North African dust transport toward the western Mediterranean basin: Atmospheric controls on dust source activation and transport pathways during June-July 2013

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Abstract. Dust transported from North African source region toward the Mediterranean basin and Europe is an ubiquitous phenomenon in the Mediterranean region. Winds formed by large-scale pressure gradients foster dust entrainment into the atmosphere over North African dust source regions and advection of dust downwind. The constellation of centers of high and low pressure determines wind speed and direction, and thus the chance for dust emission over Northern Africa and transport toward the Mediterranean.

Here, we present characteristics of the atmospheric dust life-cycle determining dust transport toward the Mediterranean basin. Using the atmosphere-dust model COSMO-MUSCAT (COSMO: COnsortium for Small-scale MOdelling; MUSCAT: MUl-tiScale Chemistry Aerosol Transport Model), a complementary analysis of dust source activation, emission fluxes, transport pathways, and deposition rates is provided with focus on the ChArMEx (Chemistry-Aerosol Mediterranean Experiment) special observation period in June and July 2013. Modes of atmospheric circulation, identified from empirical orthogonal function (EOF) analysis of the geopotential height at 850 hPa are used for investigating the characteristics of the atmospheric dust life-cycle regarding the atmospheric circulation over the Mediterranean. Two different phases are identified from the first EOF, which in total are explaining 45% of the variance. They are characterized by the propagation of the subtropical ridge into the Mediterranean basin, the position of the Saharan heat low and the predominance Iberian heat low and discussed illustrating a dipole pattern for enhanced (reduced) dust emission fluxes, stronger (weaker) meridional dust transport, and consequent increased (decreased) atmospheric dust concentrations and deposition fluxes. In case of a predominant high pressure zone over the western and central Mediterranean (positive phase), a hot spot in dust emission flux is evident over the Grand Erg Occidental and reduced level of atmospheric dust loading occurs over the western Mediterranean basin. The meridional transport in northward direction is reduced due to prevailing northerly winds. In case of a predominant heat low trough linking the Iberian and the Sahara heat low (negative phase), meridional dust transport toward the western Mediterranean is increased due to prevailing southerly winds resulting into an enhanced atmospheric dust loading over the western Mediterranean.

Altogether, results from this study illustrate the relevance of knowing dust source location in concert with atmospheric circulation. The study elaborates the question on the variability of dust transport toward the Mediterranean and Europe in dependence on the atmospheric circulation as a driver for dust emission and a determinant for dust transport routes, exemplarily for the
two-month period June to July 2013. Ultimately, outcomes from this study contribute to the understanding of the variance in dust transport into a populated region.

1 Introduction

Primary aerosols such as mineral dust can be considered to be intrinsically present in the Earth climate system (Carslaw et al., 2010). Today, mineral dust aerosol pays the largest contribution to the atmospheric aerosol burden and is of importance for the climate (Shao et al., 2011). Mineral dust not only impacts on the Earth radiation budget ultimately altering atmospheric dynamics and temperature distribution, it further provides micro-nutrients that contribute to the bio-productivity of land (Okin et al., 2008), marine (Jickells et al., 2005), and lacustrine ecosystems (Psenner, 1999). Besides its role as fertilizer, dust also carries micro-organisms that are delivered to remote ecosystems and may depict a loss of soil micro-organisms in source regions (Acosta-Martínez et al., 2015). Mineral dust deposited on snow and ice surfaces also changes the snow albedo and thus alters the melting characteristics of snowpack and glaciers (Painter et al., 2007).

Dust aerosols not only impact on Earth climate, they also affect modern human life: Exposure to dust aerosol enhances the prevalence of respiratory diseases such as asthma, which results into an increased lost of working hours due to illness and hospitalization rates (Morman and Plumlee, 2013). An increased level of dust concentrations leads to reduced air quality, which is sensed as a reduction in quality of life. With dust events associated low horizontal visibilities affect transportation routes and thus the logistics of goods and humans (e.g., Pauley et al., 1995; Lorenz and Myers, 2005).

The AeroCom model intercomparison study estimated the annual dust emission from North African dust sources to a median flux of 800 Tg year$^{-1}$ for all participating atmosphere-dust models (possible range suggested: 400 Tg year$^{-1}$ to 2,200 Tg year$^{-1}$) (Huneeus et al., 2011). The export of North African dust can be summarized to four main transport pathways (e.g., Shao et al., 2011): About 60% of the emitted dust is blown towards the Sahel and Gulf of Guinea, 25% is transported in westward direction towards the Atlantic, 10% is following a northward transport route towards the Mediterranean and Europe, 5% are reaching the Middle East. Assuming a dust emission flux of 1,000 Tg year$^{-1}$, about 100 Tg year$^{-1}$ are exported toward the western and central Mediterranean basin, about 50 Tg year$^{-1}$ will reach the eastern Mediterranean Sea and the Middle East.

Due to the geographical situation of the Mediterranean Sea - it is almost completely enclosed by land - primary aerosols such as mineral dust, sea salt and combustion aerosol from biomass burning as well as industrial produced aerosols are ubiquitous constituents of the atmospheric composition over the Mediterranean region. The distribution of the concentrations of these constituents varies with time and space, which is determined by the combination of source characteristics and wind transport capacity (e.g., Pey et al., 2013; Salvador et al., 2014; Schepanski et al., 2012, 2013, 2015). The composition of the atmospheric aerosol burden, but also its spatio-temporal variability, has been in the focus of recent research: Several large cities are located within the Mediterranean region, which on the one hand are negatively affected by the atmospheric dust aerosol burden, on the other hand significantly contribute to the total aerosol burden. Whereas human-induced aerosol emission can be controlled and reduced by legislative regulations, the fraction of naturally emitted aerosol, in particular mineral dust from desert sources in North Africa, is controlled by weather and is subject to changing climate conditions. Hence, besides the socio-economic
interest in estimating costs related to air quality reduction and consequent vulnerable health affects, scientific questions from the Earth system community emerge.

The collaborative research program "Chemistry-Aerosol Mediterranean Experiment" (ChArMEx, http://charmex.lsce.ipsl.fr) aims for assessing the composition of the atmospheric over the Mediterranean basin and its impact on the environment today and in future. The Aerosol Direct Radiative Impact on the regional climate in the MEDiterranean region (ADRIMED) project is part of the ChArMEx consortium. Focus of the ChArMEx/ADRIMED project is on measuring (e.g., Chazette et al., 2016; Granados-Muñoz et al., 2016; Denjean et al., 2016) and modeling (e.g., Nabat et al., 2015; Rea et al., 2015) the aerosol-radiation effect. An intensive measurement campaign (SOP, special observation period) involving airborne and ground-based measurement sites over the western Mediterranean and surroundings took place from 11 June to 5 July 2013. Details on measurement systems, observation and modeling efforts are summarized in Mallet et al. (2016). The present study investigates the transport of dust from North African dust sources towards the western Mediterranean basin, where the measurements took place, exemplarily for June and July 2013. In particular the aerosol distribution over western Mediterranean basin is found to be strongly influenced by mineral dust intrusions during these months (Rea et al., 2015). Based on various satellite and model AOD data sets, the studies by Moulin et al. (1998) and Nabat et al. (2013) illustrates increased levels of AOD during June and July. As focusing on the dust transport patterns, the spatio-temporal distribution of dust source activity and emission fluxes are considered as are deposition fluxes. Eventually, the atmospheric dust life-cycle as its whole is discussed.

The manuscript is structured as following: Beginning with a description on the data sets and methods used in this study in section 2, section 3 provides a thematic introduction on dust transport towards the Mediterranean basin. Dust sources and emission fluxes are presented in section 4, section 5 discusses the dust transport pathways toward the Mediterranean basin and related deposition rates during the two months of June and July 2013 that encompass the ChArMEx SOP. Outcomes from this model-based study are discussed in section 6 and summarized in section 7.

2 Data sets and method

2.1 Atmosphere-dust model system COSMO-MUSCAT

Numerical simulations of the atmospheric dust life-cycle comprising dust emission fluxes, dust transport, and dust removal from the atmosphere via dry and wet deposition are performed using the regional non-hydrostatic atmosphere model COSMO (COnsortium for Small-scale Modelling) (Schättler et al., 2014), which is on-line coupled to the 3D chemistry tracer transport model MUSCAT (MUltiScale Chemistry Aerosol Transport Model) (Wolke et al., 2012). The dust module implemented in MUSCAT includes a dust emission scheme based on Tegen et al. (2002), a deposition scheme for dry deposition following Zhang et al. (2001) and for wet deposition following Berge (1997) and Jakobson et al. (1997). The characteristics of the atmospheric dust cycle, which are in particular determined by the spatio-temporal variability of dust source activation, dust emission fluxes, vertical dust mixing, dust transport within the atmosphere and dust removal are simulated by MUSCAT. Meteorological and hydrological fields used by MUSCAT are calculated by COSMO and updated in MUSCAT at every advection time step.

Dust emission is commonly considered as a threshold problem: Dust emission occurs where the wind friction velocity has
exceeded a certain local threshold. The local threshold is determined by soil surface characteristics including soil texture, soil size distribution, soil moisture, vegetation cover and aerodynamic roughness length. Dust particles are mobilized by the momentum transferred from the atmosphere onto the soil grain, in particular the wind acting on the particle. This is described by the wind shear stress at the ground, whereas the wind shear stress, noted as $\tau$, depends on the wind friction velocity $u_*$ and the density of air, $\rho_a$:

$$\tau = \rho_a \cdot u_*^2$$  \hspace{1cm} (1)

A local threshold for the wind friction velocity, which needs to be exceeded for dust emission, can be determined considering local surface characteristics and taking into account that the presence of surface roughness elements (e.g., pebbles, rocks, vegetation) affect the momentum required for dust particle mobilization. In the MUSCAT model environment, $u_*$ is calculated on-line from the COSMO-MUSCAT winds with considering aerodynamic roughness lengths $z_0$ provided by Prigent et al. (2012). For areas where the leaf area index (LAI, estimated following Knorr and Heimann (1995)) is less than 0.1 and the standard deviation of the sub-grid scale orography (GLOBE Task Team et al., 1999) is larger than 50 m, $z_0$ is set to a constantly low roughness length of $z_0 = 0.001$ cm (Marticorena et al., 1995). This is to compensate for biases in satellite-retrieved $z_0$ toward higher values in vegetated areas and mountain regions, and to allow for dust emission in mountain foothills and the Sahel. To describe the soil characteristics that also impact on $u_*$, data sets describing the soil size distribution, soil texture and vegetation cover are additionally used. Following Tegen et al. (2002), we distinguish between four different soil size distributions: clay, silt, medium/fine sand, coarse sand. To bring soil characteristics, wind friction velocity, which can be seen as a measure for the momentum transferred to the soil surface, and dust emission flux in relation, a measure for the emission efficiency is introduced. Generally, one can distinguish between two types of dust particle mobilization: Direct entrainment via dry convection and saltation. Here, saltation is considered as the dominant dust uplift mechanism. Based on wind tunnel experiments by Gillette (1978), saltation efficiencies ($\alpha$) describe the ability of the soil surface to provide saltators. Potential dust source regions are limited to areas, which are identified as active dust sources from MSG SEVIRI IR dust index imagery (Schepanski et al., 2007, 2009a, b, 2015). Here, the saltation efficiency is set to $10^{-5} cm^{-1}$.

The effect of vegetation on dust emission is twofold: First, vegetation covers the baren soil and thus inhibits aeolian soil erosion. Second, vegetation elements decelerate the wind and thus reduce the amount of momentum that can act on the soil particles for mobilization. Thereby, vegetation type and coverage matter; for example shrub-like vegetation results into a stronger deceleration of the winds than grass does. Thus, not only the vegetation cover, but also the vegetation type is considered when calculating dust emission fluxes. In MUSCAT, 27 vegetation types (biomes) are considered. For the actual vegetation cover, monthly vegetation cover data from the GIMMS (Global Inventory Modeling and Mapping Studies) NDVI (Normalized Difference Vegetation Index) data set (Pinzon et al., 2005; Tucker et al., 2005) are used assuming an empirical relationship between vegetation cover and dust emission following Knorr and Heimann (1995). As a high soil moisture content reduces the susceptibility of a soil for wind erosion, dust mobilization is inhibited for soil moisture content $> 99\%$. This becomes in particular important in regions where dust emission is associated with synoptic situations accompanied by rain fall such as cyclogenesis.
and Mesoscale Convective Systems (Fiedler et al., 2014).

