# MagIC as a FAIR repository for America's directional archaeomagnetic legacy data

Shelby Anne Jones-Cervantes<sup>1</sup>, Eric Blinman<sup>1</sup>, Lisa Tauxe<sup>2</sup>, J Royce Cox<sup>1</sup>, Stacey Lengyel<sup>3</sup>, Rob Sternberg<sup>4</sup>, Jeffrey Eighmy<sup>5</sup>, Daniel Wolfman<sup>6</sup>, and Robert DuBois<sup>6</sup>

<sup>1</sup>New Mexico Department of Cultural Affairs, Office of Archaeological Studies
<sup>2</sup>University of California, San Diego
<sup>3</sup>East Tennessee State University
<sup>4</sup>Franklin & Marshall College
<sup>5</sup>Unaffiliated
<sup>6</sup>Deceased

November 24, 2022

#### Abstract

Beginning in 1964, an academic lineage of Robert DuBois and his students, Daniel Wolfman and Jeffrey Eighmy, developed dedicated United States-based archaeomagnetic research programs. Collectively, they analyzed over 5377 archaeomagnetic sites, primarily from North America, dated to less than 2000 years old. Yet despite their decades of effort, few journal publications resulted. Most of their published results are embedded in archaeological reports, often without technical data, which limits the data's accessibility. Furthermore, when published, the results are generally averaged at the site-level using statistical conventions different from today's standards, limiting the data's comparability and (re)usability. In 2015, we undertook a salvage archival study to digitize the surviving data and metadata from the scientists' individual estates and emeritus collections. We digitized measurement data from more than 51,000 specimens, reinterpreted them using modern conventions, and uploaded them to the FAIR-adhering magnetic data repository - MagIC. The reinterpreted site-level results from the three laboratories are mutually consistent, permitting the individual datasets to be combined and analyzed as single regional entities. Through incorporation into the MagIC repository, these legacy data are now accessible for incorporation into archaeomagnetic and global magnetic field modeling efforts, critical to understanding Earth's magnetic field variation through time. In the Four Corners region of the United States Southwest, this digitized archive advances the development of a new regional paleosecular variation curve used in archaeomagnetic dating. This project highlights both the value and complexities of managing legacy data; the many lessons learned set a precedent for future paleomagnetic data recovery efforts.

## MagIC as a FAIR repository for America's directional archaeomagnetic legacy data

# Shelby A. Jones <sup>1,2</sup>, Eric Blinman <sup>2</sup>, Lisa Tauxe <sup>1</sup>, J. Royce Cox <sup>2</sup>, Stacey Lengyel <sup>3</sup>, Robert Sternberg <sup>4</sup>, Jeffrey Eighmy <sup>5</sup>, Daniel Wolfman <sup>6</sup>, Robert DuBois<sup>6</sup>

6	<sup>1</sup> Scripps Institution of Oceanography, University of California, San Diego, La Jolla, CA 92093
7	<sup>2</sup> New Mexico Department of Cultural Affairs, Office of Archaeological Studies, Santa Fe, NM, 87507
8	<sup>3</sup> East Tennessee State University, Johnson City, TN, 37614
9	<sup>4</sup> Franklin and Marshall College, Lancaster, PA, 17604
10	<sup>5</sup> Unaffiliated
11	<sup>6</sup> *Posthumously

#### Key Points:

1

2

3 4

5

12

13	•	We digitized 6 decades of legacy archaeodirectional measurements from 3 archives
14		(>51k specimens), adding them to a FAIR repository, MagIC
15	•	The site-level results (reanalyzed using modern statistical conventions) are con-
16		sistent between the archives
17	•	The majority of the data have site provenience in North America and are dated
18		to less than 2000 years old

Corresponding author: Shelby A. Jones, saj012@ucsd.edu

#### 19 Abstract

Beginning in 1964, an academic lineage of Robert DuBois and his students, Daniel Wolf-20 man and Jeffrey Eighmy, developed dedicated United States-based archaeomagnetic re-21 search programs. Collectively, they analyzed over 5377 archaeomagnetic sites, primar-22 ily from North America, dated to less than 2000 years old. Yet despite their decades of 23 effort, few journal publications resulted. Most of their published results are embedded 24 in archaeological reports, often without technical data, which limits the data's accessi-25 bility. Furthermore, when published, the results are generally averaged at the site-level 26 using statistical conventions different from today's standards, limiting the data's com-27 parability and (re)usability. 28

In 2015, we undertook a salvage archival study to digitize the surviving data and metadata from the scientists' individual estates and emeritus collections. We digitized measurement data from more than 51,000 specimens, reinterpreted them using modern conventions, and uploaded them to the FAIR-adhering magnetic data repository – MagIC. The reinterpreted site-level results from the three laboratories are mutually consistent, permitting the individual datasets to be combined and analyzed as single regional entities.

Through incorporation into the MagIC repository, these legacy data are now accessible for incorporation into archaeomagnetic and global magnetic field modeling efforts, critical to understanding Earth's magnetic field variation through time. In the Four Corners region of the United States Southwest, this digitized archive advances the development of a new regional paleosecular variation curve used in archaeomagnetic dating. This project highlights both the value and complexities of managing legacy data; the many lessons learned set a precedent for future paleomagnetic data recovery efforts.

#### <sup>43</sup> Plain Language Summary

Archaeomagnetism is the study of Earth's past magnetic field through researching the magnetic signatures retained in well-dated archaeological materials. The most commonly studied materials are those that have experienced high temperatures due to human-made fires. Due to humans' global occupation, there is a potential for globally distributed archaeomagnetic sampling, which is essential for high resolution global magnetic field models. However, there is considerable variation in the documentation and accessibility of data from certain regions, including North America.

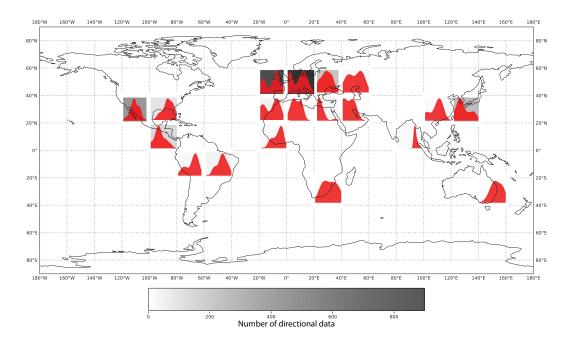
In 2015, a salvage archival project was initiated to recover the life's work of three 51 North American archaeomagnetists. The effort resulted in the digitization and format-52 ting of the data within DuBois' and Wolfman's estates, and Eighmy's archive. In total, 53 measurement data from more than 51,000 specimens, from 5377 archaeological features, 54 were processed and uploaded to a centralized online data repository – MagIC. This repos-55 itory ensures that the data, representing 130 person-years of work, are now findable and 56 accessible, permitting the data to be utilized in future modeling projects. One such reuse 57 of these data is the development of a new regional model for the Four Corners region of 58 the United States Southwest that traces the location of the magnetic north pole through 59 time. 60

#### 61 **1 Introduction**

Archaeomagnetism applies many of the techniques of paleomagnetism to samples of anthropogenic origin. The materials most often studied are those heated by past peoples (hearths, burned floors, pottery, etc.) because the heating and subsequent cooling of the material generally preserves a stable and measurable magnetization. These heated anthropogenic materials hold tremendous potential for contributing to the understanding of variations in Earth's magnetic field over the last several thousand years because
anthropogenic materials often have more precise chronologies than natural rocks or sediments and are spatially and temporally diverse. This is especially true as past humans
had a nearly global distribution (excluding oceans) and their dependence on fire for warmth
and cooking has resulted in an abundance of sites for investigation. Additionally, past
cultures moved about the landscape a moderately slow rate, which means most regions
have the potential to preserve a nearly continuous record of absolute field variations.

Unfortunately, there is considerable variation in the documentation and accessibility of archaeomagnetic records across the world. Published archaeomagnetic records
are primarily clustered in the Northern Hemisphere, specifically Europe. While other areas have been studied, and are being studied, their current contribution to the global databases
is more limited (Figure 1). This lack of uniform coverage limits the resolution of global

<sup>79</sup> field models.

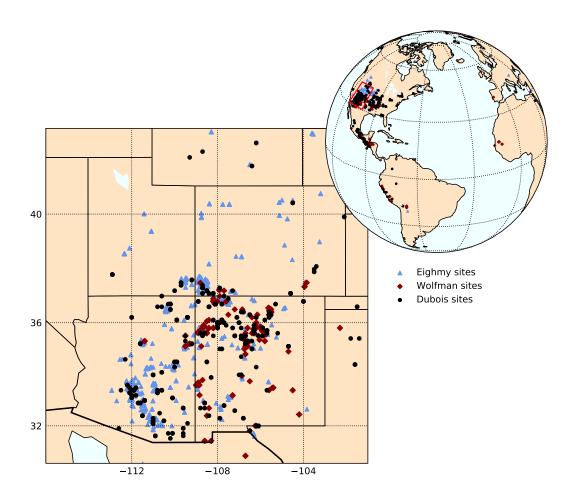


**Figure 1.** Spatial and temporal distribution of archaeomagnetic directional data from the last 2000 years, by provenience (defined in section 3): The shading of each latitude-longitude defined grid depict the number of archaeomagnetic directional results available in the gridded region (volcanic data excluded). The overlaid red histograms represent the temporal distribution of the results, with 2000 years before present on the left and the year 2000 CE on the right. GeoMAGIA data downloaded on 19 Jan 2021 (Brown et al., 2015).

One such under-published area in the global databases is the United States South-80 west. Fortunately, this is not for lack of archaeomagnetic study (Figure 2). Over nearly 81 six decades, starting in the early 1960s, an academic lineage of scientists and archaeol-82 ogists dedicated their careers to the development of a highly robust directional archaeo-83 magnetic record covering the greater Four Corners region of the United States South-84 west (defined here as the four states of New Mexico, Arizona, Utah, and Colorado) and 85 beyond. But in comparison to other global regions, these laboratories' data have seen 86 limited peer-reviewed publication. Only about 10 percent of the site-level data, are avail-87 able in open source paleomagnetic archives, such as GeoMAGIA (Brown et al., 2015) and 88 MagIC (Tauxe et al., 2016). The remaining 90 percent of the data are generally either 89

- <sup>90</sup> unpublished or sparsely published in hard-to-access archaeological reports. Moreover,
- <sup>91</sup> when the data were published, the averaged site-level results were typically not reported
- <sup>92</sup> with specimen or measurement data, limiting their potential for reproducibility and rein-

93 terpretation.



**Figure 2.** Provenience location map of sites sampled for archaeomagnetic direction, by contributor: The red quadrangle on the globe represents the bounds of the inset. The inset map depicts the sampling locations within the four United States states (from the bottom right corner clockwise) New Mexico, Arizona, Utah, and Colorado. This region has the highest sampling density in our dataset and comprises the Four Corners region of the United States Southwest. From the intersection of the four states, in the center of the map, to their farthest corner is about 750 km.

Fortunately, the original directional measurement data for over 5000 archaeomag-94 netic sites (defined here as a single heated feature in an archaeological site, such as a sin-95 gle hearth) are still available in personal collections. In this study, we digitized and re-96 analyzed the measurement data (magnetic declination and inclination data, in the form 97 of Cartesian coordinates measured by a magnetometer) from the previously under-published 98 sites within the Robert DuBois, Daniel Wolfman, and Jeffrey Eighmy-Stacey Lengyel col-99 lections. In the process we submitted the measurement data, along with our new inter-100 pretations, and, where possible, independent chronology estimates to the MagIC database. 101 This is the first step towards the long-term goal of making these invaluable data FAIR 102

principles compliant – Findable, Accessible, Interoperable, and Reusable (Wilkinson et al., 2016).

Bringing these datasets into FAIR compliance is productive for geomagnetism and 105 also for archaeology. One of the original motivations for collecting the data was in or-106 der to develop regional virtual geomagnetic pole (VGP) reference curves of paleosecu-107 lar variation, in order to allow application of directional archaeomagnetic dating. These 108 three principal investigators operated under the assumption that Earth's magnetic field 109 varies through time and the result of this variation is a traceable magnetic north pole 110 path through time (defined as a VGP curve) that can be used as a relative, and in some 111 cases as an absolute, dating technique. With this goal in mind, over decades these in-112 vestigators collected independently-dated archaeodirectional specimens, then used those 113 data to develop their own VGP curves using a subset of the complete dataset and a va-114 riety of curve construction techniques (e.g. Kawai et al., 1965, DuBois, 1989, LaBelle & 115 Eighmy, 1995, Lengyel & Eighmy, 2002, and Hagstrum & Blinman, 2010). This resulted 116 in development of VGP curves with significant discrepancies and has led to incongru-117 ent archaeomagnetically-derived age ranges (Blinman & Cox, 2018). The most striking 118 differences between developed VGP curves is seen in the curves developed for the Four 119 Corners region of the United States Southwest (Figure 3). 120

Recognizing these discrepancies, two of the longest-term goals of this data recovery project are:

- 123 1. Develop a new VGP reference curve for the Four Corners region using modern sta-124 tistical techniques and data from all contributors, and
- To support a web-based platform that is accessible to archaeologists desiring to update previously published archaeomagnetically-derived chronologies.
- But these goals require data to be FAIR principle compliant, making this project critical to the success of these aims.

#### <sup>129</sup> 2 A brief history of archaeomagnetism in the United States

As early as the 1950s, scientists from Europe and Japan began developing archaeo-130 magnetic theory, methods, and applications (e.g. Thellier & Thellier, 1951, Cook & Belshé, 131 1958, Watanabe, 1959, Aitken, 1961, and Burlatskaya & Petrova, 1961) but they were 132 not embraced by North American scientists until the early 1960s. In 1964, geophysicist 133 Robert DuBois began his life-long pursuit of sampling and measuring archaeomagnetic 134 materials. Within a few years, he had amassed a large enough dataset of archaeomag-135 netic data with associated dates, that he began publishing the first VGP models of pa-136 leosecular variation for the Four Corners region (e.g. DuBois & Watanabe, 1965, Watanabe 137 & DuBois, 1965, Weaver, 1967, DuBois, 1989, and DuBois, 2008) and using those regional 138 VGP models to date archaeological sites in the region. Most noteworthy was DuBois' 139 partnership with Emil Haury, who used DuBois' archaeomagnetically-derived dates to 140 confirm his hypothesis about the early irrigation development at the Snaketown site (a 141 pre-Spanish, Mogollon culture site 30 miles or 48 km southeast of Phoenix, Arizona) (Haury, 142 1976:331-333, and Eighmy, 2000:107). This partnership led to the development of the 143 foundational cultural chronology that is still used in the southern Arizona region (Schiffer, 144 1982:327-329, and Deaver, 1998:464-490). 145

By the early 1970s, as a professor at University of Oklahoma, DuBois supported many students, most notably Daniel Wolfman and Jeffrey Eighmy, who later became trailblazers in archaeomagnetism in the United States. Wolfman, an archaeologist by training, helped expand DuBois' range to include Mesoamerica, and the Andean region of South America (specifically Peru). Post-graduation in 1973, Wolfman went on to develop his own archaeomagnetic research program in Arkansas, where he held positions until 1988.

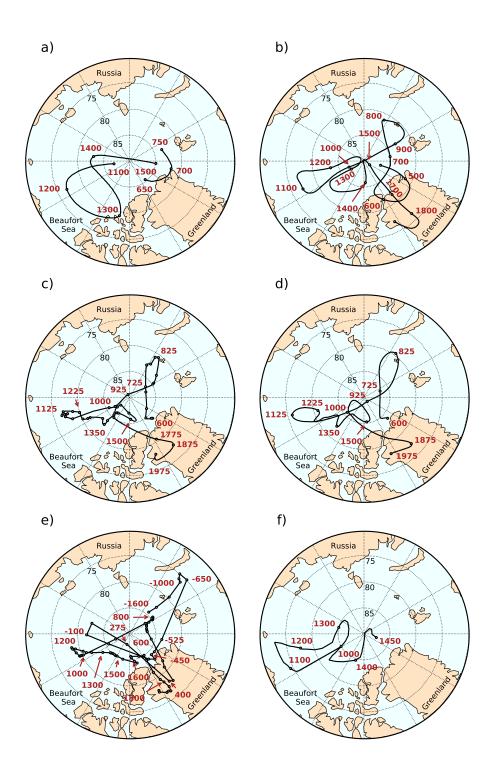


Figure 3. Past VGP reference curves from the Four Corners region: Over the decades, several VGP reference curves have been developed for the Four Corners region of the United States Southwest (not all presented here). a) (Kawai et al., 1965), the first published VGP curve for the region, was never used for archaeomagnetic dating. b) (DuBois, 1989), the first VGP reference curve used for archaeomagnetic dating in the region is hand drawn. c) SWCV 595 (LaBelle & Eighmy, 1995) and d) SWCV2000 (Lengyel & Eighmy, 2002) are computer-calculated movingwindows average derived reference curves. Both have been used by the Eighmy laboratory for archaeomagnetic dating, SWCV2000 replaced SWCV 595 and continues to be applied to dating applications. e) The VGP curve based on the declination-inclination curves published in Hagstrum & Blinman, 2010, computer-calculated using a moving-windows averaging technique, never used for archaeomagnetic dating. f) The uppublished, hand-drawn curve, employed by Wolfman for archaeomagnetic dating. All ages are CE.

With the support of the National Science Foundation, Wolfman partnered with Dodson at the Rock Magnetism Laboratory at UC Santa Barbara (UCSB) in 1982-83. This collaboration resulted in the publishing of their reference work on Peruvian archaeomagnetism (Wolfman & Dodson, 1998). It was during this partnership that contacts were developed between Wolfman and Jeffrey Royce Cox, who later became Wolfman's primary laboratory technician.

In 1988, Wolfman moved from Arkansas to the Office of Archaeological Studies (OAS) 158 in New Mexico where he founded the Archaeomagnetic Dating Laboratory. While Wolf-159 man set up the OAS laboratory, Cox continued to make measurements at UCSB until 160 1993 when he joined Wolfman in New Mexico. Following Wolfman's sudden death in late 161 1994, Cox continued Wolfman's legacy under the supervision of Eric Blinman (then deputy 162 director of OAS). Since then, Cox and Blinman have continued to collect and measure 163 additional archaeomagnetic samples primarily from New Mexico for the purpose of en-164 terprise archaeomagnetic dating. They also worked to increase the precision of field sam-165 pling methods and refine their archaeomagnetic dating procedures. For a more detailed 166 description of Wolfman's work and legacy, see for example Schaafsma & Schaafsma, 1996; 167 Sternberg, 1996, and Eighmy, 2000:105-123). 168

The other notable student of DuBois is Jeffrey Eighmy, also an archaeologist. Eighmy 169 worked as an undergraduate field technician for DuBois in the early 1970s, collecting sam-170 ples from archaeological sites across the United States Midwest and the Southwest (Eighmy, 171 2000:107). Following the completion of his dissertation in 1977, he formed a collabora-172 tion with Robert Butler and Robert Sternberg at the University of Arizona. This multi-173 decade collaboration with Sternberg led to the development of several VGP models of 174 paleosecular variation used primarily for enterprise archaeomagnetic dating aims, the later 175 models are derived from a moving-windows statistical program (e.g. Eighmy et al., 1980, 176 Sternberg, 1982, Hathaway et al., 1983, Sternberg, 1989, Eighmy & Sternberg, 1990, Eighmy, 177 1991, LaBelle & Eighmy, 1997, Lengvel & