1 A Visibility and Total Suspended Dust Relationship 2 M.C. Baddock<sup>1\*</sup>, C.L. Strong<sup>1</sup>, J.F. Leys<sup>2</sup>, S.K. Heidenreich<sup>2</sup>, E.K. Tews<sup>3</sup> and 3 G.H. McTainsh<sup>1</sup> 4 5 6 <sup>1</sup>Atmospheric Environment Research Centre, Griffith School of Environment, 7 Griffith University, Brisbane, Queensland, Australia 4111 8 9 <sup>2</sup>Office of Environment and Heritage, Science Division, Gunnedah, New South Wales, Australia 2380 10 11 <sup>3</sup>Australian Rivers Institute, Griffith School of Environment, Griffith University, 12 13 Brisbane, Queensland, Australia 4111 14 15 \*Corresponding author 16 Tel: +61 7 373 57645 17 Fax: +61 7 3735 4378 18 Email: m.baddock@griffith.edu.au 19 20 **Abstract** 21 This study reports findings on observed visibility reductions and associated 22 concentrations of mineral dust from a detailed Australian case study. An 23 understanding of the relationship between visibility and dust concentration is 24 of considerable utility for wind erosion and aeolian dust research because it 25 allows visibility data, which are available from thousands of weather 26 observation stations worldwide, to be converted into dust concentrations. Until 27 now, this application of visibility data for wind erosion/dust studies has been 28 constrained by the scarcity of direct measurements of co-incident dust 29 concentration and visibility measurements. While dust concentrations are 30 available from high volume air samplers, these time-averaged data cannot be 31 directly correlated with instantaneous visibility records from meteorological 32 observations. This study presents a new method for deriving instantaneous 33 values of total suspended dust from time averaged (filter-based) samples, 34 through reference to high resolution PM<sub>10</sub> data. The development and testing

of the model is presented here as well as a discussion of the derived expression in relation to other visibility-dust concentration predictive curves. The current study is significant because the visibility-dust concentration relationship produced is based on visibility observations made 10-100 km from the dust sources. This distance from source makes the derived relationship appropriate for a greater number of visibility recording stations than widely-used previous relationships based on observations made directly at eroding sources. Testing of the new formula performance against observed total suspended dust concentrations demonstrates that the model predicts dust concentration relatively well ( $r^2 = 0.6$ ) from visibility. When considered alongside previous studies, the new relationship fits into the continuum of visibility-dust concentration outcomes existing for increasing distance-from-source. This highlights the important influence that distance to source has on the visibility-dust concentration relationship.

Keywords: duststorm; sandstorm; air quality; PM10; aerosols; TSP

### 1. Introduction

The visibility distance at the time of observation is a commonly reported atmospheric variable in meteorological data. The presence of smoke, pollution, moisture and suspended mineral dust in the atmosphere can all result in a reduction in visibility. The impact that dust has on visibility is a chief cause of the transport disruptions caused by these aeolian phenomena (Baddock et al., 2013; Tozer and Leys, 2013). For research into aeolian dust, the degree of visibility reduction associated with dust-related weather codes has provided fundamental information on the spatio-temporal characteristics of dust activity. Before the advent of satellite remote sensing, visibility was the dominant variable used in mapping the distribution of wind erosion and dust activity (Orgill and Sehmel, 1976; Middleton et al., 1986; McTainsh and Pitblado, 1987; Goudie and Middleton, 1992).

Visibility has been widely used in dust studies because these basic data are readily available from thousands of observation stations in the World Meteorological Organisation (WMO) network, and are often available for long