**Horizontal dust emission flux:**

\[
F_h = \frac{\rho_a g u^3}{u^*} \left(1 + \frac{u_{*,t}(D_p)}{u_*} \right) \left(1 - \frac{u^2_{*,t}(D_p)}{u^2_*} \right)
\]  

(2)

**Vertical dust emission flux:**

\[
F_v = \alpha F_h
\]

(3)

Once the horizontal dust emission flux (saltation flux) is calculated following Eq. 2 considering the above mentioned measures, the horizontal flux is transformed into the vertical dust flux (Eq. 3). The horizontal dust emission flux is a function of the threshold of the wind friction velocity \(u_{*,t}\) that depends on the erodible soil particle diameter \(D_p\) and the local roughness length \(z_0\), which is set to \(z_0 = 0.001\) cm for areas considered as barren and desert valleys (see above). With regard to the local surface properties and wind conditions, emitted particles are then distributed over five independent size bins with radii limiting at 0.1 \(\mu\)m, 0.3 \(\mu\)m, 0.9 \(\mu\)m, 2.6 \(\mu\)m, 8.0 \(\mu\)m and 24.0 \(\mu\)m. The five dust bins are transported as passive tracers with the time-dependent dust concentration being related to the vertical diffusion coefficient and the time-dependent emission and deposition fluxes.

Dust aerosol optical depth (AOD) at 550 nm is calculated from the dust concentration by assuming spherical particles with the density of quartz, \(\rho_p = 2.65 \text{ g cm}^{-3}\):

\[
AOD = \sum_j \sum_k \left(\frac{3}{4} \frac{Q_{\text{ext},550}(j)}{r_{\text{eff}}(j) \rho_p(j)} c_{\text{dust}}(j,k) \Delta z(k) \right),
\]

(4)

with dust bin \(j\), vertical level \(k\), extinction efficiency at 500 nm \(Q_{\text{ext},550}\) = (1.677, 3.179, 2.356, 2.144, 2.071), dust particle effective radius \(r_{\text{eff}}(j)\), dust concentration \(c_{\text{dust}}(j,k)\), and the vertical increment of each level \(\Delta z(k)\). The extinction coefficient is derived from Mie-theory (Mishchenko et al., 2002) using refractive indices from Sinyuk et al. (2003) for each size bin \(j\) (radii: 0.1-0.3 \(\mu\)m, 0.3-0.9 \(\mu\)m, 0.9-2.6 \(\mu\)m, 2.6-8.0 \(\mu\)m, 8.0-24.0 \(\mu\)m). Although dust particles have an irregular shape, spherical dust particles were assumed here for the application of the Mie-theory. This simplification here only affects the calculation of the extinction efficiency, which is not very sensitive to particle shape at 550 nm.

The present study investigates dust transport towards the Mediterranean basin and Europe during summer 2013 (June-July), when atmospheric dust concentrations over the Mediterranean basin are increased (e.g., Moulin et al., 1998; Nabat et al., 2013). Transport and deposition fluxes are investigated in the context of atmospheric circulation regimes that first foster dust source activation and subsequent dust entrainment into the atmosphere, and second predominant dust transport pathways and consequently dust concentration patterns. Ultimately, this characterizes the Mediterranean (northward) branch of the atmospheric North African dust life-cycle and discusses implications on a geographic region that is in parts densely populated. The regional atmosphere-aerosol model system COSMO-MUSCAT has proven as valuable for research on the atmospheric dust life-cycle.
and atmospheric processes involved (Schepanski et al., 2009b; Tegen et al., 2013; Wagner et al., 2016). It has contributed to well-known projects such as SAMUM (Heinold et al., 2009, 2011), SOPRAN (Schepanski et al., 2009a), DNICast (Schepanski et al., 2015), and ChArMEx (Mallet et al., 2016; Granados-Muñoz et al., 2016). To capture all crucial processes determining the extent of the Mediterranean branch of the North African atmospheric dust life-cycle, the model domain has been chosen to be limited by a box spanned between the following geographical coordinates (corners): 20°W 0°N and 35°E 60°N. Simulations are performed for the two-month period June-July 2013 with horizontal grid spacing of 0.25° and 40 vertical terrain-following levels (σ-p level) with the lowest level centered at around 10 m above ground level. The actual date for which the simulations were started was 15 May 2013 to ensure the correct background dust concentration over the entire model domain.

2.2 AERONET aerosol optical depth

Sun-photometer measurements provide total-column information on the atmospheric content of aerosols due to their scattering characteristics at specific wavelengths to which the instrument is sensitive. To assure measurements following similar protocols allowing for comparable data, measurement sites are organized in networks such as the worldwide AERosol RObotic NETwork (AERONET) (Holben et al., 1998).

Besides information on the total atmospheric aerosol load, different types of aerosols can be distinguished due to their size and optical properties. This way, information on whether an aerosol plume dominantly consists of coarse mode aerosols such as mineral dust or of fine mode aerosols such as industrial aerosols. Focussing on mineral dust aerosol, AERONET level 2.0 coarse-mode AOD estimates (O’Neill et al., 2003) for stations located in the Mediterranean basin region are selected and used for validating the COSMO-MUSCAT dust AOD with regard to atmospheric dust loading and temporal evolution. Only stations with a sufficient number of observations during the two-month period June to July 2013 are included. An overview on stations considered within this study is given on Fig. 1 and includes the following stations: Gozo, Malta (36.03° N; 14.26° E), Murcia, Spain (38.00° N; -1.17° E), Oujda, Morocco (34.65° N; -1.90° E), Palma de Mallorca, Spain (39.55° N; 2.63° E), Tizi Ouzou, Algeria (36.70° N; 4.06° E).

