



21st Century Asian air pollution impacts glacier in northwestern Tibet

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Abstract. Over the last four decades, Asian countries have undergone significant economic development leading to rapid urbanization and industrialization in the region. Consequently, fossil fuel consumption has risen dramatically worsening the air quality in Asia. Fossil fuel combustion emits particulate matter containing toxic metals that can adversely affect living organisms, including humans. Thus, it is imperative to investigate the temporal and spatial extent of metal pollution in Asia. Recently, we reported a continuous and high-resolution 1650–1991 ice core record from the Guliya ice cap in northwestern Tibet, China showing a contamination of Cd, Pb and Zn during the 20th century. Here, we present a new continuous and high-resolution ice core record of trace metals from the Guliya ice cap that comprises the years between 1971 and 2015, extending the 1650–1991 ice core record into the 21st century. Non-crustal Cd, Pb, Zn and Ni enrichments increased since the 1990s reaching a maximum in 2008. The enrichments of Cd, Pb, Zn, and Ni increased by ~75 %, 35 %, 30 %, and 10 %, respectively during the 2000–2015 period relative to 1971–1990. Our analysis suggests that emissions from Pakistan’s fossil fuel combustion (by road transportation and the manufacturing and construction industries) became the dominant source of Cd, Pb, Zn, and Ni deposited on Guliya between 1995 and 2015. However, it is possible that emissions from Central Asia, Afghanistan, India, Nepal, and the Xinjiang province in China have also impacted Guliya during the 21st century. The enrichments of Cd, Zn, and Ni declined after 2008 likely due to a coal consumption decrease in Pakistan at that time. This new record demonstrates that the current emissions in Asia are impacting remote high-altitude glaciers in the region and that mitigation policies and technologies should be enforced to improve the air quality as economic development continues in most Asian countries.

1 Introduction

Atmospheric trace elements (TE), including toxic metals (e.g., Hg, Pb, Cd) have dramatically increased since the 19th century due to human activities (Pacyna and Pacyna, 2001; Tian et al., 2015). Some TEs are highly toxic and harmful to an array of animals, plants and humans. Atmospheric TEs can originate from natural sources/processes in the environment such as windborne dust, wildfires, sea-spray aerosols, volcanic activity, and from vegetation (Nriagu, 1989a, b). TEs are also released into the atmosphere by human activities including: 1) the combustion of fossil fuels including coal, oil and its distillates (e.g., gasoline, jet fuel, diesel); 2) industrial processes such as mineral, and metal



34 production; 3) agriculture practices that include the use of fertilizers and pesticides; and 4) waste disposal (Pacyna
35 and Pacyna, 2001).

36 Various anthropogenic sources, including fossil fuel combustion and smelting, emit fine ($< 2.5 \mu\text{m}$) particulate matter
37 ($\text{PM}_{2.5}$) which can contain toxic metals such as As, Cd, Pb, and Zn. Due to its small size, the lifetime of $\text{PM}_{2.5}$ in the
38 atmosphere can last for over a week, thereby allowing it to be transported and deposited far from its initial sources
39 (e.g., onto remote glaciers) (Pacyna and Pacyna, 2001; Marx and McGowan, 2010).

40 Since the 1980s, Asian countries such as China, India, Pakistan, Nepal, Bangladesh and others have undergone
41 significant and rapid economic growth, leading to considerable urbanization and industrialization in the region.
42 Consequently, fossil fuel combustion has risen dramatically in most of these countries worsening the air quality. In
43 particular, China and India, the second and fifth largest economies in the world according to the International Monetary
44 Fund, are respectively the largest and third largest emitters of both CO_2 and $\text{PM}_{2.5}$.

45 The rapid economic growth of China has been the result of its economic reform and open policy beginning in 1978
46 after Mao Zedong's death and the subsequent five-year plans (FYP) implemented by the Chinese government. With
47 their economic growth, China and India started to increase their coal consumption since ~1970 amplifying the global
48 atmospheric emissions of CO_2 and $\text{PM}_{2.5}$ (Crippa et al., 2018; EDGARv4.3.2, 2017).

49 In 1999, the Chinese government implemented the "Western Development" policy in the 10th FYP to improve the
50 quality of the environment in the east and to transfer energy (West to East energy program) and mineral resources
51 from the west to the rest of the country (Chen et al., 2010; Lai, 2002; Dong and Yang, 2014). For this purpose, the
52 necessary infrastructure (e.g., airports, railways, highways, water infrastructure, power lines) was built. As a result,
53 energy consumption (Jianxin, 2016) and atmospheric emissions (Liu et al., 2015) have been increasing significantly
54 in western China.

55 In particular, the Xinjiang Uygur Autonomous Region, situated in an arid region of Northwestern China, has become
56 important for the Western Development implementation because of its location on the new Silk Road and its large
57 reserves of oil, gas, and coal (Fridley et al., 2017; Chen et al., 2010; Dong and Yang, 2014). Three mountain ranges
58 shape the topography of this province: the Altai on the northern border, Tien Shan in the center, and the western
59 Kunlun Mountains, where the Guliya ice cap is located (see below), along the southern border with Tibet (Fig. 1a).

60 Pakistan, to the southeast of Xinjiang, gained its independence in 1947 after which its population rose very rapidly
61 becoming the world's sixth most populated country by 2003 (UN, 2017). Although Pakistan's economic growth has
62 been much lower than China's and India's, urban Pakistani cities are among the most polluted in the world (WHO,
63 2016) due to the high population growth, industrialization and a significant increase of motor vehicles that lack
64 emission controls and use low quality gasoline/diesel. The number of registered vehicles increased by ~400 % between
65 1996 (3.838 million) and 2014 (15.168 million) (Bajwa, 2015). Emissions from motor vehicles (60–70 %), industry,
66 and the generation of ~54,000 t of solid waste per day which is either dumped or incinerated have been estimated as
67 the principal sources of $\text{PM}_{2.5}$ and air pollution in Pakistan (Colbeck et al., 2010; Sánchez-Triana et al., 2014).



68 For the year 1995, Pacyna and Pacyna (2001) estimated that non-ferrous metal production was the largest source of
69 As, Cd, Cu, In, and Zn; while coal combustion was the major source of Cr, Hg, Mn, Sb, Se, Sn, and Tl, and oil
70 combustion was the major source of Ni and V, both worldwide and in Asia. For the same year, these authors estimated
71 that leaded gasoline was the major source of Pb worldwide as well as in Asia. However, changes in emissions of
72 atmospheric TEs have occurred during the 21st century in Asia due to the following: 1) China and India emerged as
73 the fastest growing economies and most populated countries in the world (UN, 2017); 2) developing countries such
74 as Pakistan, Nepal and Bangladesh have significantly increased their national economic activities since the 1980s–
75 1990s; 3) temporal and regional variations in the implementation of control emission technologies and air quality
76 standards (often higher concentrations than those recommended by the World Health Organization); 4) leaded gasoline
77 was banned in 2000 in China, India, and Nepal and in 2002 in Pakistan, while it is still consumed in Afghanistan.
78 Therefore, it is imperative to study the spatial and temporal effects of these new pollution sources and their resulting
79 impacts on the environment.

80 Atmospheric emissions estimates are associated with large uncertainties due to inaccurate statistical information, the
81 lack of field data and limited temporal and spatial coverage of observations. Thus, natural registers of past
82 environmental conditions such as glaciers, which are influenced only by deposition of atmospheric species, are
83 essential for reconstructing time series of atmospheric metal depositions (Hansson et al., 2015; Cooke and Bindler,
84 2015; Gabrielli and Vallelonga, 2015; Marx et al., 2016) that can be further used by modelers to reconstruct past
85 emissions and project future atmospheric contamination trends.

86 Recently, we obtained a 350-year (1650–1991) high-resolution TE record (Sierra-Hernández et al., 2018) using an ice
87 core drilled in 1992 from the Guliya ice cap located in northwestern China, specifically in Tibet’s Kunlun Mountains
88 (35° 17.37’ N; 81° 29.73’ E; 6200 m a.s.l.) (Thompson et al., 1995) (Fig. 1a). Outside of the Arctic and Antarctica,
89 the glaciers in the Kunlun Mountains, along with those in Tibet and the Himalayas, are the largest reservoir of ice on
90 the globe and are commonly referred to as the “Third Pole”. This glacial region is the source for numerous rivers in
91 Asia which provide water to hundreds of millions of people. The 1992 Guliya TEs record showed that long-distance
92 emissions from coal combustion in Europe were likely deposited on the ice cap between 1850 and 1940 (Sierra-
93 Hernández et al., 2018). Additionally, Pb, Cd, and Sn enrichments were detected between 1975 and 1991. The origin
94 of these more recent enrichments could not be determined as more anthropogenic sources have emerged, especially
95 in this region.

96 Here, we use a new ice core retrieved from Guliya in 2015 to extend the 1650–1991 TEs record into the 21st century
97 (1971–2015) and to determine the impacts of the recent emission changes in Asia on the western Kunlun Mountains
98 glaciers. This study fills a temporal and spatial gap in the investigation of atmospheric toxic trace metals in
99 Northwestern China where atmospheric emission data are limited.



100 2 Methodology

101 2.1 Guliya cores

102 In 2015, two ice cores (309.73 m and 72.40 m long) were extracted from the plateau of the Guliya ice cap (6200 m
103 a.s.l), in close proximity to the 1992 drilling site. The timescale was constructed by annual layer counting using three
104 fixed horizons at 2015 (surface of the glacier), at 1992 corresponding to the surface of the 1992 core (at 6 m in the
105 shallow core), and at 1963 (at 10.9 m in the shallow core determined by beta radioactivity from the Arctic
106 thermonuclear tests). Annual layers were determined using both cores by matching the signals of at least three different
107 parameters (Cl^- and Na^+ , dust and Ca^{2+} , SO_4^{2-} , and $\delta^{18}\text{O}$). Dating uncertainties are estimated at 1–2 years between the
108 fixed points and may be the result of the very low annual accumulation (~ 230 mm water equivalent) and surface-
109 alteration processes such as snow redistribution through wind. Details of the drilling operation, the ice cores, and the
110 timescale can be found in Thompson et al. (2018).

111 2.2 Sample preparation and ICP-SFMS analysis

112 The preparation of the samples and their analysis were performed following the same procedures adopted for the 1992
113 Guliya core samples (Sierra-Hernández et al., 2018). Briefly, 159 ice samples comprising the years 1971 (11 m) to
114 2015 (0.06 m) were cut from the 309.73 m long-deep ice core. To ensure the analysis of 3–4 samples year⁻¹, the sample
115 resolution was adjusted between 4.5 and 11 cm accordingly. The samples were rinsed three times with nanopure water
116 ($18.3 \text{ M}\Omega$) in a class-100 cleanroom and placed in acid pre-cleaned LDPE containers (Nalgene) to melt. Once melted,
117 samples were transferred into acid pre-cleaned LDPE vials where nitric acid (HNO_3 , Optima for Ultra Trace Element
118 Analysis, Fisher Scientific) was added to obtain a 2 % (v/v) acidified sample. The samples were then stored in the
119 cleanroom for a 30-day period during which the acid leaching process took place. At the end of the 30-day period, the
120 samples were immediately analyzed or stored at -32°C .

121 Twenty-nine TEs (Ag, Al, As, Ba, Bi, Cd, Co, Cr, Cs, Cu, Fe, Ga, Li, Mg, Mn, Mo, Na, Nb, Ni, Pb, Rb, Sb, Sn, Sr,
122 Ti, Tl, U, V, and Zn) were measured in the samples by Inductively Coupled Plasma Sector Field Mass Spectrometry
123 (ICP-SFMS) (Element 2) (Sierra-Hernández et al., 2018; Beaudon et al., 2017). Trace elements were quantified using
124 linear calibration curves constructed from external standards analyzed before and after the samples.

125 Detection limits, procedural blanks, and accuracy results are presented in Table S1. Detection limits correspond to
126 three standard deviations of the concentration of 10 blank measurements (2 % optima HNO_3 aqueous solution) and
127 fluctuate between 0.01 pg g^{-1} for Bi to 0.2 ng g^{-1} for Fe and 0.4 ng g^{-1} for Na (Sierra-Hernández et al., 2018; Beaudon
128 et al., 2017). To verify that the sampling and decontamination procedures did not add TEs to the ice core samples,
129 procedural blanks were made with nanopure water and analyzed with the ice core samples (Uglietti et al., 2014). Their
130 TE concentrations are considered negligible for all TEs, apart from Nb (9 %), as they were lower than 2 % of the
131 corresponding median concentration. The accuracy of the ICP-SFMS was determined each day of analysis using a 20-
132 fold dilution of a TMRain-95 certified solution (Environment Canada). The obtained TE concentrations fell within
133 the uncertainty limits in the certificate of analysis.