69 time series. Values of the concentration of dust in the atmosphere however 70 represent a more process relevant and precisely quantifiable measure of 71 mineral dust loading than visibility. For instance, dust concentration is the 72 form by which off-site air quality is measured and regulated, such as in 73 maximum concentration for dust particles of all sizes, TSD (Total Suspended 74 Dust), or size-selective e.g., PM<sub>10</sub> (particles <10 µm) (e.g., Stetler and Saxton, 75 1996; Neff et al., 2013). 76 77 Estimates of dust concentration can be derived from visibility measurements, 78 and several empirical relationships that relate concentration to visibility have 79 previously been put forward (e.g., Chepil and Woodruff, 1957; Patterson and 80 Gillette, 1977; Ben Mohamed and Frangi, 1986; D'Almeida, 1986; Chung et 81 al., 2003; Wang et al., 2008). Such visibility-based estimates of dust 82 concentration have numerous applications in; the mapping of wind erosion 83 (McTainsh et al., 2008; O'Loingsigh, 2014), the 'ground truthing' of remote 84 sensing (Wang and Christopher, 2003; Guo et al., 2009), air quality 85 assessments (Ozer et al., 2006; Dagsson-Waldhauserova et al., 2013), the 86 validation of dust activity modelling (Shao et al., 2003; 2007), the estimation of 87 peak loads of large dust storms (Raupach et al., 1994; Chung et al., 2003; 88 McTainsh et al., 2005; Leys et al., 2011) and for better understanding the 89 effects of suspended mineral aerosols on the radiative budget (e.g., Sokolik et 90 al., 2001; Satheesh and Moorthy, 2005). 91 92 The various empirical expressions that relate visibility and dust concentration 93 have been found to differ between studies (Patterson and Gillette, 1977; Ben 94 Mohamed and Frangi, 1986; Dayan et al., 2007; Shao et al., 2007; Wang et 95 al., 2008). For such expressions to be useful in dust-atmospheric studies, it is 96 important that this variability be understood. Furthermore, so that accurate 97 estimates of dust concentration can be produced from visibility, it is also 98 important that the most appropriate expression be applied for a given visibility 99 observation location. The need to understand the relationship between 100 visibility and dust concentration as part of wind erosion research has long 101 been recognised (e.g., Ette and Olorode, 1988; Ackerman and Cox, 1989; 102 Shao et al., 2003). In particular, two classic studies in the United States, those

of Chepil and Woodruff (1957) and Patterson and Gillette (1977) used empirical fits of observed data to describe the relationship

$$C_m = A/_{VY} \quad (1)$$

108 with

$$110 A = C_m V (2)$$

where  $C_m$  is total mass concentration, A is a term related to the effects on extinction due to particle size distribution,  $\gamma$  a constant and V is observed visibility. These studies demonstrate the suitability of the power relationship in describing the relationship between visibility and dust concentration. Patterson and Gillette (1977) noted the variety in the values of constant terms put forward to relate concentration and visibility. They attributed the lack of a single applicable term to variations in dust particle size distributions (PSD) between both dust events and study areas. PSDs can be highly variable between wind erosion episodes, and are controlled chiefly by source soil characteristics, wind erosivity and the distance of observation point from the

eroding source (El-Fandy, 1953, Chepil and Woodruff, 1957).

It is noteworthy that both the Chepil and Woodruff (1957) and Patterson and Gillette (1977) studies were based on visibility and dust concentration measurements made at, or very close to, eroding sources. This constrains the application of their visibility and dust concentration functions because worldwide, the most readily available source of visibility data is from WMO meteorological stations which are impacted by dust, but are not located directly at the eroding source. An expression describing the visibility and dust concentration relationship at a greater distance from source will therefore be more appropriate for these locations. Following terminology from the transport distance model of Tsoar and Pye (1987), dust within a few kilometres from its source can be termed local, while >10 km dust can be regarded as regional (see also Cattle et al., 2009).

