



Dust-producing weather patterns of the North American Great Plains

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Abstract. The North American Great Plains are a semi-arid and windy environment prone to dust events that produce a variety of hazards to public health, transportation, and land degradation. Dust has substantial spatial variability across the plains, and the weather responsible for that dust is understudied in most of the plains, especially the North and East. Here we identify specific weather patterns associated with dust occurrence across the plains. We make use of an atmospheric classification that defines 21 weather patterns for the Great Plains that includes various stages of warm and cold frontal passages, northerlies, anticyclones, and summertime patterns not associated with mid-latitude cyclones. We use the time series of weather pattern to composite satellite daily dust observations from 2012-2021. We calculate average dust occurrence for each weather pattern, the contribution of each pattern to local dust loads, and identify the specific weather patterns most important to each location and subregion. We find no single weather pattern is responsible for dust occurrence in the plains, but that different patterns are responsible for dust in different subregions of the Great Plains. Passing cold fronts are most responsible for dust events in western Texas and New Mexico, southerlies are responsible in the northeastern plains of from Iowa to the Dakotas, and summer weather patterns produce the majority of dust in the High Plains from Colorado to Canada. Identifying the dust-producing weather patterns of particular subregions is a valuable step toward understanding dust variability and improving dust predictions, both present and future.



15 1 Introduction

The North American Great Plains has a long and varied history as a dust source. During the mid-Holocene, North America experienced mega-droughts that lasted for decades and made the Great Plains into strong dust sources (Cook et al. (2007); Cook et al. (2016)). The legacy of this dusty period can still be found in the Sand Hills of western Nebraska where layers of wind-blown sediment from the mid-Holocene are only thinly covered by soil and vegetation today (Miao et al., 2007).
20 Famously, during the Dust Bowl event of the 1930s the southern plains were transformed into an intense dust source by the combined effects of drought and vegetation loss from farming practices not suitable for the region (Schubert et al., 2004; Cook et al., 2009). Today the Great Plains as a dust source are a complex system of both natural and anthropogenic forces (Chen et al., 2018; Ginoux et al., 2012). Conservation tillage, groundwater irrigation, and soil conservation districts have prevented the region from experiencing subsequent dust bowls despite periods of drought (Basara et al., 2013; Angadi et al., 2016;
25 Hansen and Libecap, 2004), but intensive agricultural development has nonetheless enhanced anthropogenic dust emission in the region (Lambert et al., 2020; Kandakji et al., 2021). The climate in most of the region is semi-arid and subject to strong winds, so natural dust emission remains an important part of the regional dust cycle. This climate predisposes the region to act as a dust source and climate variability modulates the strength of that source, but the immediate cause of dust emission is individual weather events in the region (Aryal and Evans, 2022; Pu and Ginoux, 2018, 2017; Achakulwisut et al., 2017).

30 Previous research on dust variability in the Great Plains has primarily focused on climate and climate variability of the region. Seasonally, dust in all parts of the Great Plains is at a minimum in winter, has a spring peak in the southern High Plains of Texas, New Mexico, and Colorado, and a summer peak for the plains east and north of the Texas Panhandle (Hand et al., 2017; Aryal and Evans, 2022). On interannual timescales, El Niño, the Pacific Decadal Oscillation, and Pacific-North America pattern have all been identified as contributing to spring dust variability via their impacts on rainfall patterns (Achakulwisut et al., 2017).
35 This is broadly in agreement with findings by studies that have investigated the relationships between dust occurrence and seasonal precipitation, wind speed, drought, and vegetation (Aryal and Evans 2022, Pu and Ginoux 2017, Pu and Ginoux 2018, (Aryal and Evans, 2022; Pu and Ginoux, 2017, 2018; Arcusa et al., 2020)).

In contrast, there is relatively limited research on the specific weather patterns that are the proximate cause of dust emission and transport in the plains. Where there has been such research, it has led to the identification of dust weather for specific
40 subregions of the United States. For example, “Albuquerque Lows”, wherein a cold front associated with an upper-level trough and a surface low in Colorado sweeps across New Mexico and the Chihuahuan desert, have been identified as the primary cause of dust events in El Paso and the Southern High Plains (Novlan et al., 2007; Rivera et al., 2009). Pu and Ginoux (2018) showed that summertime dusty days in the central Great Plains (north Texas through Kansas) are associated with a westward extension of the subtropical high and intensification of the low-level jet. Outside of the Great Plains, dust events in the Great
45 Basin of Utah are primarily caused by passing troughs with surface lows along the Nevada-Idaho border (Hahnenberger and Nicoll, 2012), and dust events in Arizona are most commonly caused by either frontal passages or thunderstorms, depending on which part of the state (Brazel and Nickling, 1986). These works are invaluable in understanding the origins of dust in



particular areas, but there remain many understudied regions. In this study we aim to comprehensively identify such patterns for all parts of the Great Plains in all seasons.