2.3 EOF analysis

The Empirical Orthogonal Function (EOF) analysis is a method, which is used to identify patterns of simultaneous variation (von Storch and Zwiers, 2002). The method is often applied to analyze the spatial and temporal variability of data sets covering a large region and long time period. Thereby, the data set’s temporal variance is split into orthogonal spatial patterns, the empirical eigenvectors. Arranged in a decreasing order following the percentage of variance explained, each successive eigenvector explains the maximum amount possible of the remaining variance in the data. Each EOF pattern is associated with a time series of coefficients, which describe the temporal evolution of the corresponding spatial mode (Peixoto and Oort, 1992). In the field of atmospheric and climate research, a typical application for EOF analysis is the identification of coherent changes in atmospheric parameters and connected centers of action. One prominent example are indices expressing teleconnecting pressure pattern such as the North Atlantic Oscillation (NAO) with the Icelandic low and Azores high as centers of action.

Here, the EOF analysis and corresponding Principal Component (PC) analysis, whereas the EOF can be seen as geographically
weighted PC, are applied to COSMO-MUSCAT geopotential fields to identify patterns of coherent variation in atmospheric conditions that can be linked to dust transport. Dust transport is wind-driven and finally determined by large-scale pressure gradients. Thus, EOF analysis of fields of geopotential height are considered as a measure indicating dust transport direction, which eventually determines atmospheric dust concentration at remote places from the desert.

3 Dust transport toward the Mediterranean basin and southern Europe

Dust transport from North Africa toward the Mediterranean is controlled by (a) the distribution of dust sources, their activation and the subsequent entrainment of dust into the atmosphere, (b) the transport capacity of local and regional wind regimes, and (c) the atmospheric conditions such as stability, turbulence, clouds and precipitation determining buoyancy and deposition characteristics of the airborne dust particles. Long-range dust transport such as from North African source regions toward the Mediterranean basin and Europe is significantly controlled by the atmospheric flow, which is determined by pressure gradients built up between regions of low pressure and regions of high pressure, referred to as 'low' and 'high'. In particular in winter to early summer and autumn, low pressure systems are associated with mid-latitudinal troughs migrating from west to east and affecting both the Mediterranean Sea and Northern Africa (Dayan et al., 1991; Moulin et al., 1997, 1998). The so called Mediterranean cyclones favor dust uplift from northern dust source regions and ultimately due to the southerly wind direction dust export toward the Mediterranean basin (Schepanski et al., 2009b, 2011; Fiedler et al., 2014; Flaounas et al., 2015). In particular during late winter to early summer, when the sea surface temperature of the Mediterranean Sea is still cooler, the baroclinic gradient may enhance the strength of the cyclogenesis (Alpert et al., 1990). Occasionally, lee-cyclones develop in the vicinity of the Atlas mountains, often triggered by an approaching upper-level mid-latitudinal trough and enhanced by the baroclinic gradient (Schepanski et al., 2009b; Bou Karam, 2010; Schepanski et al., 2011).

In summer, two heat lows form that determine the atmospheric circulation over the North African - Mediterranean region: the Saharan Heat Low (SHL) over the western Sahara situated between the Hoggar and the Atlas mountains (Lavaysse et al., 2009), and the Iberian Heat Low (IHL) developing over the Iberian Peninsula. The extent and location of the SHL is characterized by a pulsation and an east-west migration of the centre. These SHL modes are described as east and west phase (Chauvin et al., 2011), which are linked to changes in temperature distribution and atmospheric circulation, in particular to the position and extent of the Azores high, e.g. its extension toward Europe and the Mediterranean basin. The depth of the IHL, but also possible formation of cut-off lows, impacts on the pressure gradient across the Mediterranean basin thus fostering northward dust export.

Regions of high pressure are associated with the subtropical high-pressure belt of which the Azores high is considered part. In particular during summer, eastward extensions of the Azores high enter the Mediterranean basin and propagate toward the east. Associated with increasing pressure over the Mediterranean basin, the Harmattan winds over North Africa, strengthen and cooler air ventilates the North African continent (so called cold air surges, Vizy and Cook (2009)) affecting dust emission (Wagner et al., 2016; Schepanski et al., 2011).
Climatological studies analyzing the occurrence of dust events over the western, central and eastern Mediterranean highlight spatial differences in seasons when dust events occur frequently (e.g., Moulin et al., 1998; Varga et al., 2014): Over the western Mediterranean, dust events are of sporadic nature in spring and of dominant nature in summer. Dust transport into this region is predominantly controlled by the migration of the subtropical high-pressure belt. The central Mediterranean dustiness is characterized by a frequent dust presence in summer and with less activity in spring. Whereas for summer, like for the western Mediterranean, the dustiness is predominantly linked to the position and evolution of the high pressure zone located over the Mediterranean basin, the springtime dustiness is associated with Mediterranean cyclones. Eastern Mediterranean dust events predominantly occur during spring and early summer when associated with Mediterranean cyclones (Sharav cyclone), but can also be present during summer. Besides the occurrence of dust plumes originating from North Africa, also the stationarity and thus the temporal duration of dust events change spatially as discussed in Schepanski et al. (2015).

EOF analyses have been introduced in the past as a method to identify patterns of simultaneous variations such as of the geopotential in atmospheric-motivated questions (Salvador et al., 2014). Here, we use EOF analyses of the 850 hPa geopotential to identify pressure patterns that are linked to both wind fields affecting dust emission and wind fields determining dust transport pathways (cf. Section 5). The EOF analysis of 700 hPa shows similar patterns and modes (not shown), however, the correlation of the wind field at 850 hPa with near-surface winds determining dust emission is significantly stronger. This way, we aim for a systematic interpretation of dust transport that occurred during the ChArMEx/ADRIMED field campaign in June and July 2013 (Mallet et al., 2016), exemplarily for summer dust transport toward the Mediterranean basin (Nabat et al., 2013; Rea et al., 2015). As shown in Fig. 3, the first three EOFs represent the three predominant circulation patterns explaining in total about 75% of the variance in geopotential at 850 hPa. The first EOF is associated with the subtropical high, the so called Azores high, which extends as a ridge into the Mediterranean basin (Fig. 3a). Overall, the first EOF explains around 45% of the variability. The second EOF (Fig. 3b) is associated with a high pressure zone over the central Mediterranean and southeastern Europe, forming a surge stretching into the North African continent over Libya. Low pressure is present over the Atlantic associated with a mid-latitude upper-level trough. This atmospheric circulation pattern is associated with 21% of the variability in geopotential. The third EOF (Fig. 3c) expresses an inverse distribution of the geopotential: High pressure is present over the Iberian Peninsula, lower pressure is evident over the eastern Mediterranean. This pattern is still associated with about 10% of the variability. In the following we will link patterns of dust emission, atmospheric dust concentration and dust mass fluxes to the variability identified by the first EOF as predominant signature of the variance of the 850 hPa geopotential over the Mediterranean region. The principal component (PC) summarizes the spatio-temporal variance into a time series, which is shown in Fig. 3d for the first EOF. The PC identifies clearly phases of increased and phases of decreased geopotential heights. The transition from one phase to the other is quite short and usually takes up to a couple of days only. Whereas the negative phase in this case is not intermitted, the positive phase consists of three intermitted phases, whereas the intermittence only takes a couple of days.