136 137 The aim of this study was to produce a relationship between visibility and total 138 suspended dust concentration for dust events observed at a regional scale 139 (10-100 km) from source. A new method is presented here for obtaining 140 instantaneous dust concentrations from time-averaged data, to allow their 141 correlation with instantaneous visibility observations. 142 143 2. Methods 144 2.1 Background to methods 145 The most reliable source of near-surface dust concentration data is field 146 sampling using active samplers, such as vacuum pump-based devices (e.g., 147 Nickling and Gillies, 1993; Nickling et al. 1999), or from networks of high 148 volume samplers (HVS) (Leys et al., 2008). Such equipment however is 149 costly, labour intensive to operate and largely impractical for widespread 150 spatial monitoring of dust, especially in remote areas. A more widely 151 applicable approach for wind erosion monitoring involves the use of 152 DustTrak® (TSI, St. Paul, MN, USA) samplers (Leys et al., 2008). DustTrak 153 instruments provide real time dust concentrations, but only for particulates 154 with an aerodynamic size of <10  $\mu$ m (PM<sub>10</sub>). This size selectivity makes such 155 instruments suitable for monitoring air pollution and the associated effects that 156 fine particles have on human health. While PM<sub>10</sub> is being successfully used 157 for wind erosion mapping (e.g., Wang et al., 2008), wind erosion events also 158 entrain coarser particles than this size. As a result, PM<sub>10</sub> does not fully 159 characterise all dust events, or describe the full size range of suspended 160 particles contributing to atmospheric mass loadings (Tsoar and Pye, 1987; 161 Lawrence and Neff, 2009; Neff et al., 2013). It is preferable therefore for 162 measurements of dust concentration for a given dust event to be calculated 163 from the entire range of particle sizes present. 164 165 High volume samplers (HVS) collect the total range of particles in the air, but 166 as the resultant dust concentration is time-integrated over the total sampling 167 period for which the HVS was operating (generally 24 h), these time-averaged 168 data have a poor relationship with time-averaged visibility. The focus of the 169 current study is to use the high resolution time series of PM<sub>10</sub> dust

170 concentration measured with a DustTrak ( $C_{DT}$ ) to calculate the equivalent total 171 dust concentration measured with a co-located HVS ( $C_{HVS}$ ) for a point in time 172  $(C_{HVSi})$ , which can then be correlated with the concurrent visibility. The 173 resultant relationship is referred to from here on as the Visibility-Total 174 Suspended Dust (V-TSD) model. 175 176 2.2 Site and sampling details 177 A HVS and a DustTrak instrument, operated by the New South Wales Office 178 of Environment and Heritage (OEH) and Griffith University, provide two forms 179 of dust concentration data at Buronga, New South Wales (34.17°S, 180 142.20°W). The HVS at this site constitutes the longest rural record of dust 181 concentration in Australia, monitoring dust in the intensively cultivated Mallee 182 region for over 24 years (Leys et al., 2008). For dust events, the HVS collects 183 the full range of suspended particles on glass fibre filter papers (Whatman GF/A with nominal pore size of 1.6 µm) using a sampling flow rate of about 184 0.7 m<sup>3</sup> min<sup>-1</sup>. The record of HVS dust event concentration data from Buronga 185 186 was examined for the years 2004 - 2007. 187 188 Determination of dust concentration from the HVS is in part governed by the 189 duration that each filter sampled for. As filter changing is a manual operation, 190 the sampling time varied for each filter (20-75 hours). This time period 191 introduces the chance of multiple dust events becoming sampled. In 192 conjunction with the HVS filter data, 5-minute PM<sub>10</sub> data from the DustTrak at 193 Buronga were also used in order to measure the timing and duration of the 194 dust events. 195 196 The dust concentration data gathered at Buronga were correlated with 197 visibility data from Mildura, Victoria as the nearest Australian Bureau of 198 Meteorology (BoM) station, located 12 km to the south-west of Buronga. 199 Visibility data from Mildura came from two datasets; the regular 3-hourly 200 synoptic observation (Vis<sub>synop</sub>) (excluding the midnight 0000 reading) and 201 irregular A37 visibility recordings ( $Vis_{A37}$ ), which have a 5 to 30-minute 202 frequency when available. A37 reports augment the synoptic record and are 203 typically recorded during notable weather phenomena such as dust events.

Whilst it would have been preferable to have the concentration sampling sited at the same location as the BoM visibility observation, for practical reasons this was not possible. The siting of instruments and the observer in different locations creates some challenges and these were taken into account by the method used for comparing visibility and dust concentration.

