



# The characterization of haboobs and the deposition of dust in Tempe, AZ from 2005 to 2014



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## ABSTRACT

Dust storms known as ‘haboobs’ occur in Tempe, AZ during the North American monsoon season. This work presents a catalog of haboob occurrence over the time period 2005–2014. A classification method based on meteorological and air quality measurements is described. The major factors that distinguish haboobs events from other dust events and from background conditions are event minimum visibility, maximum wind or gust speed, and maximum PM<sub>10</sub> (particulate matter with aerodynamic diameters of 10 µm or less) concentration. We identified from 3 to 20 haboob events per year over the period from 2005 to 2014. The calculated annual TSP (total suspended particulate) dry deposition ranged from a low of 259 kg ha<sup>−1</sup> in 2010 to a high of 2950 kg ha<sup>−1</sup> in 2011 with a mean of 950 kg ha<sup>−1</sup> yr<sup>−1</sup>. The deposition of large particles (PM<sub>>10</sub>) is greater than the deposition of PM<sub>10</sub>. The TSP dry deposition during haboobs is estimated to contribute 74% of the total particulate mass deposited in Tempe.

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## 1. Introduction

During the North American monsoon season Phoenix, Arizona is reported to experience 2–7 dust storms per year (Raman et al., 2014). Metropolitan Phoenix is a semiarid urban area with a population of 4.2 million (U.S. Census Bureau, 2013); the region has low annual precipitation ranging from 83 to 240 mm yr<sup>−1</sup>, and high temperatures with an average of 61 days per year exceeding 40 °C (U.S. NOAA, 2015). The monsoon season is now defined by the National Weather Service (NWS) as June 15 to September 30

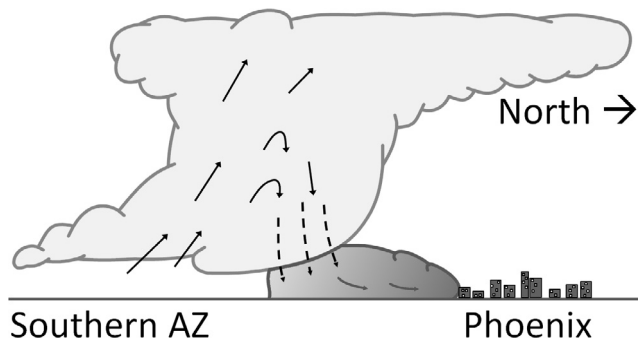
(similar to the ‘hurricane season’; U.S. NWS, 2016); it is characterized by a change in the general upper atmosphere circulation and an average dew point >12.7 °C. The most intense kind of dust storms Phoenix experiences are fostered by monsoon weather through the interaction of atmospheric water and sunlight. In the vicinity of Phoenix, thunderstorm clouds build during the day as moisture-laden air aloft from the Gulf of Mexico and the Pacific Ocean (Sorooshian et al., 2011) is energized by sunlight and rises within the clouds. In the evening, the supply of heated, moist air decreases and there is a net downward movement of moisture as precipitation. Over the semiarid desert, the falling hydrometeors evaporate significantly before reaching the surface; this process cools the surrounding air, causing it to become denser and to displace the dry air below. These powerful downdrafts can produce high winds and turbulent convection over the landscape. These thunderstorm outflows can result in a particular kind of dust storm: an advancing wall of dust hundreds of meters high and tens of kilometers long known as a haboob, from the Arabic *habūb* ‘blowing furiously/strong wind’ (see Fig. 1 and Fig. 2; Idso, 1976; Idso et al., 1972; Sutton, 1925).

Haboobs occur in only a few parts of the world, including north-east Africa (Roberts and Knippertz, 2012; Sutton, 1925), the Arabian Peninsula (Membrey, 1985; Miller et al., 2008), and northwest India (there known as *kālī andhī* or *andhī* ‘darkening, blinding storm’; Goudie and Middleton, 2000; Joseph, 1982; Joseph et al.,

**Abbreviations:** AQS, United States Environmental Protection Agency’s Air Quality System; ADEQ, Arizona Department of Environmental Quality; BLDU, blowing dust; c(PM<sub>10</sub>), mass concentration of PM<sub>10</sub>; c(PM<sub>2.5</sub>), mass concentration of PM<sub>2.5</sub>; c(TSP), mass concentration of TSP; DS, dust storm; DU, widespread dust; EPA, United States Environmental Protection Agency; HZ, haze; J<sub>d</sub>(PM<sub>10</sub>), PM<sub>10</sub> dry deposition flux; J<sub>d</sub>(TSP), TSP dry deposition flux; KPHX, weather station at Phoenix Sky-Harbor International Airport; MADIS, Meteorological Assimilation Data Ingest System; MCAQ, Maricopa County Air Quality; METAR, Meteorological Terminal Air Report; MFCD, Maricopa County Flood Control District; NAAQS, United States National Ambient Air Quality Standards; NOAA, United States National Oceanic and Atmospheric Administration; NWS, United States National Weather Service; QCLC, Quality Controlled Local Climatological Data; SQ, squall; TS, thunderstorm; VIS, visibility; *v*<sub>WG</sub>, wind and/or gust speed; WBAN, United States Weather-Bureau-Army-Nav.

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**Fig. 1.** Conceptual diagram of haboob initiation in Arizona, including a convective thunder storm (anvil cloud) and down drafts (dashed arrows) that push a wall of dust ahead of the storm. Gray shading of the haboob is meant to emphasize the dust front. Note: Not all haboobs originate south of Phoenix and the diagram is not to scale.

1980). In the US, haboobs have been reported in Arizona and Texas (Brazel and Nickling, 1986; Chen and Fryrear, 2002; Idso et al., 1972; Warn and Cox, 1951). In Arizona, haboobs can substantially decrease visibility to less than 1 km (Nickling and Brazel, 1984). Wherever haboobs occur, they are quite intense relative to other types of dust events (Roberts and Knippertz, 2012) and have comparatively short lifetimes of 1–4 h in any single location (Brazel and Nickling, 1986; Sutton, 1925).

### 1.1. Impact on air quality

Haboobs can have a significant impact on the amount of atmospheric particulate matter (PM) in the metropolitan Phoenix area (Clements et al., 2014, 2016; Lei and Wang, 2014). Particulate matter is classified by size fractions;  $PM_{10}$  and  $PM_{2.5}$  are particulate matter with aerodynamic diameters of  $\leq 10 \mu m$  and  $\leq 2.5 \mu m$ , respectively. The size of PM determines the extent of penetration into the respiratory tract and therefore the adverse health risk:  $PM_{10}$  can penetrate to the bronchi passages while the finer and more hazardous fraction,  $PM_{2.5}$ , is able to penetrate fully into the alveolar

recesses of the lungs (WHO, 2006). Their mass concentrations,  $c(PM_{10})$  and  $c(PM_{2.5})$  respectively, both increase during haboobs; peak  $c(PM_{10})$  can be in the thousands of  $\mu g m^{-3}$  for several hours and  $c(PM_{2.5})$  increases although to a somewhat lesser extent (e.g., tens to hundreds of  $\mu g m^{-3}$ ; Clements et al., 2013; Lei and Wang, 2014). The U.S. National Ambient Air Quality Standards (NAAQS) are  $12 \mu g m^{-3}$  for  $c(PM_{2.5})$  and  $150 \mu g m^{-3}$  for  $c(PM_{10})$  over a 24-h period (U.S. Environmental Protection Agency (EPA), 2013). High haboob-derived PM concentrations which exceed the EPA standards are typically excluded from regulatory decisions regarding NAAQS compliance since they are high-wind, natural-events that are “not reasonably controllable or preventable” and which overwhelm even stringent dust control measures (ADEQ, 2015; U.S. EPA, 2006, 2007).