Composite plots of the 850 hPa geopotential, which show the average distribution of the geopotential for days corresponding to a positive or negative phase, illustrate the associated atmospheric circulation (Fig. 4). The positive phase is characterized
by a zone of high geopotential heights corresponding to a ridge extending into the Mediterranean Sea (Fig. 4a). Generally low gradients prevail over the central Mediterranean and a surge reaches way into North Africa covering Libya. The gradient in geopotential height at 850 hPa between the zone of high pressure over the Mediterranean and the SHL increases. The negative phase corresponds with generally weak pressure gradients over the Mediterranean and a weak high located over the central Mediterranean (Fig. 4b). The Iberian heat low is evident and the SHL is in its western phase. Together, both heat lows form a zone of low pressure extending from the western part of the Grand Erg Occidental to the Bay of Biscay. Strong gradients occur predominantly along the West African coast line on the western side of the SHL.

4 Dust source and dust emission

Dust source activation and consequent dust entrainment into the atmosphere is an interaction of soil characteristics, in particular the supply of sediment prone to wind erosion, and wind speed, which provides momentum that is necessary to mobilize dust particles and eventually entrain them into the atmosphere. Thus, sediment supply and wind speed distribution in concert determine the spatio-temporal distribution of dust source activation. Fig. 5 shows the distribution of active dust sources during the ChArMEx SOP in June and July 2013. As dust transport toward the Mediterranean basin is in focus, dust emission over the southern Sahara, the Soudan and the Sahel is not of relevance here. Dust emitted from sources located in these regions is predominantly transported toward the Atlantic and Gulf of Guinea (Schepanski et al., 2009a). Dust emitted from sources located in the vicinity of the Atlas Mountains, the Grand Erg Occidental stretching between the Atlas and the Hoggar, as well as sources in Libya are contributing to the dust burden that is transported toward the Mediterranean Sea.

The activation and actual dust emission flux is, as pointed out above, a function of the local wind speed. Hence the pattern of active dust sources is changing with the horizontal distribution of wind speed. Consequently, dust emission is linked to the spatial distribution of pressure systems and the horizontal pressure gradient among them. The above presented EOF analysis, in particular the PC, allows for identifying different regimes of atmospheric circulations, here expressed by the pattern of the geopotential height at 850 hPa. As done for the geopotential, composites of the dust emission fluxes separately considering the positive respectively the negative phase of the PC allow for connecting the variance in pressure with the variance in dust emission flux (Figs. 5a, b). Simply, this shows which dust sources are predominantly active during specific atmospheric circulation patterns. This does not mean that individual dust source regions are completely inactive and non-emitting. It rather means that the emission fluxes are reduced compared to the expected averaged level of emission. In particular, during the positive phase, dust sources located in the eastern part of the Grand Erg Occidental show increased dust emission fluxes (Figs. 5a, c). This matches well with the enhanced pressure gradient pointed out in Fig. 4a. Dust sources embedded in the Atlas Mountains or the Libyan desert southeast of the Gulf of Sidra are less active and thus characterized by lower dust emission fluxes. In contrast to that, the negative phase representing an enlarged zone of low pressure between the Gulf of Biscay and the western Sahara is linked with an enhanced level of dust emission along the Atlantic coast. This coincides spatially with an enhanced pressure gradient at the western side of the SHL. These sources are not relevant for the direct dust export toward the Mediterranean Sea, though. Dust sources located in the Grand Erg Occidental are less active during the negative phase,
however, some source regions embedded in the Atlas show an enhanced level of activity and thus an increased dust emission flux.

5 Dust transport

Transport of dust from North African dust sources toward remote regions is characterized by its temporal evolution, horizontal extent, height in vertical column and concentration. Coupled atmosphere-dust aerosol model systems, such as the here used COSMO-MUSCAT, provide 4D information on the atmospheric dust distribution and thus on temporal and spatial metrics.

5.1 Temporal evolution of the atmospheric dust burden

The temporal evolution of dust concentrations at individual locations reflects the transport pathways of emitted dust. As dust emission is an intermittent and not a continuous process, individual plumes of enhanced dust concentration form. Embedded in the atmospheric flow, these plumes are transported away from the source region. Depending on the buoyancy of dust particles in the air, which ultimately determines dust sedimentation rates, and wash-out processes such as in-cloud and sub-cloud scavenging, dust can be transported over large distance and remain within the atmosphere for some days, up to 10 days for dust over North Africa and the Mediterranean basin (Mahowald et al., 2014).

With focus on the dust transport toward the western Mediterranean basin, the temporal evolution of the dust AOD is examined at five AERONET stations and compared with AOD time series calculated from COSMO-MUSCAT simulations (Fig. 2). The stations are selected with regard to the predominant transport route and the availability of level 2.0 coarse mode AOD estimates. First of all, the simulated dust AOD matches well with the sun-photometer based AOD estimates. Both temporal evolution and level of AOD compare well. It has to be noted that cloud-contaminated AOD data are excluded in the AERONET sun-photometer data set but shown in the COSMO-MUSCAT model data set.

Generally, the AOD time series describe two different characteristics of dust episodes: Oujda, Morocco and Tizi Ouzou, Algeria (Figs. 2c and d) are characterized by more intense (AOD up to 1 at Oujda and up to 0.7 at Tizi Ouzou) and somewhat longer lasting dust episodes, whereas two events may merge into one longer lasting event with little decrease in dustiness in between. Stations like Gozo, Malta (Fig. 2a), Murcia, Spain (Fig. 2b), and Palma de Mallorca, Spain (Fig. 2d) are characterized by more pronounced and clearly separated dust events. At these stations, the AOD level is generally lower; reason for this is predominantly the distance to the source region.