2.3. Deriving instantaneous dust concentration from HVS data

From the HVS filters obtained at Buronga during 2004-2007, a total of 13

212 filters was used to create a high quality dataset comprising 83 discrete dust

concentrations. The selection criteria producing the 13 filters included: i) TSD

214 load >100 μg/m3 and filter run time between 18 and 30 hours, ii) a

continuous 5-minute PM<sub>10</sub> concentration record existed for the HVS sampling

216 period, iii) the availability of high temporal resolution A37 visibility

217 observations for the dust event and iv) wind direction during the event from

the south west, to ensure that dust observed at Mildura was measured at

219 Buronga.

Given that the DustTrak is limited to recording the  $PM_{10}$  fraction, the ratio between  $PM_{10}$ /TSD was determined for each dust event in order to relate the high frequency  $PM_{10}$  concentration to TSD. Calculation of this ratio involves two assumptions; i) that the  $PM_{10}$  dust concentration time series is the same as the TSD time series, and the only difference between the measurements is the particle size limitation of the  $PM_{10}$  measurements, ii) that the  $PM_{10}$  to TSD ratio is constant over the HVS sample period t=0 to t=t. Accepting these conditions, equation 3 defines how the  $PM_{10}$ /TSD ratio (t) relates the DustTrak and HVS concentrations

$$C_{DT_t} = a * C_{HV_t} \tag{3}$$

where  $C_{DT_t}$  is PM<sub>10</sub> concentration from DustTrak,  $C_{HV_t}$  is TSD concentration from HVS, and a is the ratio between the two. This ratio was determined for each HVS filter paper used, or in other words, for each dust event examined.

The total mass m collected on the filter paper for any given time interval t=0 to

237 t=T is

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$$m = \int_{t=0}^{t=T} C_{HV_t} * \frac{dV}{dt} * dt$$
 (4).

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240 Because the volume of air flow passing through the filter can be regarded as a

constant for each sampling event ( $\dot{V} = dV/dt$ ), re-arranging equations 3 and

242 4 produces

$$m = \frac{\dot{V}}{a} * \int_{t=0}^{t=T} C_{DT_t} * dt$$
 (5).

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From the total mass on the filter for the sampling period, the total air volume

sampled, and the time-averaged PM<sub>10</sub> concentration of the DustTrak ( $\bar{C}_{DT_{t}}$ ) for

the same period, the value of a can be determined through

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$$\bar{C}_{DT_{t}} = a * \bar{C}_{HV_{t}} \tag{6}$$

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249 re-arranged to

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$$a = \frac{C_{DT_t}}{m_{HV}/V_{HV}} \tag{7}.$$

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252 As the object of the study was to relate visibility to dust concentration, an

instantaneous value of TSD concentration at time ( $C_{HV_t}$  at time i) was

required. For this, equation 8 was applied

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$$C_{HV_i} = \frac{C_{DT_i}}{a} \tag{8}.$$

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To obtain  $C_{HV_i}$ , first, the measured PM<sub>10</sub> concentration  $C_{DT_i}$  was obtained for i

when an A37 visibility reading existed. One issue with the split-site sampling

and the distance between Mildura and Buronga is the small time difference in

the onset of dust between the two locations (Figure 1). As this effectively represents a time lag between the sites, the time difference was calculated and applied to the lagging station to ensure that A37 visibilities and PM<sub>10</sub> data corresponded with one another. For instance, in Figure 1, the drop in visibility marking the event onset occurred at 18:13 at Mildura, when windspeed was 42 km/h and wind direction 220°. At Buronga, downwind of Mildura and to the NE, the peak PM<sub>10</sub> concentration was 11 minutes later, an acceptable time lag given the Mildura wind data and the 12 km distance between the sites. Per equation 8, the PM<sub>10</sub> concentration at *i* was divided by the PM<sub>10</sub>/TSD ratio (a) to yield an instantaneous TSD concentration for the time of the visibility reading. >>Figure 1 here

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# 2.4 Testing the V-TSD model