Besides the impact on air quality, another impact of haboobs is particle deposition. In the early 1970s, rooftop dust deposition in Tempe was reported to be  $540 kg ha^{-1} yr^{-1}$ , 12% of which was attributed to two haboobs (Péwé et al., 1981). Particle deposition in semiarid regions of southern California and Nevada (which do not experience haboobs) has been reported to be substantially lower,  $20\text{--}200 kg ha^{-1} yr^{-1}$ , over the period 1983–2000 (Reheis, 2006).

Identification of haboobs in metropolitan Phoenix from historical data can be challenging since meteorological and radar records often are inadequate in temporal and spatial resolution to capture these short-lived phenomena (Raman et al., 2014). Reliance upon visibility and wind speed data alone can lead to false-positive haboob identifications since these events can occur with several meteorological phenomena. Recent high-resolution modelling efforts have also shown that it is possible to predict the timing and location of haboob events and have presented results simulating a particularly large haboob that occurred in July of 2011 (Vukovic et al., 2014). The METAR (Meteorological Terminal Air Report) weather condition codes provide dust information (e.g., BLDU, blowing dust) but do not distinguish between general dust events and the more intense haboobs. Given the sparse data on dust deposition in the southwestern US, and the difficulty of identifying past haboob events, the magnitude of annual haboob deposition and the impact of that dust on urban ecosystems



**Fig. 2.** Photograph from an airplane of a haboob advancing northward in Tempe, AZ on August 25, 2015; photo credit: A. Anbar.

is not well known. However, it is likely that as the Phoenix population continues to grow, changes in land use will affect the potential for monsoon events to resuspend and transport dust in and around metropolitan Phoenix.

This work identified and characterized haboobs in Tempe, AZ over the period 2005–2014. Air quality impacts were documented and temporal changes in haboob frequency and intensity were investigated. A computational model was used to estimate particle deposition in Tempe. This work is of limited spatial scope since it reports the development of a systematic classification of haboobs. This work exceeds prior location-specific libraries of haboob events in that it employs air quality and meteorological data in haboob classification.

## 2. Material and methods

### 2.1. Retrieval of meteorological and air quality records

Metropolitan Phoenix covers a large area (37,700 km<sup>2</sup>) and as such, there is heterogeneity in dust deposition throughout the area (Péwé et al., 1981). To maintain consistency with older studies, the weather station at the Phoenix Sky Harbor International Airport (KPHX; see Fig. 3) was selected for dust event identification. The KPHX station has weather records back to 1930 and was also the location used in the older published dust storm studies (e.g., Brazel and Nickling, 1986). KPHX is also proximal to ASU's Tempe campus as well as to a variety of long-term ecological study sites (e.g., Ball and Guevara, 2015; Bateman et al., 2015; Davis et al., 2015; Giraudeau et al., 2015) for which the deposition predictions of this work could augment the existing research. We retrieved KPHX hourly, quality-controlled local climatological data from 2005 to 2014 (U.S. NOAA, 2015). Haboob classifications were applied using  $c(\text{PM}_{10})$  data from two air quality stations that were selected in proximity to KPHX, namely, Central Phoenix (CP) and Tempe (TE); see Table 1 and Fig. 3 (U.S. EPA, 2015).

Four additional weather stations in Tempe were used to confirm the presence of haboob dust, namely AN014, MAGC, SA31, and SRP01 (MesoWest, 2015). Two additional air quality sites were chosen to better distinguish high smog events from dust events, namely DI and VEL (see Table 1 and Fig. 3; U.S. EPA, 2015).

### 2.2. Historical haboob identification and categorization

Hourly weather and air quality data from KPHX for the years 2005–2014 were searched for dust event signatures (see flowchart in Fig. S1). A dust event was considered a meteorological condition of reduced visibility (VIS), elevated wind and/or gust speed ( $v_{\text{WG}}$ ), and elevated  $c(\text{PM}_{10})$ . To begin, a preliminary list was generated for hours in which any of the following occurred: minimum  $\text{VIS} < 16 \text{ km}$  ( $< 10 \text{ mi}$ ), maximum  $v_{\text{WG}} > 17 \text{ m s}^{-1}$  ( $> 40 \text{ mi h}^{-1}$ ), a 1 h average  $c(\text{PM}_{10}) \geq 200 \mu\text{g m}^{-3}$ , or the occurrence of dust-related METAR weather condition codes (e.g., BLDU, blowing dust; DS, dust storm; DU, widespread dust; HZ, haze; TS, thunderstorm; SQ, squall). The hours identified were then grouped into events. Events were assumed to be separate when the weather and air quality signatures returned or were 'reset to fair weather conditions' for at least 6 h. There were 422 events which met the preliminary criteria. Some confounding factors which can cause low air visibility were heavy rain, fog, and smog. To avoid false-positives, each event was assessed individually for coincident VIS drops,  $v_{\text{WG}}$  spikes,  $c(\text{PM}_{10})$  spikes, and appropriate METAR weather condition codes. After removing high smog episodes, fog, heavy rain, and thunderstorms without dust, there were 266 candidate dust events that remained.

There is a characteristic meteorological signature that accompanies thunderstorm outflows and, therefore, haboobs (Idso et al., 1972). This signature includes a rapid increase in humidity and air pressure, a rapid decrease in air temperature, and a spike in  $c(\text{PM}_{10})$ , generally  $\geq 200 \mu\text{g m}^{-3}$  for 1–3 h (see Fig. S2). The individual dust events were inspected for this signature and were categorized as either haboobs or 'other dust'. Non-haboob dust events had longer durations (i.e., 3–12 h) of elevated  $c(\text{PM}_{10})$  without abrupt changes in temperature, humidity, and pressure. Mild haboobs with visibility  $\text{VIS} > 11.3 \text{ km}$  ( $> 7 \text{ mi}$ ) were grouped with the 'other dust' since they were more difficult to positively identify. Following data review, 96 haboob events with  $\text{VIS} \leq 11.3 \text{ km}$  ( $\leq 7 \text{ mi}$ ) were identified for the years 2005–2014 (see Table S1 for list). Photographic evidence for haboob events early in this period was often not available. In the latter portion of the 2005–2014 period, social media reports of these events were more common and of the 96 haboob events, 43 were confirmed by photographs of advancing 'walls' of dust obtained from the local press, social media, or web camera records.

### 2.3. Dry deposition model

Dry deposition in Tempe was estimated using a model similar to that of Sauret et al. (2009). The sedimentation velocities ( $v_s$ ) for 36 particles sizes (aerodynamic diameters from 0.1 to 320  $\mu\text{m}$ ) were calculated with Eq. (1), where  $\rho_p$  is the particle density ( $1.7 \times 10^6 \text{ g m}^{-3}$ ),  $d_{p,j}$  is the  $j$ th aerodynamic particle diameter,  $g$  is the gravitational constant,  $C_{f,j}$  is the diameter-specific particle Cunningham factor (i.e., a sliding factor), and  $\eta_{\text{air}}$  is the dynamic viscosity of air:

$$v_{s,j} = d_{p,j}^2 \rho_p g C_{f,j} / (18 \eta_{\text{air}}) \quad (1)$$

$C_{f,j}$  was calculated as a function of  $d_{p,j}$  where  $\lambda_p$  is the particulate mean free path in air (an estimated constant value of 0.066  $\mu\text{m}$ ). Calculated  $C_{f,j}$  agreed with values given in Sauret et al. (2009) and Seinfeld and Pandis (2006):

$$C_{f,j} = 1 + \frac{\lambda_p}{d_{p,j}} (2.514 + 0.8 e^{-0.55 d_{p,j} / \lambda_p}) \quad (2)$$