134 2.3 Non-crustal contribution

135 Enrichment Factor (EF) and Excess concentrations are used to assess the crustal and non-crustal (e.g., anthropogenic)
 136 origins of each TE.

137 The EF is obtained following Eq. (1)

$$138 \quad EF = [TE / Fe]_{ice} / [TE / Fe]_{PSA} \quad (1)$$

139 where $[TE / Fe]_{ice}$ corresponds to the ratio of a particular TE concentration to that of Fe in an ice sample and
 140 $[TE / Fe]_{PSA}$ is the respective ratio in dust samples used as potential source area (PSA). For details about the Guliya
 141 PSA and EFs derived from PSAs, the reader is referred to Sierra-Hernández (2018).

142 Similar to the previous Guliya TEs study, Fe was chosen as the crustal reference due to its stability and high abundance
 143 in soil and rocks (Wedepohl, 1995), its high concentration both in the ice core samples and the PSAs; and the ability
 144 of the ICP-SFMS to measure Fe with high accuracy and precision (Uggetti et al., 2014).

145 Excess concentrations are calculated following Eq. (2)

$$146 \quad Excess = [TE]_{ice} - ([TE/Fe]_{pre-industrial} \times [Fe]_{ice}) \quad (2)$$

147 $[TE]_{ice}$ and $[Fe]_{ice}$ are the concentrations of a particular TE and of Fe in the sample; $[TE/Fe]_{pre-industrial}$ is the median of
 148 the TE concentration to the Fe concentration during the pre-industrial period (1650-1750), as obtained from the 1992
 149 Guliya record (Sierra-Hernández et al., 2018).

150 To be consistent with our previous Guliya TEs publication, a TE will be considered of non-crustal origin (enriched)
 151 when increases in EF and Excess concentration are significantly different from its background (pre-industrial levels),
 152 using both a two-sample t-test for averages and the Mann–Whitney test for medians ($p < 0.01$).

153 2.4 Statistical analysis

154 All statistical analyses, factor analysis, cluster analysis, Mann–Whitney test for medians and a two-sample t-test for
 155 averages and Mann–Kendall trend tests, were performed using Minitab 17 and 18. The Mann–Whitney test and the
 156 two-sample t-test were applied to the entire data set subdivided into three groups: 1971–1990, 1990–2000, and 2000–
 157 2015.

158 3 Results and discussion

159 The time series of Cd, Pb, Zn, Ni, and Al concentrations, Excess concentrations and EFs are presented as 5-year
 160 running means in Fig. 2. The concentrations show high variability between 1971 and 1990 that decreases after 1990
 161 perhaps as a result of the decreasing frequency of dust storms in the region (Thompson et al., 2018).



162 The Excess concentrations and EFs of Cd, Ni, Pb, and Zn increase after ~1990 and continue to increase more rapidly
 163 and significantly after 2000. Their EF averages increase by ~10 % during 1990–2000, and during 2000–2015 by 75
 164 % (Cd), 35 % (Pb), 30 % (Zn) and 10 % relative to the 1971–1990 period.

165 A comparison between the 1992 and the 2015 Guliya TE records is discussed in the Supplement (Fig. S1). The 1992
 166 Guliya TE records show that enrichments of Pb and Cd begin ~1975 while the 2015 Guliya record shows they continue
 167 to rise into the 21st century until ~2008 when the Cd enrichment started to decrease. In addition to these TEs, the 2015
 168 record exhibits clear increases in Zn and Ni EFs since the 1990s into the 21st century, and similar to Cd, they decrease
 169 after 2008. The Zn enrichment began to increase after 1975 similar to Pb and Cd; however, the signal may have been
 170 overwhelmed by its crustal component in the 1992 core record rendering it undetectable.

171 A factor analysis method was used to assess the shared variability among TEs to determine possible common sources
 172 (Sierra-Hernández et al., 2018). Much of the variance (94%) is explained by both Factor 1 (73 %) and Factor 2 (21
 173 %) (Table S2). Similar to the 1992 TE results, TEs of crustal origin (e.g., Al, As, Ba, Fe, Mg, Mn, Ti, and V) fall into
 174 Factor 1. In Fig. S2 the time series of Factor 1 scores are compared with the ice core concentrations of dust particles
 175 ($\rho = 0.20$, $p = 0.2$) and with the typical crustal TEs Fe and Al. Water-soluble TEs (e.g., Na, Sr), which are deposited
 176 in the form of salts (evaporites) or carbonates, contribute to Factor 2 (Sierra-Hernández et al., 2018) (Table S2). This
 177 is shown in the Factor 2 time series (Fig. S3) which have significant ($p < 0.001$) correlations with the ions Cl^- ($\rho =$
 178 0.83), NO_3^- ($\rho = 0.84$), SO_4^{2-} ($\rho = 0.90$), Na^+ ($\rho = 0.92$), NH_4^+ ($\rho = 0.62$), K^+ ($\rho = 0.84$), Mg^{2+} ($\rho = 0.86$), and Ca^{2+} ($\rho =$
 179 0.75) (Thompson et al., 2018).

180 Factor 3 explains 2 % of the variance and is loaded in Cd, and to a lesser extent in Bi, Cu, Mn, Ni, Pb, Sn, Tl, and Zn.
 181 Although 2 % represents a low variance possibly within the background noise, it could still have a physical
 182 significance (Moore and Grinstead, 2009). In order to determine if Factor 3 is physically explainable, its time series
 183 scores are plotted with the EFs of Cd, Pb and Zn in Fig. 3.