In order to validate the V-TSD expression, a comparison was made between values of dust concentration estimated from the model and those directly measured by the HVS. From the HVS filters obtained at Buronga during 2002 and 2003, a total of 22 filters was used as a test database, with each one representing an individual dust event. The use of this time period, which was prior to the years used to develop the V-TSD model, ensured the test dataset was independent of that used to formulate the model. To incorporate a range of dust concentrations in the testing (i.e., different dust event intensities), of the 22 events, four filters were randomly chosen from events with  $C_{HVS} > 300$ µg/m<sup>3</sup> to represent relatively intense dust conditions, seven filters for moderate dust concentration (100-300 µg/m³) and eleven filters with <100  $\mu g/m^3$ .

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For each test event, the *Vis*<sub>synop</sub> values during the HVS sampling period were used to determine visibility. Given that  $C_{HVS}$  represents the dust concentration over the extended period that the HVS sampled, multiple three-hourly Vissynop values existed for each dust event. To account for this, the V-TSD modelled dust concentration was calculated for an event by substituting each visibility into the V-TSD model and then weighting the result by the time period that the visibility represented. This was achieved through multiplication of the estimated concentration by the time interval (e.g., three hours). The time-weighted concentration values were summed and divided by total event duration to produce the modelled concentration ( $C_{VTSD}$ ).

#### 3. Results

The extended duration of individual dust events typically provided multiple high-frequency A37 visibilities at different times throughout each event. Equation 8 could therefore be applied to a range of visibilities and therefore dust concentrations (n = 83) from the 13 events of 2004-2007. Best fitting this data produced the V-TSD model (Figure 2) represented by the relationship

$$C_{VTSD} = 4050 * Vis^{-1.016} \tag{9}$$

where  $C_{VTSD}$  is total suspended dust concentration (µg/m³) and Vis is visibility (km). The power form for the expression was adopted because comparable earlier studies produced expressions of this form, also with power functions close to 1 (Chepil and Woodruff, 1957; Patterson and Gillette, 1977; Wang et al., 2008), and the  $r^2 = 0.79$  of equation 9 reveals a relatively strong correlation.

314 >>Figure 2 here

Section 2.4 detailed how a dataset was produced in order to test the predictive ability of the V-TSD model. When dust concentrations calculated by equation 9 ( $C_{VTSD}$ ) were plotted against the measured HVS dust concentration ( $C_{HVS}$ ) for 22 independent dust events from 2002-2003, a positive linear fit resulted with an  $r^2 = 0.60$  (Figure 3).

322 >>Figure 3 here

#### **4. Discussion**

325 4.1 The V-TSD model

The aim of this study was to examine the relationship between TSD concentration and visibility for the Mildura/Buronga location. Although the correlation between TSD and visibility is relatively strong, in some sections of the plot the strength of the relationship is weaker (Figure 2). Between 3 and 6 km visibility, concentrations generated by the V-TSD model were greater than the line of best fit. This is most likely a consequence of overestimation of visibility by observers for this range of distance, and is exacerbated by the relatively few observations at visibilities between 1 and 3 km. For visibility observations of 7 km and above, dust concentrations were variable, but typically under 1000 µg/m<sup>3</sup>. At these distances, the variation in the recorded concentration values for a given visibility must partly reflect the subjectivity of visibility estimation at such range in conditions with reduced dust loading. The V-TSD model is based on the consideration that it is the complete particle size range of suspended dust that exerts a fuller influence on visibility (El-Fandy, 1953). However, as the DustTrak instrument also provided direct measurements of PM<sub>10</sub> concentration, a useful comparison can be made between the relationship of PM<sub>10</sub> concentration with visibility, and that of TSD from Figure 2. Using instantaneous PM<sub>10</sub> concentrations in place of the modeled TSD values, the weaker correlation with visibility that the size selective dust concentration results in, compared to the full particle size range, is evident (Figure 4). In fact, the contribution that large (>PM<sub>10</sub>) dust particles make to total dust concentrations in the Colorado Plateau region of the U.S. has recently been demonstrated by Neff et al. (2013). Given the relative prevalence of PM<sub>10</sub> monitoring devices however, for instance, as part of air quality monitoring networks, the relationship between visibility and the concentration of dust limited to PM<sub>10</sub> size is still of appreciable utility for wind erosion studies (Chung et al., 2003; Dayan et al., 2007; Wang et al., 2008; Leys et al., 2011). >>Figure 4 here