Diameter specific Reynolds numbers ( $Re_j$ ) were calculated as a function of  $d_{p,j}$  where  $\rho_{\text{air}}$  is the density of air:

$$Re_j = \rho_{\text{air}} v_{s,j} d_{p,j} / \eta_{\text{air}} \quad (3)$$

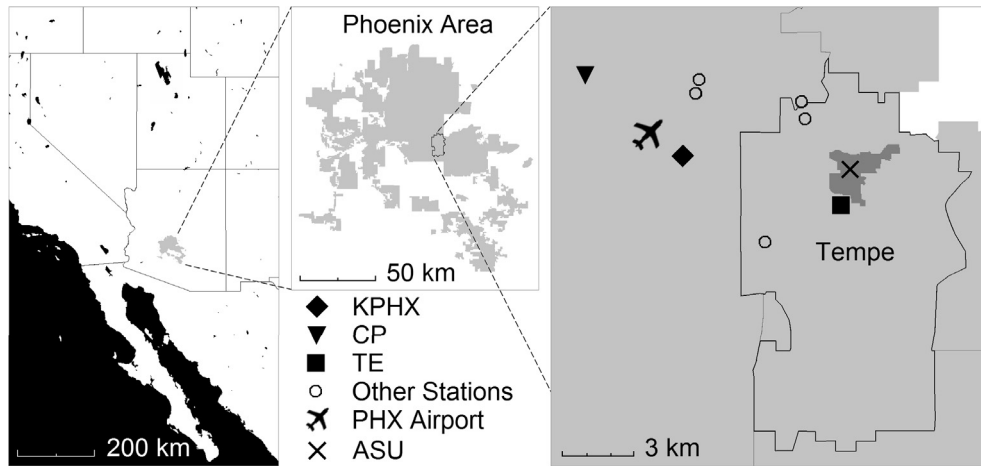
For particle sizes where the  $Re_j$  was  $> 1$ , drag was included in the sedimentation velocity calculation and  $v_{s,j}$  from Eq. (4) was used in deposition calculations (Seinfeld and Pandis, 2006):

$$v_{s,j} = d_{p,j}^{8/7} \left( \frac{4}{55.5} g \rho_p C_{f,j} \right)^{5/7} / \left( \rho_{\text{air}}^{2/7} \eta_{\text{air}}^{3/7} \right) \quad (4)$$

A static value of  $\eta_{\text{air}}$  is not adequate for metropolitan Phoenix where diurnal temperatures differ by an average of 12 °C (22 °F) with a range of 2–22 °C (4–39 °F; U.S. NOAA, 2015). During thunderstorm outflows, the temperature and pressure both change, causing  $\eta_{\text{air}}$  to decrease and therefore  $v_s$  to increase by as much as 5% in 1–2 h (e.g., 2 August 2005 in Fig. S3). Hourly  $\eta_{\text{air}}$  and  $\rho_{\text{air}}$  were calculated using Mathematica 10 (Mathematica, 2015a, 2015b) as a function of KPHX dry bulb air temperature and air pressure. Values for  $\eta_{\text{air}}$  and  $\rho_{\text{air}}$  varied by time of day and by season, with  $\eta_{\text{air}}$  ranging from 0.0171 to 0.0195  $\text{g m}^{-1} \text{s}^{-1}$  and  $\rho_{\text{air}}$  ranging from 1.05 to 1.27  $\text{kg m}^{-3}$  (see Figs. S3 and S4).

The dry deposition flux ( $J_d$ ) was calculated using Eq. (5), where  $v_{s,i,j}$  is the sedimentation velocity of PM with diameter  $j$  during a time interval  $i$ ,  $x_j$  is the diameter-specific mass fraction,  $t_i$  is the length of a measurement interval (i.e., 1 h), and  $c(\text{PM}_{10})_i$  is the  $\text{PM}_{10}$  mass concentration during the interval:





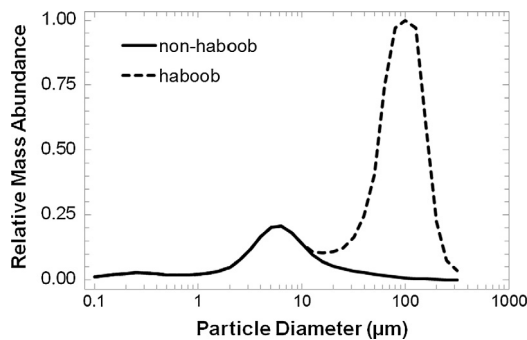
**Fig. 3.** Map of the southwest U.S. (left) with gray shading indicating metropolitan Phoenix, an enlargement of metropolitan Phoenix (middle) with the City of Tempe's boundaries as a black line, and a detail map of the City of Tempe (right) with the ASU campus indicated by an 'x' and dark gray shading. The local meteorological stations and air quality system monitoring sites are indicated by symbols. The filled diamond, triangle, and square indicate locations of the KPHX, CP, and TE sites, respectively; open circles indicate the locations of other meteorological stations and air quality sites, including: MAGC, SA31, SRP01, DI, and VEL. The Phoenix Sky Harbor International Airport is indicated by a small plane. (See Table 1 for full station names and station abbreviations in the legend.)

**Table 1**  
Summary of public data and sources used to categorize haboob events.

Abbreviation	Date range	Data type	Station name	Station ID	Provider
KPHX	2005–Present	QCLCD <sup>†</sup>	Phoenix Sky Harbor International Airport	WBAN 23,183 <sup>‡</sup>	U.S. Weather Bureau <sup>□</sup>
CP	1930–Present	Meteorological	Phoenix Sky Harbor International Airport		
	1985–Present	c(PM <sub>10</sub> ) <sup>^</sup>	Central Phoenix	AQS* 04-013-3002	MCAQ <sup>#, @</sup>
	1965–Present	Gases	Central Phoenix		
TE <sup>''</sup>	2012–Present	c(PM <sub>10</sub> ), c(PM <sub>2.5</sub> ) <sup>¶</sup>	Tempe	AQS 04-013-4005	MCAQ
	2000–Present	Gases	Tempe		
DI	2014–Present	c(PM <sub>2.5</sub> ), Gases	Diablo	AQS 04-013-4019	MCAQ
VEL	1989–Present	Gases	Vehicle Emissions Lab	AQS 04-013-9998	ADEQ <sup>£, @</sup>
	2003–Present	Nephelometry	Vehicle Emissions Lab		
AN014 <sup>''</sup>	2010–2014	Meteorological	Tempe	AN014	MCAQ
SA31	2014–2015	Meteorological	Tempe SA31	SA31	MADIS <sup>¶, §</sup>
SRP01	2013–Present	Meteorological	SRP	SRP01	Salt River Project <sup>§</sup>
MAGC	2005–Present	Meteorological	GateWay Community College	MAGC	MFCD <sup>¥, §</sup>

Notes: <sup>†</sup>, QCLCD: hourly quality controlled local climatological data; <sup>‡</sup>, WBAN: Weather-Bureau-Army-Navy; <sup>□</sup>, <http://www.ncdc.noaa.gov/qclcd>; <sup>^</sup>, c(PM<sub>10</sub>): PM<sub>10</sub> mass concentration; \*, AQS: U.S. Environmental Protection Agency Air Quality System; #, MCAQ: Maricopa County Air Quality; @, <http://aq5.epa.gov/api>; <sup>''</sup>, Stations TE and AN014 are co-located; <sup>¶</sup>, c(PM<sub>2.5</sub>): PM<sub>2.5</sub> mass concentration; <sup>£</sup>, ADEQ: Arizona Department of Environmental Quality; <sup>¶</sup>, MADIS: Meteorological Assimilation Data Ingest System; <sup>§</sup>, <http://mesowest.utah.edu>; <sup>¥</sup>, MFCD: Maricopa County Flood Control District.

$$J_{\text{dry}} = \sum_{i=1}^n \left[ t_i c(\text{PM}_{10})_i \cdot \sum_{j=0.1\mu\text{m}}^{320\mu\text{m}} [v_{s,ij} x_j] \right] \quad (5)$$



**Fig. 4.** Composite PM mass distributions for haboob and non-haboob periods. The haboob distribution had a  $\frac{\text{PM}_{10}}{\text{TSP}}$  mass ratio of 0.20. The non-haboob distribution was the average of literature mass distributions (Sauret et al., 2009; Seinfeld and Pandis, 2006). The haboob and the non-haboob distributions differed only for particle aerodynamic diameters  $>10 \mu\text{m}$ . Much of the mass in the haboob distribution was comprised of large particles. See Figs. S5 and S6 for a more detailed explanation.