184 Factor 3 was found to be significantly ($p < 0.01$) correlated with the EFs of the following 12 metals: Cd ($\rho = 0.92$),
 185 Zn ($\rho = 0.92$), Pb ($\rho = 0.80$), and Ni ($\rho = 0.80$) shown in Fig. 2, and Ag ($\rho = 0.62$), Bi ($\rho = 0.60$), Co ($\rho = 0.50$), Cr ($\rho =$
 186 0.60), Cu ($\rho = 0.51$), Mn ($\rho = 0.63$), Sn ($\rho = 0.74$), and Tl ($\rho = 0.64$). This indicates that Factor 3 explains the EFs
 187 of the aforementioned metals. To distribute the TEs into associated groups, a cluster analysis was performed with
 188 Factors 1-3 using the Ward linkage method and the Euclidan distance measure (Fig. S4). The cluster analysis shows
 189 that Pb and Zn are strongly associated with Cd, Bi, and Mn suggesting these TEs likely have a non-crustal origin.

190 3.1 21st Century anthropogenic sources

191 The Mann–Kendall trend test was used to detect TEs with sustained and significant increasing trends in EF and Excess
 192 concentration during the 1971–2015 period. The trend test indicated that Bi, Cd, Ni, Pb, Tl, and Zn, which are loaded
 193 in Factor 3, have significant increasing EF trends but only Cd, Ni, Pb, and Zn have additionally significantly increasing
 194 trends in Excess concentration. The EFs obtained here using PSAs are much smaller than those calculated using the
 195 upper continental crust average (Wedepohl, 1995) and also smaller than those from ice cores with lower dust loads



196 compared to Guliya. Thus, it is necessary to determine which of the TEs mentioned above were significantly more
197 enriched during the 2000–2015 period. For this purpose, two different tests were used, the Mann–Whitney test and
198 the two-sample t-test ($p < 0.0005$). Both tests showed that the EFs and Excess concentrations for all four metals, Cd,
199 Zn, Pb, and Ni, are significantly higher during the 2000–2015 period than during the 1971–1990 period. Thus, the
200 following sections will specifically focus on these TEs and their possible sources.

201 Back-trajectory frequency distributions was determined to establish the origin of air parcels reaching the Guliya ice
202 cap. Back trajectories (7 days) were calculated daily for the 1992–2015 period for winter (December–January–
203 February) (Fig. 1b) and summer (June–July–August) (Fig. 1c) using the HYSPLIT model from the National Oceanic
204 and Atmospheric Administration. During winter, Guliya is strongly influenced by air parcels mostly from western
205 Xinjiang (China); from Central Asia, which consists of the former Soviet republics of Kazakhstan, Kyrgyzstan,
206 Tajikistan, Turkmenistan, and Uzbekistan; from Afghanistan and Pakistan in South Asia; and to a lesser extent from
207 the Middle East, Northern Africa, Eastern, and Western Europe. In summer, westerly and southerly (monsoonal)
208 flows, and even occasional northerly flows, influence Guliya, such that the entire Xinjiang region in addition to Central
209 Asia and the northern regions of Afghanistan and Pakistan lies within the back trajectories area. Air parcels from other
210 Southern Asian countries, such as India and Nepal, can also reach Guliya during summer.

211 Trace element enrichments in the Guliya core could reflect changes in emissions, atmospheric circulation, and/or post-
212 depositional processes. Post-depositional processes (e.g., seasonal surface melting, percolation and refreezing of
213 meltwater) do not significantly affect the stratigraphy of the Guliya core (Thompson et al., 2018). The Guliya borehole
214 temperatures were between -8°C and -12°C from the surface to ~ 15 m depth confirming that the ice is cold (Thompson
215 et al., 2018) and that overprinting of the TE records due to meltwater percolation is unlikely to occur. Thus, the
216 enrichments observed in the Guliya record indicate increasing emissions in specific source regions and/or changes in
217 atmospheric circulation.

218 To determine the origin of the Guliya Cd, Pb, Zn, and Ni enrichments, we examine the most important emission
219 sources of atmospheric TEs from the determined regions of influence: Central Asia, South Asia (Afghanistan,
220 Pakistan, and India), and Xinjiang (China). We also use $\text{PM}_{2.5}$ emission estimates, which very likely contain toxic
221 metals such as Cd, Pb, Ni, and Zn, using the EDGAR (Emissions Database for Global Atmospheric Research) v4.3.2
222 air pollutant dataset (1970–2012) (EDGARv4.3.2, 2017; Crippa et al., 2018). The EDGAR dataset provides total $\text{PM}_{2.5}$
223 and also $\text{PM}_{2.5}$ by emission sector for all countries.

224 In the EDGAR database, the total $\text{PM}_{2.5}$ corresponds to emissions from all human activities except large-scale biomass
225 burning and land use, land-use change, and forestry (EDGARv4.3.2, 2017; Crippa et al., 2018). To better understand
226 the possible emission sources, here we divided the EDGAR $\text{PM}_{2.5}$ emission sectors into four source categories in
227 accordance with the 2006 IPCC Guidelines for National Greenhouse Gas Inventories (IPCC, 2006). These source
228 categories include: 1) fossil fuel combustion that comprises the emission sectors: power generation and combustion
229 in the manufacturing, transportation, and residential sectors, 2) industrial processes which include the emission
230 sectors: mineral, chemical, and metal industry and other production industry (note: this category does not include any
231 type of fossil fuel combustion used by these industries), 3) agriculture which includes the emission sectors: manure



management, rice cultivation, direct soil emission, manure in pasture/range/paddock and other direct soil emissions, and 4) waste that includes the emission sectors: waste incineration and solid waste disposal on land.

From 1980 to 2012, total $PM_{2.5}$ emissions in Afghanistan, Pakistan, India, Nepal, and China primarily originated from the fossil fuel combustion emission sectors (~80–95 %), followed by the industrial source category (~5–20 %), agriculture source category (~9 %) and waste source category (<1 % for China, no $PM_{2.5}$ emissions estimated for waste incineration from the other countries in the EDGAR database) (EDGARv4.3.2, 2017; Crippa et al., 2018). Regarding Xinjiang in particular, numerous studies estimated coal combustion as the major source of atmospheric Cd, Pb, Zn, and Ni followed by smelting processes as a source for Cd, Pb, and Zn (Li et al., 2012; Shao et al., 2013; Cheng et al., 2014; Tian et al., 2015), and by oil combustion as a source for Ni (Tian et al., 2012). Thus, in the following sections we focus on the three largest TE and $PM_{2.5}$ source categories: fossil fuel combustion (Sect. 3.1.1), metal production (Sect. 3.1.2), and agricultural sector (Sect. 3.1.3).