50 The importance of recognizing dust weather across the Great Plains is underscored by the wide variety of human impacts from dust in the region, especially regarding respiratory health and travel hazards. Dust events in El Paso, Texas are associated with increased hospitalizations for asthma and bronchitis (Grineski et al., 2011), and worldwide, exposure to mineral dust increases the risk of cardiovascular disorders and lung cancer (Goudie, 2014; Giannadaki et al., 2014). Dust originating in the Southwest US has also been shown to be associated with the fungal spores that transmit valley fever (Tong et al., 2017). Many
55 dust sources in the region are near highways (Li et al., 2018), frequently affecting travel in the region by restricting visibility, and leading to highway closures, traffic accidents, and approximately 21 deaths per year (Tong et al., 2023). Many of these impacts, especially travel hazards and acute respiratory illness, are short-lived in time and only occur during and immediately following dust events. Again, the timescale of these impacts underlines the importance of understanding dust at the timescale of weather events in addition to seasonal and climatic timescales.

60 In this manuscript we identify the specific weather patterns that are responsible for dust occurrence in different portions of the Great Plains. We do this by comparing a time series of weather patterns (Evans et al., 2017) to satellite-observed time series of dust occurrence and identifying the patterns which produce the most dust and those which produce the largest percentage of a region's dust. We describe the classification of the weather patterns, the patterns themselves, and the dust observations in Section 2, and the results of comparing those time series in Section 3. Section 4 summarizes our findings and discusses
65 additional implications.

2 Methods

2.1 Classification Process

The weather patterns used in this study were originally defined in Evans et al. (2017), hereafter E17, which contains full details of the classification process and the results. We briefly summarize here the key details of the classification process, and the
70 results of that process, i.e. the weather patterns themselves. E17 defined weather patterns using an iterative clustering algorithm applied to three-dimensional ERA-Interim reanalysis fields for a region spanning south Texas to northern Nebraska and eastern Colorado to eastern Missouri (29.25 – 42.75 °N, 90.75 – 104.25 °W). The fields to represent the weather of the region were air temperature, relative humidity, the u- and v-components of wind, and surface pressure. The fields were sampled on a 9x9 grid spanning 13.5° of latitude and longitude and on seven pressure levels spread through the troposphere. This three-dimensional
75 description of the region's weather was sampled four times daily from 1996–2010, producing 19,476 snapshots of the state of the atmosphere for classification. A k-medians classification algorithm was used to identify and define commonly occurring weather patterns for the region. The patterns were tested for within-pattern consistency and inter-pattern distinctness using independent cloud radar data from the Atmospheric Radiation Measurement Program's site in central Oklahoma. This process was iterated upon until a final set of weather patterns had been defined, each of which had a composite cloud profile that was
80 both stable and distinct.