Dust is transported within the prevailing wind and thus the transport direction depends on the wind direction. Hence, there is a spatial variability in the presence of dust, which is reflected by the temporal evolution of dust episodes at the considered sites as well. Dust being transported along a northward route is passing over Murcia briefly after passing over Oujda, whereas the AOD at Gozo, which is located well further to the east, remains at a low level. Palma de Mallorca may observe increased level of dust AOD in case the plume is stretching further to the east passing well over the western Mediterranean Sea as typical for negative phases.
5.2 Spatial distribution of dust

As illustrated by the time series of dust AOD at selected sites along predominant transport pathways, the area covered by dust plumes propagating into the Mediterranean basin is affected by the wind direction and thus by the pressure patterns steering the atmospheric circulation. The spatial distribution of active dust sources, the emission flux, and the wind as transport medium in concert determine the atmospheric dust distribution, in particular over remote regions such as the Mediterranean basin. As introduced earlier, composite plots again are used to summarize dust AOD fields for days characterized by similar pressure patterns as identified by the EOF analysis (Fig. 6). On days clustered as positive phase, dust AOD is enhanced over the Sahara and the Gulf of Sidra and up north to the Ionian Sea. This pattern matches with the pressure distribution (cf. Fig. 4a) suggesting increased winds over the western Grand Erg Occidental (as also shown on Fig. 5a) and dust transport toward the Gulf of Sidra with an eastward migrating ridge. This transport characteristic can be identified from comparing the temporal evolution of dust AOD at Gozo (Fig. 2a) and the first PC (Fig. 3d). During the as negative phase classified days, the dust source activity is generally lower in the region of the Grand Erg Occidental and thus atmospheric dust burden is lower. As dust source activity is increased over the region located southeast of the Gulf of Sidra (Fig. 5d), the level of dust AOD is enhanced there. Associated with occasional emission from dust sources embedded in the Atlas Mountains, increased dust AODs are evident over the western Mediterranean.

5.3 Meridional dust fluxes

Motivated by the spatially incoherent variability in dust AOD and the distinct patterns of enhanced dust source activity (positive phase = dust sources predominantly over the Grand Erg Occidental; negative phase = dust source activity predominantly southeasterly of the Gulf of Sidra), meridional dust fluxes are calculated. In complement to the horizontal dust distribution, discussed by means of maps of dust AODs, meridional dust fluxes (dust transport in north-south direction) are calculated as totals over the atmospheric column as well as per level. At a given model vertical level, the dust transport flux $F_{\text{dust}}$ [kg m$^{-2}$ day$^{-1}$] is calculated for 37° N following equation 5:

$$F_{\text{dust}} = M_{\text{dust}} \cdot v$$  (5)

with $M_{\text{dust}}$ being the dust concentration [kg m$^{-3}$] and $v$ being the meridional wind component [m s$^{-1}$] at the considered vertical level and time. In the following, fluxes are averaged over the period considered. The vertical distribution of the meridional dust flux as shown in Fig. 7 generally shows a dipole pattern that is characteristic for the June to July 2013 period and thus evident for both EOF phases. Dust transport prevail predominantly in northern direction over the western Mediterranean between 5° W and 10° E and takes place at heights between 850 and 450 hPa (approx. 1.5 to 7 km above ground level). Northward dust transport is related to the southerly winds associated with the air flow at the western side of the high pressure ridge (anticyclone), respectively the flow at the eastern side of the trough (cyclone). Dust transport over the central Mediterranean (10° E to 20° E) is overall predominantly in southward direction and is evident at heights similar to those of northward transport (Fig. 8). This re-circulation of Saharan dust from the Mediterranean Sea, which is a net gain in dust for the African continent, is
associated with the northerly winds occurring at the eastern side of the high pressure system and linked associated circulation. Considering the meridional dust flux separately for positive and negative phases, meridional dust transport during the positive phase is significantly lower than during the negative phase. In both phases, the northward dust flux is significantly stronger than the southward dust transport. Due to the location of the high pressure zone over the western Mediterranean (Fig. 4a) and associated anticyclonic air flow, northerly winds prevail during the positive phase, which limit the dust transport toward the Mediterranean and keep the level of dustiness low over the western Mediterranean (cf. Figs. 5a and 6a). During the negative phase, the SHL is in its western phase and the high pressure zone is located over the central Mediterranean basin (Fig. 4b). With the more eastward position of the ridge and thus center of anticyclonic flow, southerly winds advect Saharan air toward the western Mediterranean Sea along the anticyclone’s western side. Consequently, the atmospheric dust burden increases over the western basin and decreases over the central and eastern basin compared to the June-July mean (Figs. 6b, d).

5.4 Dust deposition

Due to its mineralogical and chemical compositions, mineral dust particles provide micro-nutrients to the ecosystems where deposited. The local dust deposition rate strongly depends on the atmospheric dust concentration, the height of the dust layer in the vertical column of the atmosphere, the occurrence of wash-out processes, and the atmospheric stability linked to the occurrence of vertical mixing and turbulence (Schepanski et al., 2009a). In particular wash-out processes (wet deposition) efficiently remove dust from the atmosphere and thus can generate strong spatial inhomogeneities in dust deposition rates. Being the last element of the atmospheric dust life-cycle, dust deposition fluxes obviously depend on the spatio-temporal distribution of dust emission fluxes and transport pathways. Fig. 9 illustrates the average dust deposition flux for the two EOF modes and their difference compared to the June-July 2013 mean, which are linked to different regimes of the atmospheric circulation and subsequent the regional distribution of dust source activations and predominant dust transport routes as presented above. Generally, the dry and the total dust deposition flux (Figs. 9a, b, e, and f) are both strongest over the North African continent near-by the source regions. There, the atmospheric dust load is highest and also the contribution of large particles to the atmospheric dust burden is significantly increased compared to remote regions. Due to gravitational settling, smaller particles remain longer within the atmosphere than larger particles, which contribute strongly to the dust deposition flux near-by the source regions. Thus, the spatial distribution of dust deposition fluxes over the North African continent is implicitly affected by the spatial distribution of dust emission fluxes and thus reflects the dust source activity as shown in Figs. 5a and 6b. Wet deposition caused by scavenging processes related to clouds and precipitation are in particular relevant over mountain regions and where fronts and precipitation occur (Figs. 9c, d).