The PM mass distributions were calculated from distributions reported in the literature (see Fig. 4). During non-haboob time periods,  $x_j$  was the average of two distributions (Sauret et al., 2009; Seinfeld and Pandis, 2006). Values of  $x_j$  were scaled so that the entire PM<sub>10</sub> mass fraction was unity:

$$\sum_{j=0.1\mu\text{m}}^{10\mu\text{m}} x_j = 1 \quad (6)$$

During haboob time periods, we employed a distinct mass distribution based on dust storm distributions from the literature (Box et al., 2010; Chen and Fryrear, 2002; Gillette et al., 1978; O'Hara et al., 2006). During dust events such as haboobs, much of the particulate mass is comprised of PM<sub>>10</sub> (PM with  $d_p > 10 \mu\text{m}$ ). The mass ratio of PM<sub>10</sub> to the total suspended particulates (TSP), or  $\frac{\text{PM}_{10}}{\text{TSP}}$ , has often been reported to be  $<0.3$  during large dust storms (see Table 2) meaning that there was more mass of particles with  $d_p > 10 \mu\text{m}$  than the mass with  $d_p \leq 10 \mu\text{m}$ . Due to differences in sampling methodologies as well as to the quite variable intensity of dust storms, literature particle mass distribution ratios vary somewhat widely (Table 2). Some  $\frac{\text{PM}_{10}}{\text{TSP}}$  ratios are listed as upper bounds in Table 2 as a consequence: PM<sub>>18</sub> was not reported

**Table 2**

Dust storm mass distribution ratios and deposition.

Location	$\frac{PM_{10}}{TSP}$ <sup>¥</sup>	$J_d(TSP)$ <sup>¢</sup> , kg ha <sup>-1</sup>	Sample duration	Reference
<b>USA</b>				
Phoenix	n/a	540 yr <sup>-1</sup>	Annual	Péwé et al. (1981)
Western Texas	0.06 <sup>*,□</sup>	850 h <sup>-1</sup>	1 haboob	Chen and Fryrear (2002)
Colorado and Kansas	0.28; 0.30 <sup>□</sup>	n/a	2 dust storms	Chepil (1957)
Northwest Texas	0.18–0.27 <sup>*</sup>	210–790 h <sup>-1</sup>	3 dust storms	Gillette et al. (1978)
Pennsylvania	n/a	15.3, storm total	1 dust storm <sup>†</sup>	Miller (1934)
Southern California & Nevada	n/a	20–200 yr <sup>-1</sup>	Annual	Reheis (2006)
<b>Europe</b>				
Ukraine	n/a	20–6940 mo <sup>-1</sup>	4 weeks <sup>§</sup>	Shikula (1981)
<b>Middle East</b>				
Dead Sea, Israel	n/a	255–605 yr <sup>-1</sup>	Annual	Singer et al. (2003)
Negev Desert, Israel	n/a	1100–2200 yr <sup>-1</sup>	Annual	Goossens and Offer (1995)
<b>Northern Africa</b>				
Libya	<0.18 to <0.77 <sup>‡</sup>	366–4210 yr <sup>-1</sup>	Annual	O'Hara et al. (2006)
Western Chad	n/a	537 yr <sup>-1</sup> <sup>@</sup>	Annual	Maley (1980)
Northern Nigeria	n/a	991 yr <sup>-1</sup>	Annual	McTainsh (1980)
Northern Nigeria	<0.67 <sup>‡</sup>	>850 yr <sup>-1</sup>	1 dust season	Møberg et al. (1991)
Southwest Niger	n/a	1640–2120 yr <sup>-1</sup>	Annual	Drees et al. (1993)
<b>Australia and New Zealand</b>				
Sydney, Australia	<0.85; <0.87 <sup>*,^</sup>	n/a	2 dust storms	Box et al. (2010)
South Island, New Zealand	n/a	>710 to >6140 yr <sup>-1</sup>	1 dust season	McGowan et al. (1996)

Notes: ¥,  $\frac{PM_{10}}{TSP}$ : mass ratio of PM<sub>10</sub> to TSP; ¢,  $J_d(TSP)$ : TSP dry deposition flux; \*, ratio was estimated from histograms; □, average of 5–20 ft. sampler heights; †, originated in mid-west USA and traveled 2000 km; §, historically, the dust storms during the 4 weeks were unusually severe for the Ukraine; ‡, PM<sub>20</sub> and PM<sub>>20</sub> were reported; @, calculated with dust density of 0.85 g cm<sup>-3</sup>; ^, PM<sub>>18</sub> not reported.

(Box et al., 2010) or PM<sub>20</sub> and PM<sub>>20</sub> were reported but not PM<sub>10</sub> and PM<sub>>10</sub> (Møberg et al., 1991; O'Hara et al., 2006). The composite haboob mass distribution used in this study was identical to the non-haboob distribution for PM<sub>10</sub>, but for PM<sub>>10</sub> the haboob  $x_j$  values were scaled with the mass ratio  $\frac{PM_{10}}{TSP}$  such that Eq. (7) obtained:

$$\sum_{j>10\mu m}^{320\mu m} x_j = 1 - \frac{PM_{10}}{TSP} \quad (7)$$

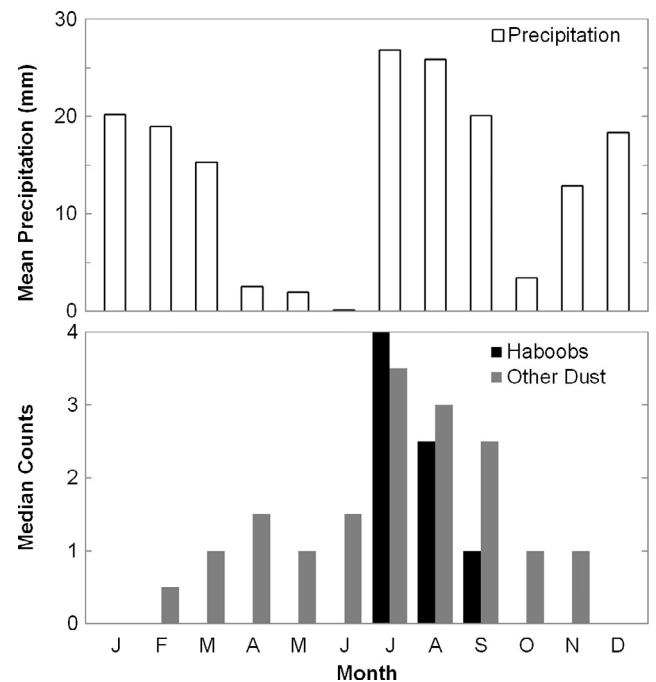
Thus, the model utilized a particle mass distribution where much of the haboob TSP was PM<sub>>10</sub> ( $\frac{PM_{10}}{TSP} = 0.20$ ) while the background (non-haboob) TSP mass was primarily PM<sub>10</sub> ( $\frac{PM_{10}}{TSP} = 0.78$ ). A more detailed discussion of the literature and composite distributions is given in Figs. S5 and S6. To avoid overestimation of deposition, the non-haboob mass distribution was used for mild haboob events (i.e., VIS > 11.3 km) and for dust events lacking a clear meteorological signature of a convective thunderstorm outflow.

### 3. Results and discussion

#### 3.1. Haboob occurrence, characteristics, and frequency

Most haboobs with VIS ≤ 11.3 km (≤ 7 mi) in Tempe over the period 2005–2014 occurred in the months of July and August, which exhibited median event frequencies of 4 and 2.5, respectively (Fig. 5). This timeframe coincides with the North American monsoon season and is in agreement with Brazel and Nickling's (1986) data for haboobs near Tempe from 1965 to 1980.