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4.2 Comparison of the V-TSD model with other studies

Patterson and Gillette (1977) commented that expressions for estimating dust concentration from visibility would vary between studies, explaining that the relative concentration of large particles exerts a strong influence on the visibility-dust concentration relationship. They stated that different soil conditions as well as the distance that the dusts had been transported would control the proportion of large particles present to affect visibility. Further insights into the nature of these controls upon the visibility-dust concentration relationship can be gained by comparing the curves of previous studies with the V-TSD relationship of equation 9 (Figure 5).

### >>Figure 5 here

To explain the divergence between Chepil and Woodruff's (1957) expression and that of their own work, Patterson and Gillette (1977) postulated that different soil conditions between the studies produced different dust PSDs. They suggested that the drought conditions during Chepil and Woodruff's (1957) monitoring period (1954 – 1955) produced more erodible soils which resulted in increased dust particle size. This in turn produced higher dust concentrations for a given level of visibility, an effect evident in the displacement of the Chepil and Woodruff line in Figure 5. Patterson and Gillette also correctly assert that the difference in these empirical relationships was not due to distance from source because sampling in both studies was conducted very close to, or directly at, the eroding surfaces. Conversely, they show that the lower dust concentrations measured in the study by Bertrand et al. (1974) arose because the dusts were sampled approximately 2000 km from source.

While the particle size characteristics of dust have been found to relate to the particle size of the source soil (e.g. Gillette and Walker, 1977; Alfaro and Gomes, 2001) the influence that the parent soil has on the PSD of dust is strongest near to source, directly above the wind-eroded surface from where the dust is entrained (Tsoar and Pye, 1987). Furthermore, the entraining wind strength has been argued to affect the PSD of dust, with the influence of this factor again dominant near to source (e.g., Gillette and Walker, 1977), though

this theory is not without challenge (see Kok, 2011). For both these factors, 394 their influence on dust PSD would be greatest closer to entrainment because 395 with downwind transport, larger particles preferentially settle out so 396 differences in PSD will be reduced with distance from source (Pye, 1987). 397 398 In the present study, it is significant that the dust sampling at Mildura/Buronga 399 was not conducted immediately 'at source'. Wind erosion mapping based on 400 meteorological observations of dust show that the cultivated sandy soils of the 401 Mallee region 10-100 km SW of the Mildura/Buronga site is the main source 402 region for the examined dust events (McTainsh and Pitblado, 1987). At this 403 distance, the PSD of sampled dust would be relatively finer than at-source 404 due to coarser particles settling out closer to source (Tsoar and Pye, 1987). 405 As finer particles have a greater relative influence on visibility impairment than 406 on mass concentration, the reduction of visibility by a given dust concentration is greater at a point further from source. The differences between our V-TSD 407 408 expression and those of Chepil and Woodruff (1957) and Patterson and 409 Gillette (1977) therefore probably result more from the effect of distance-from-410 source, than parent soil particle size or eroding wind conditions (Figure 5). A 411 similar result is also seen in the work of Shao et al. (2003; also Shao and 412 Wang, 2003). In their study, the effects of distance from source were 413 accommodated by using two expressions of the dust concentration to 414 visibility relationship; one for cases above a threshold visibility of 3.5 km 415 (assumed to be distant dusts) and the other for below 3.5km visibility (local 416 dusts). 417 418 Distance from source effects may also be demonstrated by values of A 419 (equation 2), as the term used to characterise the effects of the suspended 420 PSD on optical extinction. Patterson and Gillette (1977) explain that A should 421 be lower for observations made at greater distance from source, again owing 422 to the reduced contribution to visibility attenuation from larger sized particles 423 when further from source. The findings here show good agreement with the 424 range of A values presented by Patterson and Gillette. The A outcomes for measurements predominantly at eroding field sources were  $5.6 \times 10^{-2}$  g m<sup>-3</sup> 425 km in Chepil and Woodruff (1957) and  $2.0 \times 10^{-2}$  g m<sup>-3</sup> km for Patterson and 426