With regard to the EOF phases representing different modes in atmospheric circulation (cf. Fig. 4), dust deposition rates are increased over the western Mediterranean basin during the negative EOF phase (Fig. 9), which is in agreement with increased northward dust transport as shown in Fig. 7 and Fig. 8 and the generally increased atmospheric dust concentration over the western basin (Fig. 6b). During the positive EOF phase, dust deposition fluxes are generally at a lower level, which is in agreement with lower levels of northward dust transport and atmospheric dust loadings over the Mediterranean. As wet deposition is quite efficient in removing dust from the atmosphere, fronts and associated bands of precipitation result in significant spatial
inhomogeneities in dust deposition rates, which variability is linked to the different modes of atmospheric circulation (Figs. 9c and d). The imprints of wet deposition are even dominating the total deposition flux as shown in Figs. 9e and f.

6 Discussion

The atmospheric circulation, in particular the distribution of pressure patterns, is one of the major controls on the atmospheric dust life-cycle. Pressure gradients determine local wind speed distributions that foster or inhibit dust emission, and dust transport pathways follow the resulting air flow. As the pressure patterns change their geographic location and intensity with time, pressure gradients change and consequently winds change in direction and speed as well. Here, we applied the EOF analysis to identify coherent changes in pressure patterns, represented by the 850 hPa geopotential height. We have chosen the 850 hPa level for this analysis as this level is present over mountains and less affected by local characteristics as the 1000 hPa level. It further is situated in the convective boundary layer and therefore related to the surface winds. The 850 hPa level marks the lower height for dust transport off the Mediterranean coast of North Africa, however, the EOF analysis of higher levels (e.g., 700 hPa) show similar patterns (not shown). The first PC for the June to July 2013 period reflects the northward propagation of the subtropical high (Azores high) and associated changes in the pressure patterns (Fig. 4), which describes 45% of the variance. Based on the assumption that the activation of major dust source regions and dust transport routes are determined by wind fields that develop from pressure gradients, the first EOF is assumed to represent dominant variances in the spatial distribution of dust sources activation, dust emission fluxes and transport routes. To compose characteristics representing the opposed phases identified from the EOF analysis (Fig. 3), days are assigned to a negative or a positive phase according to the first PC, which is characterized by a predominant high pressure zone over the western and central Mediterranean for the positive phase, and a predominant heat low trough extending from the western Grand Erg Occidental toward the Gulf of Biscay for the negative phase, respectively. This classification allows for a separate consideration of dust conditions linked to atmospheric circulation patterns related to reduced AOD levels over the western Mediterranean during positive phases and enhanced levels of dust loading during negative phases. This dipole pattern is also evident from the AERONET AOD estimates, where the Gozo station (Malta) records enhanced AOD levels at times when the AERONET station Palma de Mallorca (Spain) experiences in many cases low AOD levels. Eventually, the classification via EOF (PC) analysis allows for an investigation of the atmospheric dust life-cycle depending on the mode of atmospheric circulation, in particular the position of the subtropical ridge (western versus central Mediterranean) and the phase of the SHL (eastern or western phase following Chauvin et al. (2011)). Given the fact that dust is present almost every day in the atmosphere over North Africa, the level of dust source activation and, consequently, the strength of dust emission fluxes, and the dust transport direction determine the characteristics of the atmospheric dust cycle regarding its predominance and the distance and direction of dust transport routes. Because nevertheless, dust emission marks the beginning of the atmospheric dust life-cycle and deposition its termination. Relating the predominance of the individual elements of the dust life-cycle (emission - transport - deposition) to prevailing atmospheric circulation pattern referring to pressure distributions, allows for analyzing the net-balance in general and the combination of the elements in particular, which in concert determine the distribution of the dust concentration in the atmosphere. In relation to the ChArMEx/ADRIMED
SOP in June and July 2013, and exemplarily for the month when dust concentrations over the Mediterranean basin are at an increased level (cf. Nabat et al., 2013; Rea et al., 2015), the northward net dust transport at 37° N, which corresponds to the export of dust towards the western Mediterranean basin, is on average about three to four times stronger during negative phases (480 kg day\(^{-1}\)) than during positive phases (140 kg day\(^{-1}\)) over the longitudinal range of -5° E to 20° E. With regard to the June-July average, the northward dust flux is increased during negative phases by 45% (145% of mean value) and decreased by 56% during positive phases (44% of mean value). The predominance of dust source regions and dust transport routes also impact on the dust deposition fluxes, and thus ultimately on the delivery of micro-nutrients to the ecosystems where the dust is deposited. However, dust deposition rates over the Mediterranean basin are additionally determined by atmospheric stability, and cloud and precipitation formation processes.

### 7 Conclusions

This study aimed for an assessment on atmospheric circulation patterns that determine dust source activation and dust transport toward the western Mediterranean basin with regard to the ChArMEx/ADRIMED special observation period in June and July 2013. Simulations using the atmosphere-dust model COSMO-MUSCAT allow for a complementary investigation of the atmospheric dust life-cycle, in particular the spatio-temporal distribution of dust source activations, dust emission fluxes, dust transport pathways and deposition, and their dependence on the atmospheric circulation and their variability.

In order to express the atmospheric variability, EOF analysis was performed and used to identify different modes of variance: The first EOF explains 45% of the variance and identifies therefor the dominant variability in 850 hPa geopotential. It can be linked to two opposing pressure patterns: A positive phase, which is characterized by a high pressure ridge extending from the Atlantic into the Mediterranean Sea with the SHL being in its eastern phase (Chauvin et al., 2011), an enhanced pressure gradient forms, in particular over the eastern part of the Grand Erg Occidental. Consequently, a hot spot for dust emission can be found there. The negative phase is associated with a low pressure trough between Gulf of Biscay and western Sahara and a weak high pressure zone over central Mediterranean. Hotspot for dust emission appears over the Libyan desert southeast of the Gulf of Sidra, where the pressure gradient between the central Mediterranean high and the Etesian heat low increases. However, increased level of dust source activation and dust emission flux does not directly convert into increased atmospheric dust burden over the Mediterranean. The increased dust source activity over the eastern Grand Erg Occidental is related to prevailing northerly winds, which limit dust transport toward the Mediterranean coast, although an eastward migration of the high pressure zone enables dust transport in northern direction. Dust emitted from sources located in the Libyan desert southeast of the Gulf of Sidra is predominantly transported in southward direction into the Sahara. Meridional dust transport towards the Mediterranean during June and July 2013 predominantly occurred between 5° W and 10° E when the SHL was in its western phase and the high pressure ridge was centered over the central Mediterranean.