In Fig. 5, zero median dust event occurrences are indicated as the absence of a bar. In June, the mean annual precipitation was 0.05 mm. The summertime precipitation pattern and haboob modes are consequences of thunderstorm evolution and convective outflows. Haboobs do not necessarily require precipitation to occur, yet are intrinsically linked to the summer precipitation near metropolitan Phoenix. Thus, the most intense type of dust storm that occurs in Tempe, the haboob, is not only dependent upon relatively hot and dry surface conditions, but also requires significant



**Fig. 5.** Monthly mean precipitation (top) and median dust occurrence (bottom) in Tempe over the period 2005–2014. Haboobs were categorized as convective outflow events with minimum VIS > 11.3 km (7 mi). Other dust comprises events that failed to meet either the visibility or the meteorological criteria for haboobs. Precipitation was bimodal; rains during the North American monsoon season (July to September) coincided with haboobs while winter precipitation (November to March) coincided with few dust events.

sources of moisture from outside the region, such as the Gulf of Mexico and Gulf of California (Sorooshian et al., 2011). Haboobs do not coincide with the winter rainy periods since winter storms do not have the characteristics necessary to trigger haboob events (e.g., convective outflow, surface temperatures, etc.).

The ‘other dust’ events category included unconfirmed haboobs, mild haboobs (e.g., minimum  $VIS > 11.3$  km), and dust caused by other meteorological phenomena such as cold fronts. ‘Other dust’ events occurred in most months of the year with a mode during the monsoon season due to the contribution of mild haboobs. The winter precipitation mode appeared to inhibit dust storms, as indicated by zero median dust event occurrences in December and January (see Fig. 5).

The number of haboobs and precipitation varied substantially from year to year over the period 2005–2014. Haboob occurrences ranged from 3 to 20  $\text{yr}^{-1}$  with an annual average of 9.6  $\text{yr}^{-1}$  (see Fig. 6). Cumulative annual precipitation (i.e., total precipitation in a calendar year) ranged from 83 to 240  $\text{mm yr}^{-1}$ , with an average of 166  $\text{mm yr}^{-1}$ . Such year-to-year variation was also reported from 1965 to 1980 by Brazel and Nickling (1986) when the number of haboobs ranged from 1 to 19  $\text{yr}^{-1}$ . In general, fewer haboobs occurred during 2005–2014 in years with greater annual precipitation, in agreement with Brazel (1989) and Holcombe et al. (1997). For example, in 2008 and 2010, Tempe received 240 and 230  $\text{mm yr}^{-1}$  rain, respectively, and experienced 4 and 3 haboobs, respectively. In drier years, for example 2011 and 2012, Tempe received less rain, 118 and 109  $\text{mm yr}^{-1}$ , respectively, and experienced 20 and 19 haboobs, respectively. However, the relationship between precipitation and haboobs in Tempe is complicated by the bimodality of annual precipitation and by many other factors unrelated to precipitation (e.g., anthropogenic activity and land use changes; Macpherson et al., 2008). During the driest year of this study, 2009, Tempe received 83 mm of precipitation and experienced 7 haboobs, a below average number. The year 2009 was the only year investigated in this study when annual precipitation was below 100 mm. The simplest explanation of decreased haboob occurrence during 2009 is that it was a manifestation that summer precipitation and haboobs have a mutual source: thunderstorms. However, Goudie (1983) observed that global dust storm occurrence increased as precipitation decreased until reaching a

‘hyperaridity’ threshold, 100  $\text{mm yr}^{-1}$ , below which dust storm occurrence decreased, which was speculated to be due to prior removal of wind-erodible soil, the formation of wind-stable desiccated surfaces, and/or a lack of moisture-associated, dust-storm-initiating weather patterns (e.g., thunderstorms, frontal passage). Further investigation would be required to assess whether this hyperaridity threshold applies in central AZ. The bimodality of precipitation in Tempe as well as anthropogenic activity and land use change very likely also impact the specific relationship between haboob occurrence and precipitation.

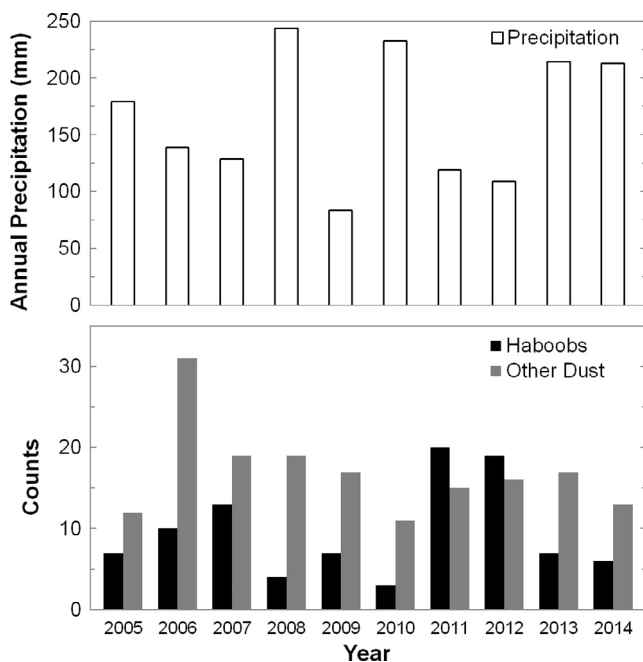
The relationship between precipitation and haboobs in an urban environment is likely to be complex. Land use, land cover, and the disruption of stabilized soil surfaces are affected by a variety of human factors such as economic downturns (i.e., decreased construction, agricultural, and recreational activities), dust mitigation efforts, and air quality regulations (Clements et al., 2014; Holcombe et al., 1997; Hyers and Marcus, 1981; Macpherson et al., 2008; Upadhyay et al., 2015). Precipitation from thunderstorms in this region is extremely heterogeneous and can also evaporate significantly before reaching the Earth’s surface during the initiation of a haboob. The precipitation that reaches the ground may also occur far from Tempe and thus, would not be apparent in the Tempe precipitation records. Metropolitan Phoenix is a highly built-environment and the city has reservoirs that buffer against drought and canals that distribute water year-round. It is, as yet, unclear how much impact diminished precipitation really has on dust production in the area.

The systematic method used in this work provided robust classifications (see Fig. 7) with significant differences between the mean of haboobs and all other dust events for maximum  $v_{WG}$  ( $p < 0.001$ ) as well as maximum  $c(\text{PM}_{10})$  ( $p < 0.001$ ). The mean  $v_{WG}$  of haboobs was  $>75\%$  of other dust events (see Fig. 7) and the mean of haboob maximum  $c(\text{PM}_{10})$ ,  $884 \mu\text{g m}^{-3}$ , was larger than most (99<sup>th</sup> percentile) of the other dust events. All of the dust event peak  $c(\text{PM}_{10})$  were larger than the background mean  $c(\text{PM}_{10})$  of  $33 \mu\text{g m}^{-3}$ . The differences in the mean minimum  $VIS$  of haboobs and other dust are a consequence, in part, of the visibility threshold employed in the classification method. Peak  $c(\text{PM}_{10})$  in the hundreds or thousands of  $\mu\text{g m}^{-3}$  is relatively high yet it is sustained for only one or two hours, which may allow one to limit exposure to high PM by seeking shelter from the storm.