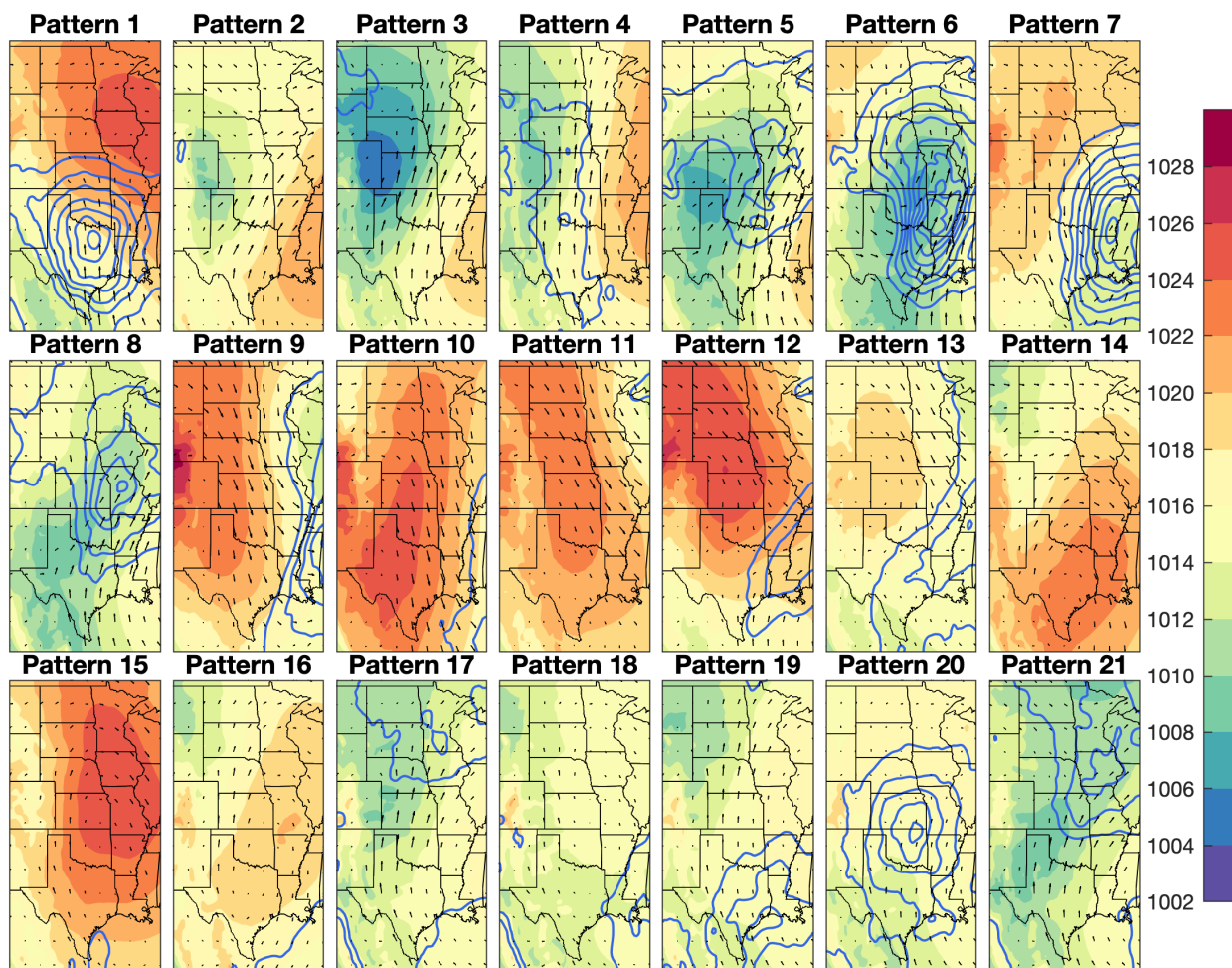


Figure 1. Composite ERA5 properties for each of the 21 weather patterns. Underlying color shows sea level pressure (mb), blue contours are precipitation in 2 mm/day increments beginning at 4 mm/day, and arrows show 875mb wind speed and direction, with longest arrows representing 17.4 m/s.

The result of the classification was 21 weather patterns. Figure 1 shows a selection of composite meteorological values – sea level pressure, 875mb flow, and precipitation - for each weather pattern. Additional values that help to fully describe the weather patterns (500mb flow, 2m temperature) are shown in Figure S1. These patterns could be placed in five broad categories describing the weather in the region, based primarily on the low-level flow in the southern plains: southerlies and warm sectors (Patterns 1-4), cold fronts (Patterns 5-8), post-frontal northerlies (Patterns 9-13), high-pressure systems (Patterns 14-16), and summer weather (Patterns 17-21). Some patterns are borderline, e.g. Pattern 9 has the trailing end of a cold front on the eastern boundary of the domain, but is placed in the northerlies as that is the flow pattern covering most of the region. The first four categories of weather pattern represent phases of passing synoptic-scale weather systems that predominate Great Plains weather



outside of the summer months and have a predictability to them. Southerly or warm sector patterns (Patterns 1-4) are followed
90 by cold front patterns (5-8) as the associated low pressure system and upper-level trough travel from west to east across the
region. Cold northerly patterns (9-13) and high-pressure anticyclones (14-16) then follow as an upper-level ridge passes. The
low-level flow and precipitation shown in Figure 1 help to identify the subregions of the Plains most likely to experience strong
wins and dry conditions. Figure 1 also shows that within a category the differences between patterns are typically a matter of
geographic shifts of the feature, e.g. how far north the southerlies extend (Patterns 2 and 3), cold fronts further east or west
95 (Patterns 5, 6, and 7), or high pressure systems that are shifted north or south (Patterns 14 and 16).

The patterns for E17 were classified for the period from 1996-2010. As the patterns are defined by reanalysis, the time series
of pattern can be readily extended in time. In order to bring the time series up to the present, the original patterns were matched
to ERA5 reanalysis. This allows the categorization of the weather pattern for the entire ERA5 period. In this study the time
period analyzed is the ten years from 2012-2021. This period is chosen to match the satellite dust observations used (next
100 section) that begin in 2012. As the dust observations are daily, a single daily pattern is identified, using the local noon pattern
to most closely match the satellite observation time.

2.1.1 Dust Observations

We use the Visible Infrared Imaging Radiometer Suite (VIIRS) Deep Blue daily $1^{\circ} \times 1^{\circ}$ aerosol product (Hsu et al., 2019;
Sayer et al., 2019) to provide dust observations each day for the years 2012-2021 for the region. We represent dust occurrence
105 with the number of retrievals within each gridbox classified as dust. Retrievals are classified as dust if they are not classified
as smoke (based on reflectivity at multiple wavelength and brightness temperature) and if their Angström Exponent is less
than 0.5, indicating the presence of coarse mode particles. As such, a dust-classified retrieval indicates dust particles were
the predominant aerosol in the atmospheric column. Limiting ourselves to only these retrievals undercounts the occurrence
of dust, as there are days with mixed aerosol species, but also provides confidence that the data being composited by weather
110 pattern are not other aerosols. The VIIRS instrument orbits aboard the Suomi-NPP satellite, which has an overpass time of 1:30
PM. As such our analysis is of dust events that initiate in the morning or midday, or of long-lasting dust events. Short-lived
dust events that initiate after the overpass, or that occur beneath clouds, are not captured in this data. The identification of the
retrieval as dust is also a column value, and thus does not indicate the altitude of the dust particles or whether the location of
observation is also the location of origin. We discuss the impact of these limitations on our results in Section 4. Nonetheless,
115 these data remain a valuable source of information on the occurrence of dust in the Western US, particularly through their
complete spatial coverage.

Each day for the period of study is classified as one of the 21 weather patterns, allowing the VIIRS data to be composited
according to weather pattern. This produces both spatial distributions of dust occurrence for each weather pattern and temporal
distributions of weather pattern for the occurrence of dust in any particular location. Ten years of daily classification yields
120 3,653 days of dust observations that are composited by weather pattern, producing robust statistics for the patterns.