3.1.1 Fossil fuel combustion

In the regions that influence Guliya, two distinct trends in fossil fuel consumption and total $PM_{2.5}$ emissions are discernible. Firstly, a steady increasing trend since the 1970s is observed in the Xinjiang province, Afghanistan, Pakistan, India, and Nepal (Fig. 4a). Secondly, a decline after the 1990s is observed in Central Asian countries due to the collapse of the Soviet Union (Fig. 4b). India and Xinjiang (China) became the largest consumers of both coal and oil in the region during the 21st century, with coal as their primary energy source (Fig. 4). The third largest consumer of coal and oil in the region during the 21st century is Kazakhstan despite its decreased consumption after the 1990s. Interestingly, for each individual country, total $PM_{2.5}$ emissions generally follow coal consumption as shown in Fig. 4.

Significant positive correlations were found between the Guliya EFs of Cd, Pb, Zn, and Ni and coal consumption in Xinjiang, India, China, and Pakistan; oil consumption in Xinjiang, India, China, Pakistan, and Turkmenistan; and total $PM_{2.5}$ emissions from China, India, Pakistan and Afghanistan. These positive correlations were expected since these records show generally increasing trends as shown in Fig. 4. Although Pakistan's fossil fuel consumption is 1–2 orders of magnitude lower than that of Xinjiang and India, the Guliya TE enrichments closely resemble Pakistan's coal consumption between 2005 and 2015. Both records peaked in 2008 after which they began to decrease suggesting Pakistan's coal consumption could be one of the sources of anthropogenic TEs observed in the Guliya core.

To further investigate the role of fossil fuel combustion in Pakistan and in the other regions, we examined $PM_{2.5}$ emitted by the different sectors comprising fossil fuel combustion. The most interesting outcome is the temporal correspondence between the Guliya TE enrichments and Pakistan's $PM_{2.5}$ emissions from fossil fuel combustion associated with road transportation and manufacturing and construction (M-C) industries, which are the two largest $PM_{2.5}$ emission sectors in Pakistan (Fig. 5). The enrichments of Cd, Pb, Zn, and Ni have two maxima, one in 2000 when $PM_{2.5}$ emissions from road transportation peaked, and the other in 2008 when $PM_{2.5}$ emissions from the M-C industries peaked. After 2008, TE enrichments (except for Pb) and $PM_{2.5}$ emissions (road transportation and M-C industries) decreased (Fig. 5). These temporal similarities suggest that the TE enrichments detected in the Guliya ice



core after 1995 may have primarily originated from the combustion of fossil fuels in Pakistan by road transportation (since 1995) and by the M-C industries (since 2004).

Although Pakistan's oil and coal consumption is much lower than Xinjiang and India's, Pakistan is home to some of the most polluted cities in the world (WHO, 2016) due to the lack of emission controls and air quality standards (Colbeck et al., 2010; Sánchez-Triana et al., 2014). These cities include Peshawar, Rawalpindi, Lahore, Faisalabad, and Pakistan's capital, Islamabad (Rasheed et al., 2014; WHO, 2016; Shi et al., 2018), all located in northern Pakistan from which air parcels have been shown to strongly influence the Guliya site throughout the year. Air parcels from Xinjiang and India, on the other hand, only reach Guliya during summer (Fig. 1c) which further suggests that Pakistan is the likely dominant geographical origin of the Guliya TE enrichments.

3.1.2 Metal production

Like fossil fuel consumption, metal production has increased in Asia since the 1980s (Fig. S5) being China, India and Kazakhstan the most important non-ferrous metal producers in the region and in the world (BGS, 2015). In China, most of the non-ferrous metal production is located in the coastal regions while all Ni production is located in the western region of China (Gansu, Xinjiang, Chongqing, Yunnan, and Liaoning provinces). Gansu, just east of Xinjiang, produces 95 % of the total Ni production (Yanjia and Chandler, 2010). The Guliya TE enrichment trends do not resemble those of metal production in China, Pakistan, India nor Kazakhstan (Fig. S5). Thus, although these important metal production sources are relatively close to Guliya, they are likely not the primary source of the Guliya TE enrichments.

PM_{2.5} emissions by industrial processes contribute ~20 %, 10 %, and 5 % to the total PM_{2.5} emissions in Pakistan, China, and both India and Kazakhstan, respectively. Pakistan's PM_{2.5} emissions by industrial processes peaked in 2008 similar to the Guliya TE enrichments, but they remained relatively stable after that while the Guliya TE enrichments decreased (Fig. S5). Thus, while the increasing emissions from metal production could also influence the TE depositions observed in Guliya, the metal production temporal trends and the industrial PM_{2.5} emissions suggest they are not the main sources of the Guliya TE enrichments.

3.1.3 Agricultural activities

Emissions from agricultural activities are an important source of atmospheric PM_{2.5} worldwide (Lelieveld et al., 2015; Bauer et al., 2016). Fertilizers and pesticides can be a direct (aerial spreading) or indirect (soil exposed to wind erosion) source of toxic metals such as As, Cd, Cu, Cr, Pb, Ni, Zn, and others to the atmosphere (Nriagu, 1989b; Nriagu and Pacyna, 1988). In particular, fertilizers derived from phosphate rocks contain heavy metal impurities such as Cd and Pb that can contaminate agricultural soils (Mortvedt, 1995; Roberts, 2014). While consumption of phosphate fertilizers decreased in Central Asia in the 1990s, it has been increasing in China, Pakistan, India, and Nepal since the 1970s (Fig. S6). The Guliya TE enrichments do not resemble the phosphate fertilizer consumption records in these countries nor their PM_{2.5} from agricultural activities (Fig. S6). Thus, even though agricultural activities and their emissions have



also been increasing since the 1970s, their depositions at the Guliya ice cap are likely overwhelmed by those from fossil fuel combustion in Pakistan.