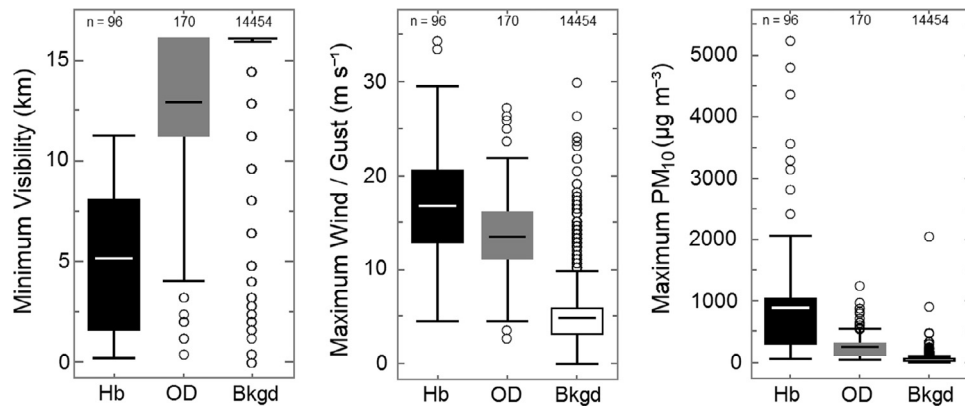
### 3.2. Comparison with literature classification methods

The classification method used in this work bears similarity to classifications previously applied in other U.S. locations. Hagen and Woodruff (1973) and Orgill and Sehmel (1976) identified dust storms from historical records based on 2 criteria: (1) when dust was reported and  $VIS < 11.3$  km; or (2) when  $11.3 \leq VIS \leq 14.5$  km and  $v_{WG} > 5.4 \text{ m s}^{-1}$  (7 mi, 7–9 mi, and 12 mi  $\text{h}^{-1}$ , respectively). The present work did not employ a wind speed requirement to be considered a dust event. Nevertheless, nearly 97% of all dust events cataloged here had peak  $v_{WG} > 5.4 \text{ m s}^{-1}$ . Notably, the past work of Hagen and Woodruff (1973) and Orgill and Sehmel (1976) did not distinguish between types of dust storms or report dust statistics specific to Phoenix.

Lei and Wang (2014) cataloged and characterized dust storms of many kinds (including haboobs) throughout the southwestern U.S. for 10 years. Their methodology did not specify a visibility threshold but was based on dust storms in the literature and in the media that had supporting evidence in meteorological and air quality records. Their method could not be used in Tempe to classify haboobs since there has been a dramatic increase in public awareness and social media attention in the last few years. Only classifying the publicized and media-reported events in Tempe



**Fig. 6.** The annual precipitation (by calendar year; top) and annual occurrence of dust events (bottom) in Tempe over the period 2005–2014. Haboobs were convective outflow events with minimum  $VIS \leq 11.3$  km. ‘Other dust’ events failed to meet haboob visibility or meteorological criteria. There was significant year-to-year variation in precipitation and in haboob occurrence: 83–240 mm and 3–20 haboobs respectively.



**Fig. 7.** Box plots summarizing basic characteristics of dust storms in Tempe for the period 2005–2014. Minimum visibility (left), maximum wind or gust speed (middle), and maximum PM<sub>10</sub> concentration (right) are the major factors that distinguish haboob events (Hb) from other dust events (OD) and background (Bkgd) conditions. The horizontal lines inside the boxes are mean values; the box boundaries are the 25th and 75th percentiles, respectively; the whiskers are the 10th and 90th percentiles, respectively; and the symbols are outliers. Haboobs with  $VIS \leq 11.3$  km (7 mi) had much higher PM<sub>10</sub> concentrations than ‘other dust’ events. Other dust includes those events that failed to meet the visibility and meteorological criteria for haboobs. The background data was divided into 6-h intervals and are the extrema for those time periods. Background data include periods of smog, fog, rain, and fair weather. The numbers above the box plots are the event counts.

would have introduced a significant bias toward very recent and/or large events.

It is possible to subdivide our haboob category based on intensity using the KPHX visibility data. Brazel and Nickling (1986) and Nickling and Brazel (1984) classified dust storms by storm type and by visibility in specific areas of Arizona, including Tempe. They employed visibility thresholds of  $VIS \leq 1.6$  km (1 mi) as intense and  $1.6 < VIS \leq 11.3$  km (1–7 mi) as moderate. Using their classification system, we identified 25 ‘intense’ haboobs and 71 ‘moderate’ haboobs during the time period 2005–2014. Another difference between the work of Brazel and Nickling and our current work was that they used four meteorological categories for dust while the current work used only two categories (‘haboob’ and ‘other dust’).

The Australian Meteorological Society visibility threshold for severe dust storms is  $VIS \leq 0.2$  km and the threshold for moderate dust storms is  $< 1$  km (about 0.12 and 0.63 mi, respectively); higher visibility dust events are not considered storms but blowing dust episodes (O’Loingsigh et al., 2014). Using this classification system, we identified one ‘severe’ haboob and six ‘moderate’ haboobs in Tempe during the years 2005–2014. Indeed, the ‘severe’ haboob (5 July 2011) was quite exceptional in that it was larger than any haboob in the preceding 10 years (2001–2011) (Raman et al., 2014); this event caused power outages for ~10,000 customers, delayed airline flights, and received much attention even in the national press and social media (e.g., Huffington Post, 2011). We included in our catalog haboobs of lesser intensity than a ‘dust storm’ by international standards because they are noteworthy and disruptive to the large population in metropolitan Phoenix, frequently exceeding the NAAQS 24-h  $c(\text{PM}_{10})$  limit ( $150 \mu\text{g m}^{-3}$ ; U.S. EPA, 2013). Moreover, these smaller haboob events also have high TSP deposition.

Land use in the area directly surrounding KPHX has changed substantially since the systematic categorization of haboobs in Tempe by Brazel and Nickling (1986). Areas that had extensive agricultural fields have been replaced with suburban and industrial development. An approximate boundary between urban and agricultural areas used to be 5–10 km south of KPHX but that has expanded to 15–20 km south of KPHX (Jenerette et al., 2001; Li et al., 2014; Maricopa County Assessor’s Office, 2016). A direct comparison with the literature to determine whether the number and/or intensity of haboobs in metropolitan Phoenix has changed in since the mid-20th century will require additional locations beyond just the KPHX station and is thus beyond the scope of this

paper. Additionally, the nearly one order of magnitude annual variation in haboob occurrences and the relatively short temporal coverage of the present work (10 years) further prevents a more robust temporal comparison.

### 3.3. Uncertainties in the deposition model and sensitivity analysis

The largest uncertainty in the deposition calculations is the mass distribution employed for haboob events since no measurements are available for the Phoenix area. It is known that uncertainty in particle mass distributions affects the accuracy of global and local deposition models (Lawrence and Neff, 2009). In the present work, the calculated deposition was found to increase by 700% between  $\frac{\text{PM}_{10}}{\text{TSP}}$  ratios of 0.09 and 0.50 (data not shown). The ratio makes a significant difference since large particles deposit faster than small particles. There are some studies of dust storm particle mass distributions but diameter ranges are sometimes incomplete and the agreement between studies is somewhat limited (Box et al., 2010; Chen and Fryrear, 2002; Chepil, 1957; Gillette et al., 1978; Moberg et al., 1991; O’Hara et al., 2006; Singer et al., 2003). We anticipate that dust distributions will differ by location and dust source. Other differences are method related. Many different techniques for determining diameter specific PM mass distributions have been employed in the literature including: multi-stage impactor sampling (Box et al., 2010); sedimentation in air (Chen and Fryrear, 2002); sedimentation in aqueous solution (Moberg et al., 1991); sedimentation in chlorinated solvent (Chepil, 1957; Chepil and Woodruff, 1957); mechanical sieving (Chen and Fryrear, 2002); measurements with a phase-contrast light microscope (Gillette et al., 1978); and laser particle counters (O’Hara et al., 2006; Singer et al., 2003). Each method of particle size analysis differs in the range of particle sizes reliably quantified and the associated artifacts of analysis.