3 Results

3.1 Mean dust occurrence

Figure 2 shows the mean daily retrievals identified as dust by VIIRS for each of the 21 weather patterns, e.g. the average Pattern 5 day has 10 retrievals marked as dust in far west Texas. Taken collectively, they show dust in the US occurs most frequently over the western Great Plains in the lee of the Rockies, in agreement with previous findings from MODIS (Ginoux et al., 2012). Taken individually, the weather patterns show substantial variety in the spatial distribution and frequency of dust occurrence. Many patterns, such as Patterns 8 and 12, show dust as very rare across the entire region, perhaps not surprising as the central US is not always a dusty region. Some patterns, however, are strongly connected with dust in particular locations. Below, we focus on a selection of regions with strong connections between dust occurrence and weather pattern.

3.1.1 West Texas

Most notable is Pattern 5, which produces an intense bullseye of dust over the city of El Paso and the surrounding area. Pattern 5 represents a cold front over the Texas Panhandle leading a deep upper-level trough over the Rocky Mountains (Evans et al., 2017). This produces strong southwesterly winds over northern Mexico that bring intense dust plumes from the Chihuahuan Desert across West Texas and southern New Mexico. This pattern and resulting dust storm is very similar to the “Albuquerque Low” weather system identified by Novlan et al. (2007) as a key contributor to dustiness in the El Paso region. We also find this pattern to be the primary contributor to dust occurrence in the region. Figure 3 shows the percentage of all dust retrievals that occur during each weather pattern. Indeed, 30-50% of all VIIRS retrievals classified as dust in the El Paso region occur during Pattern 5. Pattern 6 also shows frequent dust over West Texas and the Texas Panhandle. This pattern frequently follows Pattern 5 in time, with the same cold front and upper-level trough as in Pattern 5 having shifted eastward as the synoptic weather event evolves. Winds remain strong over West Texas, producing additional uplift of dust around El Paso, and dust that was previously uplifted during Pattern 5 has been advected to the north and east, across West Texas and into the Panhandle and Oklahoma. This can also be seen in Figure 3 as a major contributor of dust occurrence in the Llano Estacado of eastern New Mexico and the Texas Panhandle, as well as southwestern Oklahoma.

3.1.2 Minnesota and the eastern Dakotas

While not as dusty as southwestern Texas, the northeastern plains have a more varied range of weather patterns that produce dust in the region. Pattern 4 is the most important contributor of dust in the region (Figure 3), showing dust over Minnesota and the eastern Dakotas, as well as smaller amounts of dust in surrounding areas of Iowa, Wisconsin, and Canada. This pattern features strong southerlies in advance of a low (Fig. 1) that has brought warm temperatures to the northern plains (Fig. S1). While the surface winds are stronger in the southern plains than in the north, the southerlies carry with them moisture from the Gulf of Mexico that brings precipitation that suppresses dust emission further south. Minnesota and the Dakotas are north of the advected moisture, where they still experience enhanced surface winds, but not the precipitation associated with it.