3.2 Atmospheric circulation

In our previous Guliya TEs study (Sierra-Hernández et al., 2018), we observed a positive correlation between the North Atlantic Oscillation (NAO) index and the EFs at Guliya suggesting non-crustal depositions originated from regions to the west. Likewise, Thompson et al. (2018) determined possible positive linkages between NAO and the 2015 Guliya ice core temperature and snowfall proxies. Fig. 6 presents a comparison of the 1992 and 2015 Guliya EF composites with the winter (DJF) NAO index and with coal production/consumption from Europe, and Pakistan between 1800 and 2015. The extended Guliya EF composite shows two periods of enrichment: ~1850–1940 and 1970–2015. We suggested that the former originated from coal consumption in Europe, which alongside the U.S. was a major coal consumer at the time. The TE enrichment dropped to pre-industrial levels during 1940–1970 coinciding with a negative NAO phase. This drop occurred at a time when atmospheric emissions in Europe reached a maximum (Pacyna and Pacyna, 2001) suggesting that atmospheric circulation (NAO) had a stronger influence over Guliya than the emission source(s) intensity. Post-1970s enrichments in both the 1992 and the 2015 Guliya records occur during positive phases of NAO. Emissions control devices were introduced in Europe ~1970 decreasing their PM_{2.5} emissions (Pacyna et al., 2007; Pacyna and Pacyna, 2001) and consequently atmospheric emissions of TEs; however, TE enrichments continue to increase in the Guliya ice core record. This divergence can be explained by changes in either emission source intensity and/or atmospheric circulation, and indeed changes in both emission intensity and atmospheric circulation have occurred post-1990s.

TEs enrichments start to decrease in 2009 while the NAO entered a slightly negative phase between 2010 and 2014. Similarly, coal consumption has decreased in Pakistan since 2009, in Kazakhstan since 2012, and in Afghanistan since 2011 while in Xinjiang it continues to increase. In addition, the Chinese government implemented the 12th FYP (2011–2015) that included policies to mitigate heavy metals emissions, implement air quality standards on PM_{2.5}, and increase renewable energy consumption which likely explains the decrease of smoke and dust particles emitted in Xinjiang since 2014 (Fig. 4). The decline in coal consumption in the region, the Chinese mitigation policies and the slightly negative NAO could all have led to a decrease in EFs and Excess concentrations. However, the winter NAO index has also been slightly negative in other years (e.g., 1919, 2000) without affecting the enrichments detected in the Guliya core. Therefore, the slightly negative NAO phase between 2010 and 2014 probably did not play a significant role in the Guliya TE enrichments decrease after 2009.

Although practically all human activities that emit PM_{2.5} and toxic metals have been increasing in South Asia and in Northwest China, it is very likely that emissions from Pakistan's fossil fuel combustion have dominated the Guliya Cd, Pb, Zn, and Ni enrichments during the 21st century, and more specifically oil combustion by road transportation since 1995 and the subsequent significant rise of coal combustion in 2004, likely mostly consumed by the M-C industries. Emissions from other sources (industrial processes, agriculture activities, waste disposal) from Pakistan



and other regions (Central Asia, Xinjiang, Afghanistan, Northwest India and Nepal) have also likely been deposited on the Guliya ice cap but to a lesser extent.

China is investing \$62 billion in the Pakistan-China Economic Corridor (PCEP), established in 2013, to improve the economy of Pakistan and to facilitate economic connectivity with other countries in the region. Until 2015, Pakistan's energy was generated mostly from oil, gas, and hydropower. After the establishment of the PCEP, five coal-fired power plants were built and have been operational since 2017. Three more are expected to open during 2019 and others are currently under construction (CPEC, 2019). Moving to coal-generated power will further increase the total coal consumption in Pakistan which in turn could have severe environmental and human health impacts in the region if mitigation actions are not taken.

4 Conclusions

A new continuous, high-resolution ice core record of trace elements covering the 1971–2015 period was extracted from the Guliya ice cap in Northwestern Tibet, China. This new record extends our previous 1650–1991 Guliya record well into the 21st century making it, the first and most up to date ice core-derived archive of trace metal contamination in the Third Pole region to date. Since the dust concentrations in the Guliya ice cores are extremely high in comparison to other ice cores from the Third Pole as shown in Sierra-Hernandez et al. (2018), we also used EF and Excess concentrations to differentiate between crustal and non-crustal origins in this new record. Increases in EF and Excess concentrations of Cd, Pb, Zn, and Ni are observed since the 1990s reaching a maximum in 2008. The enrichments of Cd, Pb, Zn, and Ni increased by ~75 %, 35 %, 30 %, and 10 %, respectively during the 2000–2015 period relative to 1971–1990. Comparisons between the Cd, Pb, Zn, and Ni enrichments from the Guliya records and fossil fuel consumption, metal production, phosphate fertilizer consumption, and PM_{2.5} emissions from Xinjiang (China), Afghanistan, Pakistan, India, Nepal, and Central Asia suggest that the metal enrichments detected in Guliya originate primarily from fossil fuel combustion (road transportation and the manufacturing and construction industry) in Pakistan between 1995 and 2015. The post-2008 Cd, Zn, and Ni decline likely reflects a coal consumption decrease in Pakistan at that time. It is likely that emissions from Xinjiang, Afghanistan, India, Nepal, and Central Asia, are also impacting Guliya during the 21st century, however their contribution is overwhelmed by that of fossil fuel combustion emissions from Pakistan. This new Guliya ice core record demonstrates that the current emissions in Asia are impacting remote high-altitude glaciers in the region. Therefore, mitigation policies and technologies should be enforced by the governments of Central and South Asian countries to improve the air quality in the region as most Asian countries continue to develop.

Data availability.

Supplement. The Supplement is available online



Author contributions. R.S.H. wrote the paper, performed all the data analysis, interpreted the data, and ran the daily HYSPLIT back trajectories; R.S.H. and E.B. prepared the ice core samples and conducted their ICP-MS analysis; E.B. created the maps for Fig. 1. All authors contributed to the study design, data interpretation, revision and edition of the manuscript. P.G. oversees the ICP-MS lab. L.G.T. planned the drilling operation and led the field expedition in which both L.G.T. and P.G. contributed to the ice core processing in the field.

Competing interests. The authors declare no competing financial interests.