In the frame of ChArMEx, which focus on aerosol concentration, its variability and impact on the radiation budget (see Mallet et al., 2016, for an overview), this study provides relevant information for assessing the radiative budget of aerosols over the Mediterranean. As described by Nabat et al. (2015), Chazette et al. (2016), and Denjean et al. (2016), aerosol type, optical
properties, and concentration vary with time and space, which consequently results into a variability in its impact on the radiation budget. Chazette et al. (2016) found changes in backscatter-to-extinction ratio over Minorca, Spain, with wind direction due to the advection of different air masses: pollution from Iberian peninsula versus marine air masses that from time to time transport mineral dust from North Africa as described in section 5. Also, dust deposition varies accordingly, which affects the flux of insoluble particles and micro-nutrients delivered by the mineral dust to the ecosystems. Here, this outcomes from this study can contribute to the general interpretation of measurements collecting particles at individual measurement sites as for example carried out by Laurent et al. (2015) in the frame of ChArMEx.

In conclusion, the EOF analysis of the 850 hPa geopotential height is valuable for the identification of general atmospheric circulation pattern. Here, patterns of coherent variance are linked to pressure patterns that foster dust source activation over particular regions. Due to the dependence of dust transport on wind direction, dust export toward the Mediterranean basin and consequently atmospheric dust concentrations over selected cities (AERONET sites), and dust deposition rates can be linked to that particular atmospheric circulation pattern as well. In terms of dust optical and physiochemical properties, which are determined by their source region, certain pressure pattern enable for transport of dust predominantly from particular dust source regions. As also dust transport routes change with the location of pressure centers, internal and external mixing of dust plumes with further aerosols and pollutants is expected. As dust delivers micro-nutrients to the eco-systems, dust deposition fluxes may impact on the bio-productivity of individual ecosystems. Long-term simulations such as reanalysis data sets or the CMIP (Coupled Model Intercomparison Project) data sets motivates studies examining the trend of the occurrence of atmospheric circulation patterns associated with the negative or positive phase - and hence the predominance of dust transport toward the Mediterranean basin. As several densely populated regions are situated in coastal Mediterranean region, the occurrence frequency of dust haze is relevant for e.g. air quality and thus contributes to quality of life and well being of about 150 million people living along the shorelines of the Mediterranean Sea (United Nations Environment Programme (UNEP), http://www.unepmap.org). Furthermore, atmospheric dust alters the radiation budget, impacts on cloud and precipitation formation processes and affects the ecosystems, which makes the role of atmospheric dust vital for the Mediterranean climate, its environment and anthroposphere.

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References


Figure 1. Overview on AERONET measurement sites considered within this study: Gozo, Malta (36.03° N; 14.26° E), Murcia, Spain (38.00° N; -1.17° E), Oujda, Morocco (34.65° N; -1.90° E), Palma de Mallorca, Spain (39.55° N; 2.63° E), Tizi Ouzou, Algeria (36.70° N; 4.06° E). Orography is indicated by gray shading.
Figure 2. Temporal evolution of dust AOD at five different stations (see Fig. 1) located along frequent dust transport routes. Dust AODs calculated from 3-hourly COSMO-MUSCAT output for June and July 2013 is represented by the red line, AERONET level 2.0 coarse mode AOD retrievals from sun-photometer measurements are shown in black. COSMO-MUSCAT dust AODs are calculated for the grid cell corresponding to the AERONET measurement site.
Figure 3. EOF analysis of the geopotential height at 850 hPa taken from COSMO-MUSCAT simulations for June and July 2013. Shown are the first three EOFs and the principal component of the first EOF. The variance explained is given in percentage (upper right corner of each plot). Negative phase: 1 - 21 June, 3 July, 11 - 12 July, 20 - 28 July 2013. Positive phase: 22 June - 2 July, 4 - 10 July, 13 - 19 July, 29 - 31 July 2013.
Figure 4. Composite of the 850 hPa geopotential height [gpm] for positive (a) and negative (b) phases of the first EOF for June to July 2013.
Figure 5. Composite of the COSMO-MUSCAT model dust emission flux [kg m$^{-2}$ day$^{-1}$] for positive (a) and negative (b) phases of the first EOF for June to July 2013. (c) and (d) show the difference [%] of the average dust emission flux during (a) and (b) compared to the June-July 2013 mean.
Figure 6. Composite of the dust AOD for positive (a) and negative (b) phases of the first EOF for June to July 2013. (c) and (d) show the difference [%] regarding the June-July 2013 mean.
Figure 7. Composite of the meridional dust flux at 37°N [kg m\(^{-2}\) day\(^{-1}\)] for positive (a) and negative (b) phases of the first EOF for June to July 2013. (c) and (d) show the difference [kg m\(^{-2}\) day\(^{-1}\)] regarding the June-July 2013 mean.
Figure 8. (a) Composite of the vertical totals of the meridional dust flux at 37° N [kg m⁻¹ day⁻¹] for positive (red) and negative (blue) phases of the first EOF for June to July 2013 as well as the June-July 2013 mean flux. (b) shows the difference [kg m⁻¹ day⁻¹] regarding the June-July 2013 mean.
Figure 9. Composite of the dry dust deposition [kg m\(^{-2}\) day\(^{-1}\)] for positive (a) and negative (b) phases of the first EOF for June to July 2013. Similar composites for wet deposition and total (dry + wet) deposition fluxes are shown in (c) and (d) respectively in (e) and (f). (g) and (h) show the difference [%] of the average total dust deposition flux during (e) and (f) compared to the June-July 2013 mean.