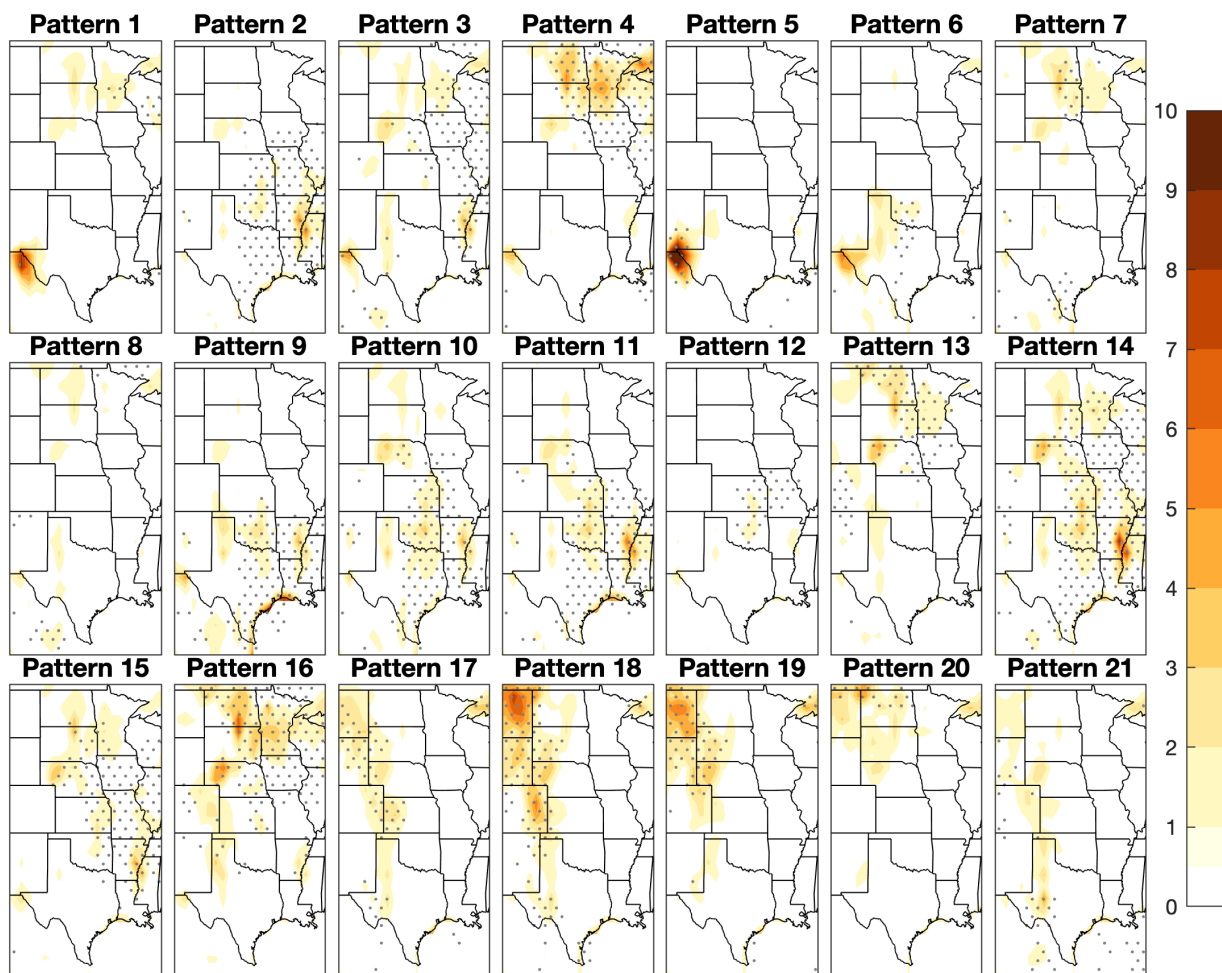


Figure 2. Average number of daily VIIRS retrievals within each $1^{\circ} \times 1^{\circ}$ gridcell identified as dust for each weather pattern. Each panel represents the average of all days identified as each pattern (100 to 322 days, average of 171) from 2012-2021. Stippling indicates regions where the pattern average exceeds the average of the full dataset with 95% confidence, determined by a one-tailed t-test.

Patterns 14-16 each contribute dust to the region with Pattern 16 standing as the second most important contributor. Each of these patterns feature a surface anti-cyclone over the Great Plains at the leading edge of an upper-level ridge. In Patterns 14 and 16, the two anti-cyclonic patterns that produce more dust in the region, the surface high is to the south of the region (southern Missouri and Louisiana/Texas respectively), creating strong southwesterly to westerly winds across the eastern Dakotas and Minnesota. Pattern 15 has the surface high further to the north (centered on Iowa), leading to weaker winds and less dust in the region.