Our model employed  $c(\text{PM}_{10})$  to estimate TSP deposition.  $c(\text{PM}_{>10})$  is seldom reported due to the physical constraints of commercially available sampling equipment (e.g., standard multistage high-volume samplers). This may be due to the fact that  $\text{PM}_{>10}$  is not regulated as an air quality hazard. Since total suspended particle concentration,  $c(\text{TSP})$  was not available in Tempe, a synthesized  $\frac{\text{PM}_{10}}{\text{TSP}}$  mass ratio of 0.20 was used for haboobs; this value is within the range of values reported for other locations (see Table 2). A few studies in Northern Africa (Moberg et al., 1991; O’Hara et al., 2006) quantified  $\text{PM}_{20}$  and  $\text{PM}_{>20}$  from which a  $\frac{\text{PM}_{20}}{\text{TSP}}$  mass ratio



can be determined (Table 2). For these, the  $\frac{PM_{10}}{TSP}$  mass ratios are estimated as upper bounds since  $\frac{PM_{20}}{TSP} > \frac{PM_{10}}{TSP}$ . Mass ratios derived from measurements in Australia are similarly given as upper bounds since  $PM_{>18}$  was not measured (Box et al., 2010) and  $\frac{PM_{10}}{PM_{>18}} > \frac{PM_{10}}{TSP}$ .

It is likely that the  $\frac{PM_{10}}{TSP}$  ratio would be lower for low visibility haboobs than for moderate visibility haboobs as the amount of large particles,  $c(PM_{>10})$ , would be higher. Since detailed and event-specific TSP mass distributions were not available, we employed 0.20 for all haboobs with  $VIS > 11.3$  km ( $>7$  mi). The calculated deposition of the ‘other dust’ events is likely an underestimate since the non-haboob PM mass spectrum was employed, which lacks a large particle ( $PM_{>10}$ ) mode.

The measurement of  $c(PM_{10})$  at the CP and TE air quality monitoring sites varied both in time and in magnitude. This was to be expected since thunderstorm outflows are directional and may not arrive at different locations throughout metropolitan Phoenix at the same time. In an attempt to minimize these differences, the meteorological and air quality sites used were chosen to be the closest to a reference point: the ASU Tempe campus (Fig. 3). The deposition in other areas of metropolitan Phoenix may differ considerably from the deposition in Tempe.

$PM_{10}$  concentration is sometimes reported as 24 h averages instead of 1 h averages. Using 24 h  $c(PM_{10})$  data overestimates haboob deposition by 86% (data not shown). The time resolution of a haboob event (1–3 h) is too short to be accurately represented by a 24 h  $c(PM_{10})$  value. Employing the haboob particle mass distribution for a full 24 h would erroneously incorporate large particles as a significant fraction of TSP both before and after the haboob events. To avoid such artifacts, we employed 1 h  $c(PM_{10})$ .

### 3.4. Dry deposition

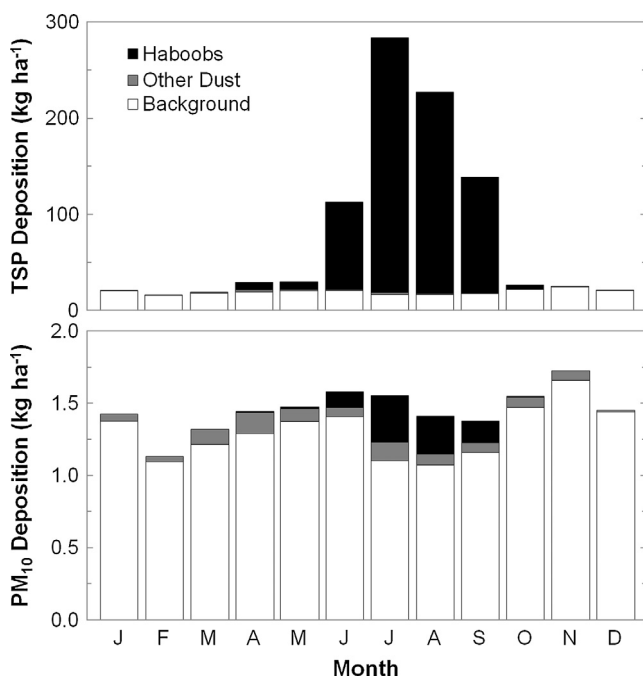
The dry deposition flux,  $J_d$ , for both  $PM_{10}$  and TSP was calculated after making simple assumptions about the particle size

distributions present in dust storms and employing a  $\frac{PM_{10}}{TSP}$  mass ratio of 0.20. The deposition followed trends in haboob occurrence (see Fig. 8). Most of the haboob deposition occurred during the summer (86%, July to September). Because  $J_d(TSP)$  is strongly associated with haboob events, there was a distinct maximum in  $J_d(TSP)$  during the summer monsoon period.

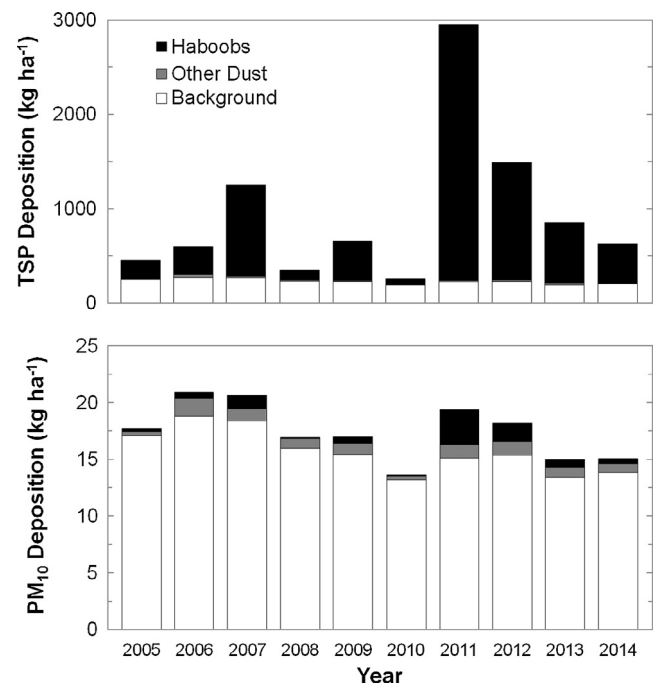
The  $PM_{10}$  dry deposition flux,  $J_d(PM_{10})$ , was nearly constant over the course of the year and haboobs contributed very little  $PM_{10}$  relative to the background; for example, haboob deposition constituted 21% of overall  $J_d(PM_{10})$  in July. The contribution of other dust (events which failed to meet haboob visibility or meteorological criteria) varied somewhat throughout all seasons but was small relative to the calculated background and haboob depositions. Haboob  $J_d(PM_{10})$  was much smaller than haboob  $J_d(TSP)$  (0.1% for July). This was expected since deposition velocity of particles varies in approximate proportion with the particle diameter squared (see Eq. (1)).

The year-to-year variation in  $J_d(PM_{10})$  was small but the year-to-year variation in  $J_d(TSP)$  was much greater due to the effect of haboobs (Fig. 9). This was expected since the number and intensity of haboobs varied from year to year. The year 2011 had the highest  $J_d(TSP)$ , 2950 kg ha<sup>-1</sup>, of which 92% or 2710 kg ha<sup>-1</sup> occurred during the 20 haboobs which occurred that year. In contrast, the wettest year, 2010, had the lowest  $J_d(TSP)$ , 259 kg ha<sup>-1</sup>, with 23% or 60 kg ha<sup>-1</sup> of that being deposited in the three haboobs that occurred that year.

On a mass basis, haboob events accounted for 74% of  $J_d(TSP)$  but only 5% of  $J_d(PM_{10})$ , e.g., Fig. 10. In contrast, the urban background particle deposition accounted for 90% of the total  $J_d(PM_{10})$  but only 24% of the total  $J_d(TSP)$ . Most of the deposition mass (98%) was from particles with  $d_p > 10$  μm. About 35% of the total deposition occurred during haboobs with  $VIS \leq 1.6$  km (1 mi) and 39% from haboobs with  $1.6 < VIS \leq 11.3$  km (1–7 mi; see Fig. S7). In other words, more than a third (333 kg ha<sup>-1</sup>) of  $J_d(TSP)$  was deposited during the most intense quartile of the haboobs ( $n = 25$  out of 96).