Gillette (1977). The lower average of A (4.6 × 10<sup>-3</sup> g m<sup>-3</sup> km) from the current 427 428 study of regional erosion reflects the fact that observations were made at a 429 greater distance from source (< ~100 km). In the case of distantly sourced dust, Patterson and Gillette (1977) estimated  $A = 1.4 \times 10^{-3}$  g m<sup>-3</sup> km for 430 observations made approximately 2000 km from source using data of 431 432 Bertrand et al. (1974). This result further reinforces the significance of 433 distance from source for expressing the effect of dust on visibility. 434 By adding our new visibility-dust concentration curve developed for regional 435 436 dusts (i.e., dust transported and observed some 10-100 km from source) to 437 two previous visibility-dust concentration curves from at-source (Figure 5), it is 438 now possible to more accurately estimate dust concentration using the 439 visibility data from a much larger number of WMO stations. Our V-TSD 440 relationship applies to the greater proportion of stations located in regions experiencing dust transport, but not located directly at the source of dust. By 441 442 enhancing our capability to estimate dust concentration away from source 443 areas, improved concentration estimates will allow for better and more 444 complete; mapping of wind erosion (O'Loingsigh et al., 2014), comparison of 445 ground data with remote sensing aerosol products (e.g. MODIS Deep Blue 446 (Ginoux et al., 2012)), validation of dust emission models, and, the estimation 447 of peak loads of large dust storms, within the region an order of 10-100 km 448 downwind from source. 449 450 In addition, the methodology demonstrated here provides a means of further 451 expanding the suite of visibility-dust concentration curves by using HVS, 452 DustTrak and visibility data from WMO stations in other wind erosion settings. 453 For example, medium distance dust concentrations could be estimated 454 without the need to conduct dedicated field experiments of the type originally 455 carried out by Patterson and Gillette (1977). 456 457 5. Conclusion 458 This study is an outcome of an ongoing, long term, synergistic dust monitoring program in rural New South Wales, Australia (Leys et al., 2008; McTainsh et 459 460 al., 2008). The study applies a novel methodology to data from high volume

sampler and DustTrak dust monitoring devices to derive instantaneous values of total suspended dust concentration from time-averaged values. By relating high frequency meteorological visibility reports to the derived at-a-time concentrations, an empirical relationship between observed visibility and measured dust concentration was produced. Whereas previous studies were based on field experiments dedicated to exploring the relationship between visibility and dust concentration, the current study presents an innovative way of utilising existing datasets to quantify this relationship.

The new model for visibility and dust concentration from the Mildura/Buronga location demonstrates the effect that distance from source has on the nature of the relationship. Prominent previous studies produced expressions based on observations made at, or very close to, the eroding soil source. The current study, by using visibility and concentration measurements made further from source (10-100 km) demonstrates the influence of particle size, in this case, reduced particle size of the dust as a result of this regional distance from source. The new visibility-dust concentration expression is therefore more appropriate to visibility data from those observer stations regional to source areas. This makes the expression applicable to a larger number of WMO stations.

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**Figure Captions** Figure 1: The 5-minute PM<sub>10</sub> dust concentration record from the DustTrak at Buronga and visibility (A37 records) at Mildura for the dust event of December 12<sup>th</sup> 2005. Note inverted visibility on secondary vertical axis. Dashed lines mark the onset of the event as detected by each monitoring technique. The displacement of the plots arises because the dust event reached Mildura before Buronga (see Section 2.3). Figure 2: The relationship between visibility and total suspended dust for the Mildura/Buronga sampling location, expressed as the V-TSD model (n = 83). Figure 3: Measured total suspended dust concentration by HVS ( $C_{HVS}$ ) and modelled total suspended dust concentration by V-TSD ( $C_{VTSD}$ ) for 22 dust events experienced at Buronga, NSW during 2002-03 (see Section 2.4). Figure 4: The relationship between visibility and PM<sub>10</sub> dust for the Mildura/Buronga sampling location (n = 83). Figure 5: Comparison between the V-TSD model and other selected expressions relating dust concentration and visibility, from Chepil and Woodruff (1957) (C&W) and Patterson and Gillette (1977) (P&G). 