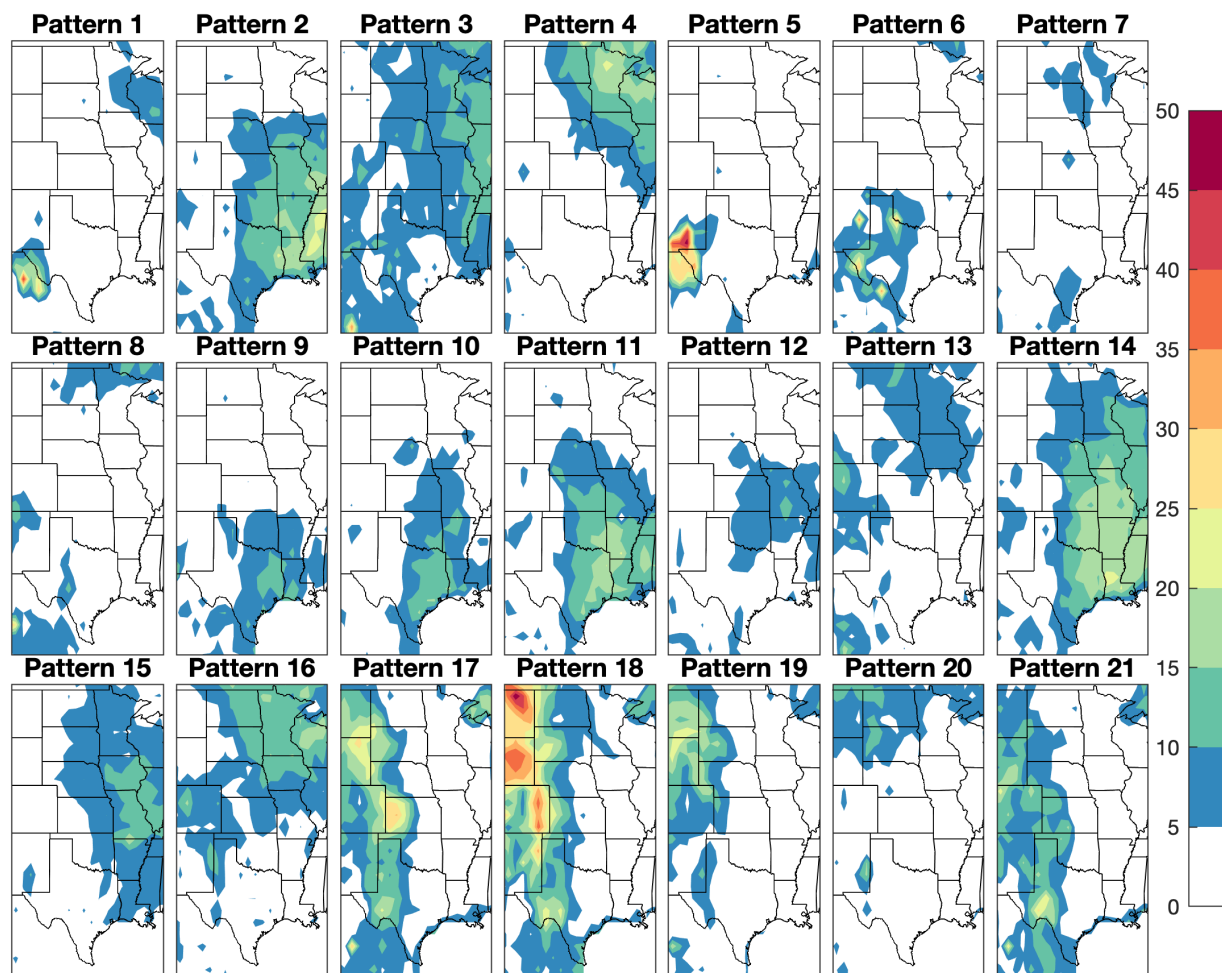


Figure 3. Percentage of each location’s total dust counts that occur during each weather pattern. For a particular location, the sum of the panels is 100%.

3.1.3 The High Plains and Missouri Plateau

The High Plains, in the lee of the Rocky Mountains and at substantial altitude, stretch from the Llano Estacado of the Texas
 160 Panhandle and New Mexico northward through western Kansas and eastern Colorado to the Missouri Plateau region of the
 western Dakotas and eastern Montana and Wyoming. Dust in this region is primarily a summertime phenomenon and uplift
 can be initiated by both the strong southerly winds that predominate the season and gust fronts created by local thunderstorms.
 The E17 classification has five summer weather patterns – Patterns 17-21. All the patterns feature warm surface temperatures,
 weak pressure gradients, southerly low-level flow, and zonal or anti-cyclonic flow at 500 mb. The slight differences in their
 165 meteorology lead to shifts in which parts of the Plains experience precipitation (Figure 1). All five patterns lead to dust oc-

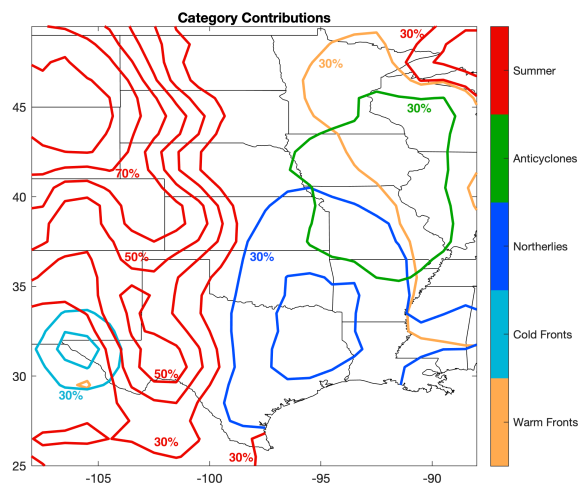


Figure 4. Contributions (% of total dust retrievals in each gridcell) for each of the five categories of weather. The lowest contour for each category is 30% with contour intervals of 10%. For a given location, the sum of all five categories contributions is 100%.

currence in the western plains, but Patterns 18 and 19 have particularly high dust frequencies. These two patterns both feature more anti-cyclonic 500 mb flow, and thus more subsidence and less rain in the High Plains than the other summer patterns. Pattern 19 has a strong low-level jet, but Pattern 18 has a relatively weak one, though both have southerly wind speeds which peak in the northern rather than southern plains, helping to uplift dust in the region.

170 3.2 Primary weather patterns

As Figure 3 shows, one advantage of identifying dust-related weather patterns for different regions is the ability to identify the relative importance of different weather patterns for dust occurrence in a particular region. As described in Section 2, the 21 weather patterns of E17 can be grouped into five categories of weather: southerlies and southerlies (Patterns 1-4), cold fronts (Patterns 5-8), northerlies (Patterns 9-13), anticyclones (Patterns 14-16), and summer (Patterns 17-21). Summing the information in Figure 3 for each of these five categories of weather provides a summary view of the kinds of weather important to dust in the Great Plains. Figure 4 shows the percentage of dust retrievals that occur during each of these five categories.

Figure 4 makes clear the regional variation in dust meteorology across the Great Plains. Each of the five categories of weather dominates within a region. All along the High Plains from West Texas to the Canadian border, summertime meteorology dominates, being responsible for a majority of dust from Colorado northward. Cold fronts dominate the dust weather of the El Paso region and southern New Mexico. Cold northerlies bring dust to the southeastern plains from Kansas and Missouri to the Gulf Coast, and account for a majority of dust retrievals over eastern Texas. High pressure anticyclones and southerlies are the most important patterns for the northeastern plains of Missouri, Iowa, and Minnesota, with the regions of importance being further north for southerlies and further south for anticyclones.

