</td>
<td>1.04</td>
</tr>
<tr>
<td>−5.2 to −4.7</td>
<td>125</td>
<td>−5.0</td>
<td>1.42</td>
<td>0.80</td>
<td>1.11</td>
</tr>
<tr>
<td>−4.7 to −4.2</td>
<td>205</td>
<td>−4.7</td>
<td>1.08</td>
<td>0.70</td>
<td>0.96</td>
</tr>
<tr>
<td>−4.2 to −3.7</td>
<td>323</td>
<td>−3.8</td>
<td>0.94</td>
<td>0.56</td>
<td>0.75</td>
</tr>
<tr>
<td>−3.7 to −3.2</td>
<td>556</td>
<td>−3.4</td>
<td>0.74</td>
<td>0.43</td>
<td>0.54</td>
</tr>
<tr>
<td>All data</td>
<td>1368</td>
<td>−3.8</td>
<td>1.18</td>
<td>0.55</td>
<td>0.75</td>
</tr>
</tbody>
</table>

Highest and lowest observed dissipation rates. This bi-modal shape may be due to the presence of both weak, persistent background turbulence and more periodic but strongly forced turbulence regimes (e.g. Tjernström et al., 2009). RMS and MAD calculations indicate relative consistency across the range of values, with a typical RMS around 0.6 log (m$^2$s$^{-3}$), indicating general agreement in the raw data to within about a factor of 4. When considering the full dataset, the relative bias is very small and the correlation coefficient is 0.67. Relative to the comparison between the two probes mounted on the same aircraft, the radar-aircraft comparison shows RMS values that are more than a factor of two larger. Individual point differences are often larger than the computed fractional error in the dissipation rate retrieval (Fig. 6c), suggesting that some component of the additional variability is due to variations in spatial sampling that are not a significant issue for the two aircraft probes.

The ASCOS data sets reveal a somewhat different story. First, the tethersonde observations follow a bi-modal distribution (Fig. 7b). Remarkably, the dissipation rates of the two modes correspond quite well with the two primary modes observed by the aircraft during MPACE. However, the occurrence frequencies for the two modes are substantially different; the MPACE aircraft observations do not show as many large values and have more of a tail towards smaller values relative to the ASCOS tethersonde measurements. Both in situ observations and radar retrievals indicate that the mean and maximum dissipation rates are larger for these subsets of observations at ASCOS relative to MPACE.

In contrast to the MPACE comparison, ASCOS radar retrievals have an overall spread in values that is larger than the in situ measurements on both the high- and low-turbulence ends (Fig. 7b). Radar retrievals appear to be biased low in low-turbulence conditions where the fractional retrieval error is relatively larger (Fig. 6d), but many of the points responsible for this bias occurred during a few hours at the end of 29 August and beginning of 30 August 2008. Closer inspection of the tethersonde data at this time shows power spectra that do not have the expected −5/3 slope in the inertial subrange, suggesting that the true dissipation rates are below the

Fig. 7. Distributions of dissipation rate for all cases at (a) MPACE and (b) ASCOS. In each panel, box-and-whisker plots show the median (middle bar), 25th and 75th percentiles (ends of box), 5th and 95th percentiles (whiskers), and mean as a symbol.
effective measurement limit leading to an overestimation. If this case is removed from consideration, the radar retrievals have little bias at low dissipation rates. In higher-turbulence conditions, the retrievals well represent the mean observed dissipation rates, with a very small positive bias, but still have a significant spread (Table 4). The RMS generally decreases with increasing dissipation rate from values around $1.0 \log (m^2 \text{s}^{-3})$ at the smallest rates to $0.5 \log (m^2 \text{s}^{-3})$ at the largest. This trend is diminished somewhat, although still present, if the 30 August 2008 case is removed from consideration. Relative to the MPACE comparison, the ASCOS RMS values are larger in all ranges of dissipation rate except for the highest. For the whole ASCOS data set, the RMS is $0.75 \log (m^2 \text{s}^{-3})$, which indicates differences of about a factor of 5.5 for the raw data. These differences are similar to, and even slightly smaller than, the observed differences between the tethersonde and tower measurements using the same type of sonic anemometer sensor. Only at low dissipation rates is the RMS between the radar and tethersonde data sets significantly larger than the RMS between the tethersonde and tower data sets, although, as noted above, some portion of this spread is due to apparent overestimates by the tethersonde at low dissipation rates.

4 Conclusions

Retrievals of turbulent dissipation rate from the time-variance of velocities measured by Doppler cloud radars in Arctic mixed-phase stratocumulus clouds have been evaluated against in situ measurements. This evaluation takes advantage of two experiments. In the first, an instrumented tethersonde balloon was flown above a radar operated from the deck of an icebreaker embedded within the Arctic sea-ice pack. For the second, a research aircraft flew a number of horizontal legs and spiral profiles near a ground-based radar operated in Barrow, Alaska, USA. These comparison data sets offer a unique opportunity to evaluate dissipation rate retrievals in Arctic clouds.