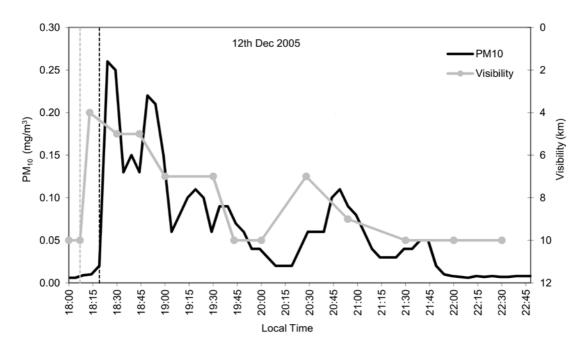
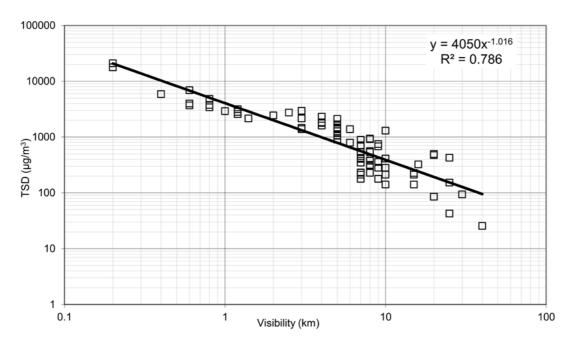
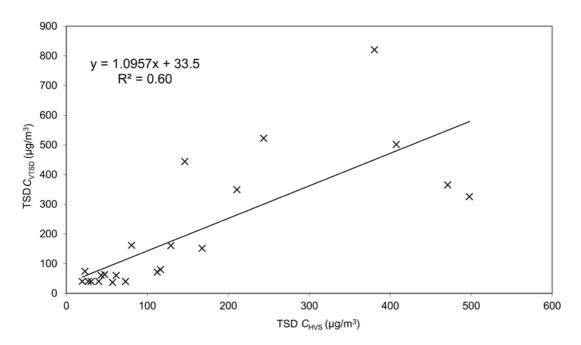


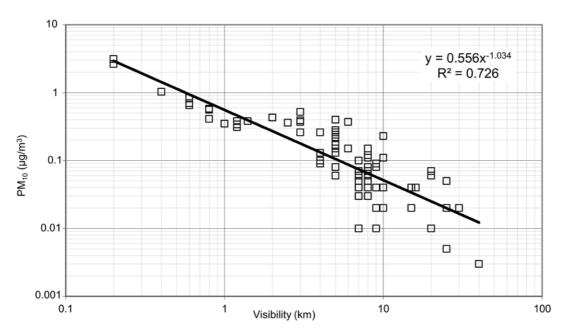
Figure 1



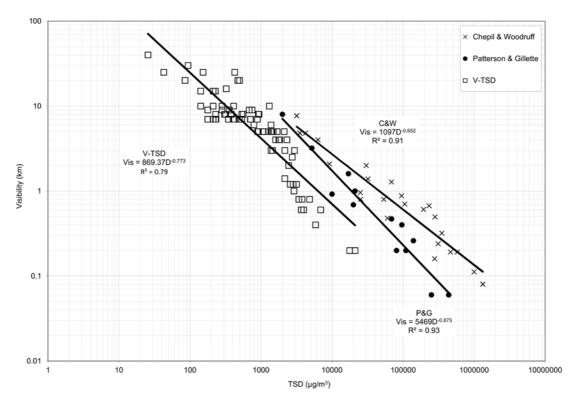
721 Figure 2



743 Figure 3



765 Figure 4



787 Figure 5