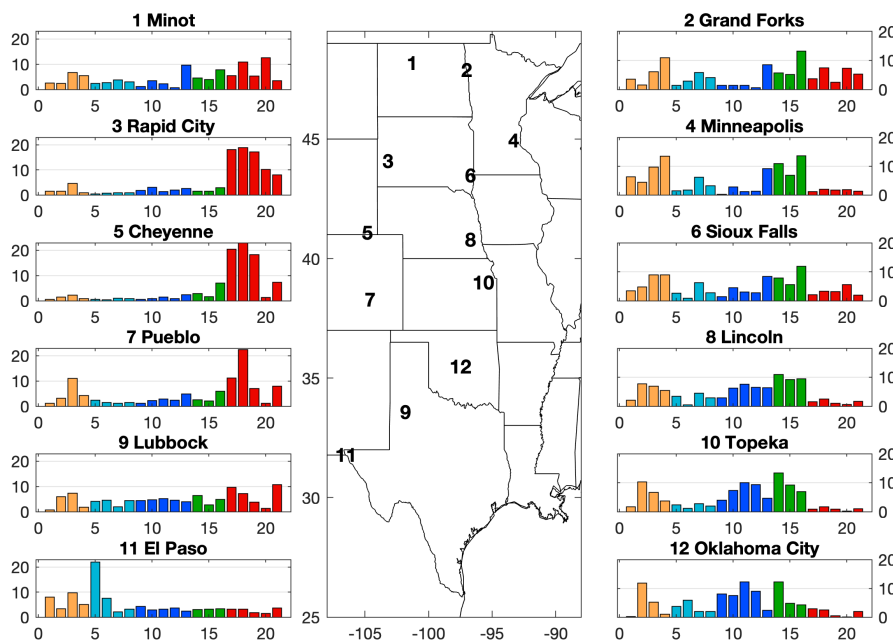


Figure 5. Contributions (% of total dust retrievals in each grid cell) for selected cities within the Great Plains from each of the 21 weather patterns. For given city, the sum of the 21 bars is 100%. Weather patterns are grouped and color-coded according to category of weather, as with Figure 4. City locations are indicated by numbers on the map.

Figure 5 shows the distribution of dust contributions from each weather pattern for a selection of cities around the Great Plains. The figure provides greater detail on the results of Figure 4, e.g. summer patterns (red) being particularly important to High Plains cities like Cheyenne and Rapid City, southerlies (orange) bringing dust to Minneapolis, and northerlies (blue) bringing dust to Oklahoma City. Interestingly, it also shows that dust weather is sensitive to the details of the meteorology, as there is substantial within-category variability. For example, southerlies and warm sectors are all contributors of dust to Minneapolis, but it is Pattern 3 and Pattern 4 that are most important, and four northerly patterns contribute substantial dust to Oklahoma City, but the fifth does not. In some cases, it is clear that shifts in the location or direction of strong winds, e.g. cold front Pattern 5 bringing far more dust to El Paso than cold front Pattern 6, but in others it is less clear. Pattern 8, a cold front over west Texas, has a very similar flow pattern to Pattern 5, but does not produce nearly as much dust. Many such examples exist and further investigation of these details would provide value to local-scale understanding of dust weather.

4 Summary and Discussion

In this study we used a weather pattern classification system for the Great Plains as a basis for compositing Suomi-VIIRS dust observations in order to determine the meteorology most important for dust occurrence across the region. In previously



well-studied regions such as El Paso and the southern high plains of New Mexico and the Texas Panhandle, our findings are in agreement with previous studies, showing that cold fronts extending from low pressure systems leading deep upper-level troughs are the primary source of dust to the region (Novlan et al., 2007; Rivera et al., 2009). In less-studied portions of the Great Plains our findings are novel. We find that southerly winds and warm sectors are the most important source of dust to the northeastern plains of Iowa, Minnesota, and the eastern Dakotas, while summertime convection is the dominant source of dust in the northwestern high plains from western Kansas and Colorado to Montana and the western Dakotas. What little dust occurs in the southeastern plains is primarily due to post-frontal northerlies.

This study focused on the meteorology that drives dust occurrence in the Great Plains, but the surface properties, or erodibility of the land, are also crucial to determining dust emission. The two are connected via precipitation and relative humidity, but as the land acts as an integrator of weather events, the important properties of soil moisture and vegetation cover vary much slower than atmospheric properties (Evans et al., 2016; Arcusa et al., 2020). The result is that the same weather pattern may produce different amounts of dust depending on the condition of the land surface beneath it. Analysis of why a particular weather pattern sometimes produces dust and sometimes does not with regard to observations of soil moisture, vegetation cover, and snow cover would likely help understand both the within-pattern variability of dust and quantify the importance of land surface properties seasonally and spatially across the Great Plains.