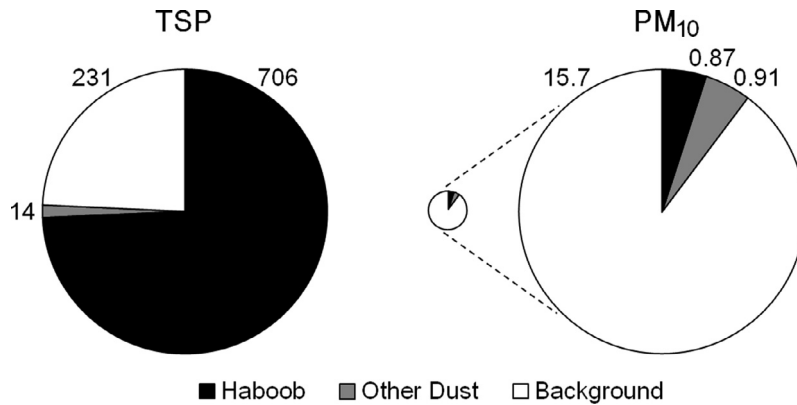


**Fig. 8.** Mean monthly TSP (top) and  $PM_{10}$  (bottom) dry deposition flux (kg ha<sup>-1</sup>) in Tempe over the period 2005–2014. The haboob contribution to TSP flux is large and occurs only during the summer.  $PM_{10}$  flux is a very small fraction of TSP flux and is relatively constant throughout the year. Note the two orders of magnitude difference in the deposition scales.



**Fig. 9.** Annual TSP (top) and  $PM_{10}$  (bottom) dry deposition flux (kg ha<sup>-1</sup>) in Tempe from 2005 to 2014. The haboob contribution to TSP flux is variable and depends on both on the number and magnitude of events.





**Fig. 10.** Mean annual dry deposition ( $\text{kg ha}^{-1} \text{yr}^{-1}$ ) in Tempe for the period 2005–2014. The TSP deposition (left) and the  $\text{PM}_{10}$  deposition (right) for haboobs, other dust and background time periods. The numbers are the deposition quantities in  $\text{kg ha}^{-1} \text{yr}^{-1}$ . The area of the small  $\text{PM}_{10}$  pie chart is scaled proportionally to the TSP deposition pie chart for comparison.

The  $J_d(\text{TSP})$  calculated in this work (mean:  $950 \text{ kg ha}^{-1} \text{yr}^{-1}$ ) was similar in magnitude to deposition fluxes reported in the literature (see Table 2). During a particularly rainy year (355 mm precipitation) in metropolitan Phoenix, Péwé et al. (1981), reported a rooftop  $J_d(\text{TSP}) = 540 \text{ kg ha}^{-1} \text{yr}^{-1}$ , 12% of which was attributed to two haboobs. This compares with the relatively wet year (2010) in this study, with 232 mm rain and  $J_d(\text{TSP}) = 259 \text{ kg ha}^{-1} \text{yr}^{-1}$ , 23% being deposited in three haboobs. Excluding haboob deposition, the  $J_d(\text{TSP})$  of the sum of background and other blowing dust ranged from 199 to  $299 \text{ kg ha}^{-1} \text{yr}^{-1}$  with a mean of  $244 \text{ kg ha}^{-1} \text{yr}^{-1}$ . Smaller  $J_d(\text{TSP})$  of 20–200  $\text{kg ha}^{-1} \text{yr}^{-1}$  has been reported in Southern California and Nevada, where haboobs did not occur (Reheis, 2006). There was only one year where  $J_d(\text{TSP})$  was calculated to be higher than deposition reported in some locations of northern Africa: 2011 with  $J_d(\text{TSP}) = 2950 \text{ kg ha}^{-1} \text{yr}^{-1}$ . In 2011, there were 20 haboobs – the highest in the present work. The estimated  $2950 \text{ kg ha}^{-1} \text{yr}^{-1}$  was less than the deposition of  $6940 \text{ kg ha}^{-1}$  reported in a series of dust storms over a period of four weeks in the Ukraine (Shikula, 1981), less than the  $6140 \text{ kg ha}^{-1} \text{yr}^{-1}$  reported in New Zealand (McGowan et al., 1996), and less than the deposition of  $4210 \text{ kg ha}^{-1} \text{yr}^{-1}$  reported in Waddan, Libya (O'Hara et al., 2006). A single haboob in western Texas (Chen and Fryrear, 2002) was reported to deposit  $850 \text{ kg ha}^{-1} \text{h}^{-1}$ , which was higher than any single haboob identified in the present study, the highest being  $362 \text{ kg ha}^{-1} \text{h}^{-1}$  during the 30 June 2013 haboob (maximum  $c(\text{PM}_{10}) = 5250 \mu\text{g m}^{-3}$ ; minimum  $\text{VIS} = 1.2 \text{ km}$  (0.75 mi); maximum  $v_{\text{WG}} = 21 \text{ m s}^{-1}$  ( $47 \text{ mi h}^{-1}$ )). The large variation in values of  $J_d(\text{TSP})$  reported for sites throughout the world (Table 2) is probably a reflection of real differences in dust storm intensity, type, and frequency; in that context, the range of predicted annual  $J_d(\text{TSP})$  magnitudes in this study was not surprising. The deposition values calculated within this study were consistent with literature data in arid environments. The recent Vukovic et al. (2014) study also concluded that the models need to better account for the effects of the very largest particle sizes and our results further amplify the need for improved monitoring of large particle sizes.

#### 4. Conclusions

We cataloged the occurrence of haboobs over the time period 2005–2014 using a method based on meteorological and air quality measurements. The major factors that distinguish haboobs events from other dust events and background conditions were event minimum visibility, maximum wind or gust speed, and maximum  $\text{PM}_{10}$  concentration. This work represents a necessary first

step in determining the ecological impact of dust deposition in the Phoenix metropolitan region.

There were between three and 20 haboob events per year, with a somewhat lower number of haboob events occurring in years with higher annual precipitation. The relationship between precipitation and haboob occurrence is complex due to the bimodality of seasonal precipitation as well as the mutual source of haboobs and monsoon precipitation. There was a strong seasonal pattern in haboob occurrence with the majority of haboobs occurring during the North American monsoon season (*i.e.*, June to September) and no events occurring in the winter.

The calculated PM dry deposition in Tempe compares well with literature deposition reported for other arid environments when haboob deposition is included in the model. Annual  $J_d(\text{TSP})$  ranged from a low of  $259 \text{ kg ha}^{-1}$  in 2010 to a high of  $2950 \text{ kg ha}^{-1}$  in 2011. The contribution of large particles ( $\text{PM}_{>10}$ ) is greater than the contribution of  $\text{PM}_{10}$  to deposition: the average annual  $J_d(\text{TSP})$  was  $950 \text{ kg ha}^{-1} \text{yr}^{-1}$  while  $J_d(\text{PM}_{10})$  was  $17 \text{ kg ha}^{-1} \text{yr}^{-1}$ . Our haboob mass distribution was compiled from literature studies, many of which provided only partial information across the range of particle sizes in the deposition model. Thus, there is a need to measure the TSP mass distribution in metropolitan Phoenix.

This study characterized haboobs at a single location in metropolitan Phoenix in an effort to minimize the spatio-temporal heterogeneity of haboobs. There is a continued need to investigate the spatial differences in haboobs throughout metropolitan Phoenix and in surrounding areas. There may also be a need to investigate meteorological and air quality characteristics in the desert to the south where measurements are currently quite limited.

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#### Appendix A. Supplementary material

Supplementary data associated with this article can be found, in the online version, at <http://dx.doi.org/10.1016/j.aeolia.2016.11>.

004. These data include Google maps of the most important areas described in this article.

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