When comparing point-to-point measurements for both experiments, there is significant scatter as might be expected due to drastically different sample volumes that are sometimes in significantly different locations. The absolute uncertainty in radar-based retrievals is difficult to determine because the in situ observations themselves contain substantial, sometimes uncharacterized, uncertainties. In the case of the aircraft observations, comparisons between two similar sensors operated in tandem on the same platform indicate RMS differences of nearly a factor of two, which might be representative of the uncertainty associated with identical measurements made in near identical locations. However, this does not provide any information on the additional uncertainties that might be caused by spatial separation or sampling differences. Dissipation rates derived using nearly identical sonic anemometer measurements on a tethersonde and on 15- and 30-m towers at spatial distances of 225–275 m during ASCOS showed RMS differences of a factor of six. A time lag analysis conducted using the tower and tethersonde measurements suggests that as much as half of the RMS difference between two different measurements could be due to spatial inhomogeneities in the turbulence field. Thus, while the relative magnitudes of observational uncertainties from different sources are not known absolutely, these comparisons of in situ measurements provide some important context for the evaluation of radar-based retrievals.

Comparisons between the radar retrievals and in situ measurements offer insight into how well the retrievals are able to capture the basic structure and magnitude of turbulent dissipation rates relative to the more traditional measures of the quantity. In some cases, the comparisons paint inconsistent pictures. For example, under low-turbulence conditions, radar retrievals appear to overestimate the dissipation rate relative to nearby aircraft measurements but possibly underestimate these rates relative to tethersonde measurements. For the full comparison data sets, the retrievals also show a much wider range of values than the tethersonde, but a narrower range than the aircraft, in spite of having very small net biases in both cases.

The comparison data sets have RMS differences (for logarithmic data) of 0.61 and $0.75 \log (m^2 \text{s}^{-3})$ for the aircraft and tethersonde comparisons, respectively. These values are consistent with variability among techniques on the order of a factor of 4–6 for non-logarithmic dissipation rates. For context, these differences are no larger than those observed between the spatially separated, sonic-anemometer-based estimates of dissipation rate at ASCOS. Based on the lag analysis results for those sonic-anemometer-based estimates, it is anticipated that as much as half of the variability between radar retrievals and verification data is due to spatial differences in sampling. These results therefore suggest typical retrieval uncertainties on the order of a factor of 2–3. Much, but not all, of this remaining variability can be explained directly by computed retrieval errors resulting from uncertainty in determining the velocity variance and horizontal wind speed (e.g. Fig. 3).

There are some further considerations that might explain additional small sources of bias and uncertainty. For cases of apparent retrieval underestimation, such as for the highest dissipation rates observed at MPACE and the lowest rates observed at ASCOS, this underestimate could be related to the radar sample time being too long, such that the effective sampling length, $L_1$, extends beyond the scales associated with the inertial subrange. In this case the dissipation rate calculation might include contributions from velocity variance at larger scales that do not follow the Kolmogorov form (e.g. O’Connor et al., 2010). However, when the same retrievals are performed with smaller sampling windows for both ASCOS and MPACE cases, the resulting dissipation rate statistics remain similar (results not shown) suggesting that the sample interval used in the radar retrievals typically
remained within the inertial subrange (e.g. Bouniol et al., 2003). Furthermore, some component of the bias in these cases may be due to the in situ measurements (e.g. the 30 August 2008 case at ASCOS).

On the other hand, erroneously large dissipation rates might be inferred if the variance of Doppler velocity measurements is larger than the variance due solely to turbulence. As noted by Lothon et al. (2005) and exhibited in Eq. (1), additional variance could be due to contributions from microphysics and/or covariance between turbulent motions and microphysics. However, in their analyses of drizzling stratocumulus, Lothon et al. (2005) found that the microphysics-turbulence correlations actually lead to an underestimation of the dissipation rate. Power spectra computed from radar velocity time series (Fig. 2) follow the expected Kolmogorov form of the inertial subrange, suggesting that microphysical variance typically did not contribute significantly to the variance in these comparisons. Lastly, additional scatter may have been introduced into these comparisons by significant differences in the effective sample volumes among the instruments.

In spite of the differences that are observed, two primary results can be drawn from this evaluation. First, the differences between radar-based estimates of dissipation rate appear to be no larger than differences between rates derived from different sonic anemometer measurements at similar spatial separations. Second, it is clear that the radar-based retrievals contain important qualitative information on the vertical structure of turbulent dissipation rate within Arctic mixed-phase stratocumulus clouds. For example, the retrievals are able to reveal the presence, or lack thereof, of vertical turbulence gradients. Additionally, a strength of the radar retrieval approach relative to the in situ approaches is that it provides continuous, coordinated profiling of both turbulence and cloud microphysical properties within the cloudy atmosphere. This information has implications for the ability to statistically characterize and understand processes within these clouds. Specifically, knowledge of turbulence profiles offers insight into the source of turbulent energy to the cloud layer, which interacts with cloud and thermodynamic properties and ultimately plays a key role in the cloud life cycle.

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References


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