Previous studies have identified trends in the occurrence of dust in the western US (Achakulwisut et al., 2017; Aryal and Evans, 2022) on decadal time scales. Potentially, such trends could be explained in terms of trends in the frequency of important dust-producing weather patterns, however, the short time period analyzed here is a limitation. Only Pattern 5, increasing at 1.1 days/year, has a statistically significant trend (95% confidence) over the period 2012-2021. As this pattern is responsible for a large portion of the dust in the El Paso region of Texas, this trend in pattern frequency may explain the observed increase in springtime dust observed by the IMPROVE network site (Hand et al., 2011; Malm et al., 1994) at nearby Guadalupe Mountains National Park (Achakulwisut et al., 2017; Aryal and Evans, 2022). The frequency of occurrence of weather patterns also has substantial year-to-year variability, and with longer records may explain the interannual variability of dust occurrence in the Great Plains.

The limitations associated with satellite-derived dust observations add caveats to this study. Satellites undercount dust occurrence due to time of overpass, obscuration by cloud cover, and lack of detection when mixed with other aerosols, thus this study undercounts dust presence as well. Studies have shown that dust events in the western High Plains generated by convective outflows occur most frequently during the summer season and late in the day (Novlan et al., 2007; Kelley and Ardon-Dryer, 2021). Thus the summer weather patterns (Patterns 17-21) likely undercount dust more than others, and may play a more important role than shown above. Nonetheless, the same studies show that synoptically-driven dust events comprise the majority of dust events, so we believe the broad conclusions of the study remain valid. Further detail into the importance of convective dust events could best be addressed through station data with higher temporal frequency. The weather classification is based on ERA5 reanalysis fields that are available at hourly resolution, so weather pattern can be categorized up to 24 times daily if station data provide dust observations to match.



Many further analyses are possible using this weather classification as a basis for compositing observations. Many local and regional studies of dust meteorology manually classify dusty days into categories such as “synoptic” and “convective”, sometimes sub-dividing those into further categories to account for the variability of observed weather (Brazel and Nickling, 1986; Novlan et al., 2007; Kelley and Ardon-Dryer, 2021; Hahnenberger and Nicoll, 2012). This classification allows expansion
235 on these classifications by providing ready to use, objectively-determined categories with detailed meteorologies applicable across the Great Plains, including in understudied regions such as the northern and eastern Great Plains. This study focused on using the classification to understand the meteorological causes and contributions to dust; it could also be used to study other aerosols, air quality, air chemistry, or any other phenomena related to weather variability in the Great Plains. The particular record analyzed here, satellite-observed dust occurrence, is relatively recent, so only a small portion of the ERA5 record of
240 weather pattern is used. The ERA5 reanalysis product extends back to 1940 however, so additional studies of long records of aerosols or atmospheric composition could take advantage of weather pattern analysis to investigate the causes of trends and variability over many decades. In doing so, the findings made here, including the causes of dust events across the northern Great Plains, can be used to understand the episodic and understudied events of this complex dust source.

Data availability. Time series of weather pattern is archived at <https://ubir.buffalo.edu/xmlui/handle/10477/85986>. ERA5 reanalysis and
245 Suomi-VIIRS satellite data are available for download from ECMWF and NASA, respectively.



Appendix A

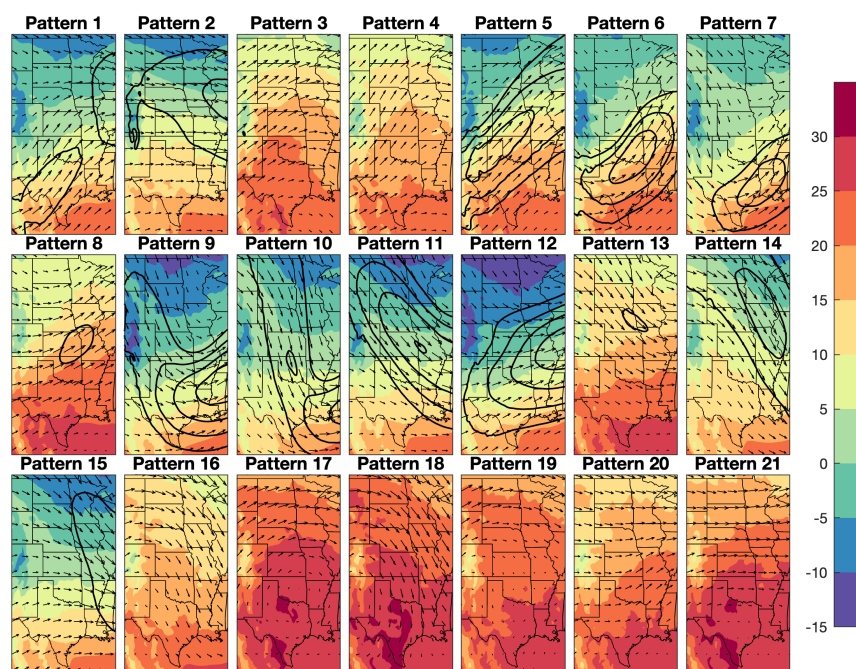


Figure A1. Composite ERA5 properties for each of the 21 weather patterns. Underlying color shows 2m temperature ($^{\circ}\text{C}$) and arrows show 500mb wind speed and direction, with longest arrows representing 35 m/s. Thick black contours show 500mb wind speed in increments of 4 m/s, beginning at 20 m/s, in order to highlight jetstream location.

Author contributions. The author confirms sole responsibility for the following: study conception and design, data collection, analysis and interpretation of results, and manuscript preparation

Competing interests. The author declares that they have no conflict of interest.

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