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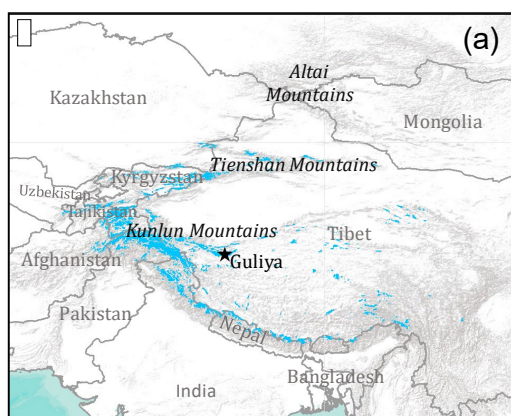
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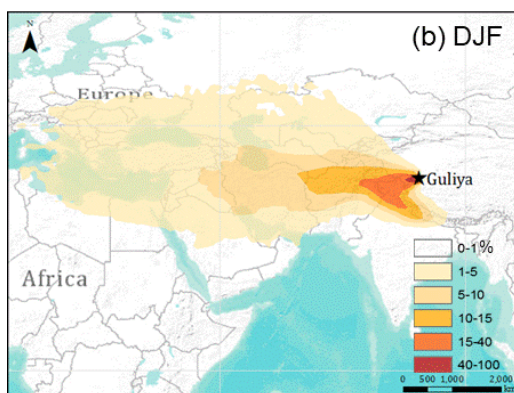
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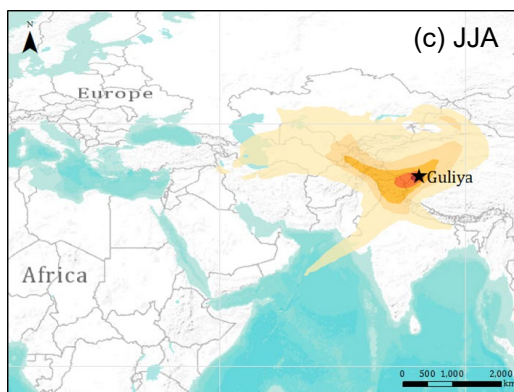
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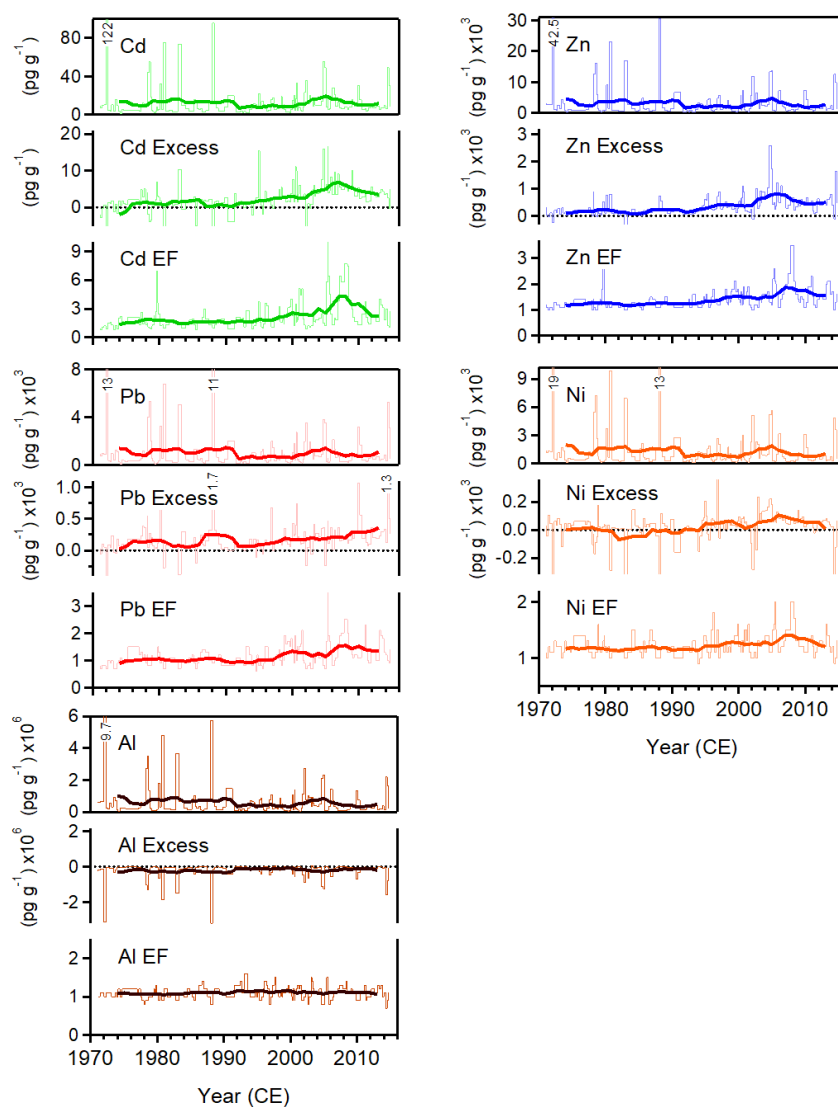
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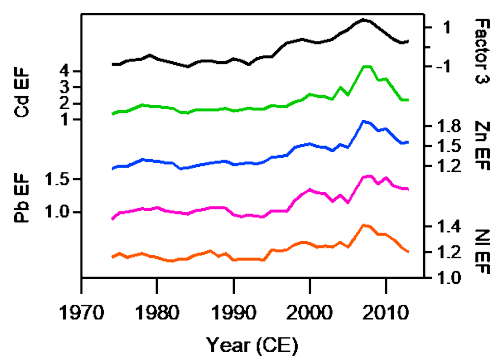
502 **Figure 1.** Maps showing the location of the Guliya ice cap (star) and the three mountain ranges of the Xinjiang
 503 province (a), and seasonal NOAA HYSPLIT 7-day back trajectories frequency plots for December, January, and
 504 February (b); and June, July, and August (c) for the 1992–2015 period (Rolph et al., 2017; Stein et al., 2015).



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506 **Figure 2.** Cd, Pb, Zn, Ni, and Al 5-year running means (thick lines) of concentrations and EFs between 1971 and
 507 2015. Thin lines show the sample resolution.

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510 **Figure 3.** Comparison of 5-year running means of Factor 3 scores with Cd, Zn, Pb and Ni EFs between 1971 and
 511 2015.

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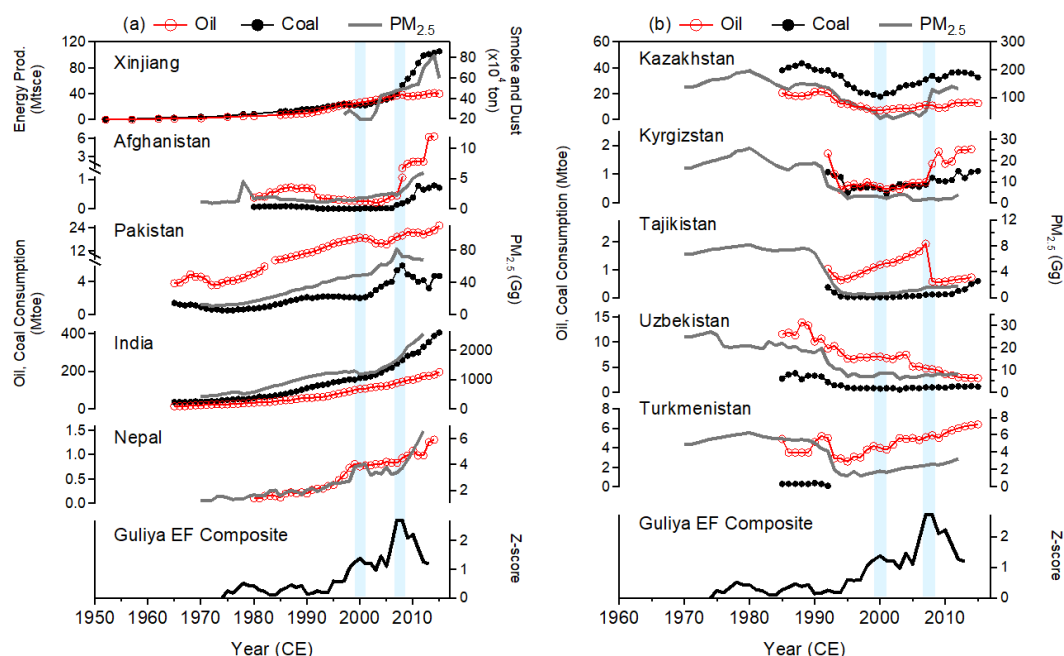
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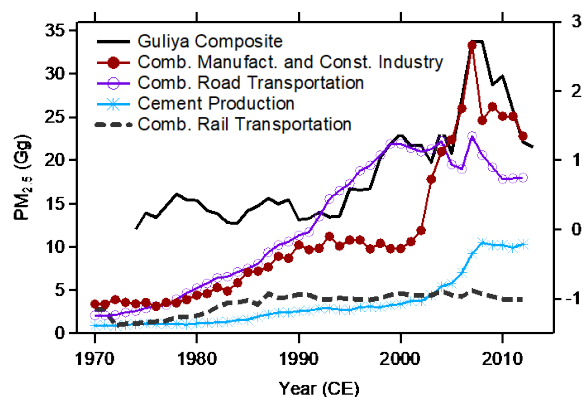


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519 **Figure 4.** Oil and coal consumption in: (a) Xinjiang, as coal energy production in million tonnes of standard coal
 520 equivalent (Jianxin, 2016); in million tonnes of oil equivalent (Mtoe) in Afghanistan (EIA, 2019), Pakistan (BP,
 521 2016), India (BP, 2016), and Nepal (coal ≤ 0.1 Mtoe) (EIA, 2019). (b) Central Asian countries: Kazakhstan (BP,
 522 2016), Kyrgyzstan and Tajikistan (EIA, 2019), and Uzbekistan and Turkmenistan (BP, 2016). PM_{2.5} emissions from
 523 anthropogenic sources (EDGARv4.3.2, 2017; Crippa et al., 2018) shown in both panels for all countries except
 524 Xinjiang (China). Smoke and dust emissions from Xinjiang (China) (Ning, 2016) are shown since no PM_{2.5} data was
 525 available. The Guliya EF composite (average of Cd, Pb, Zn, and Ni EF z-scores) is shown at the bottom of each
 526 panel for comparison. The two Guliya maxima at 2000 and 2008 are shown as shaded bars.

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530 **Figure 5.** Largest emitter sectors of $PM_{2.5}$ in Pakistan between 1970 and 2012: fossil fuel combustion in
 531 manufacturing and construction industries, fossil fuel combustion by road transportation, cement production, and
 532 fossil fuel combustion by rail transportation (EDGARv4.3.2, 2017; Crippa et al., 2018). The Guliya EF composite
 533 (average of Cd, Pb, Zn, and Ni EF z-scores) is shown for comparison.

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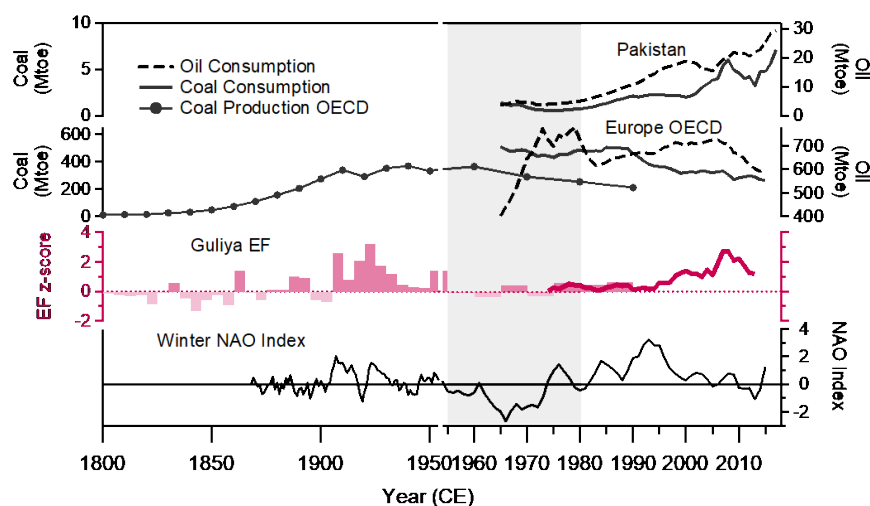


Figure 6. Comparisons of the Guliya EF composite (average of Cd, Pb, Zn, and Ni EF z-scores) from the 2015 Guliya core with the winter NAO index shown as 5-year running mean (Hurrell, 2003). The 1992 Guliya EF composite (average of Cd, Pb, and Zn EF z-scores) is shown as 5-year medians and the 2015 Guliya EF composite is a 5-year running mean. The light gray band (1955–1980) highlights the period of negative NAO. Pakistan’s and Europe coal and oil consumption (1965–2017) (BP, 2016) are shown for comparison. Europe’s coal production (1800–1990) (HYDE, 2006) is also shown. Mtoe is million tonnes of oil equivalent.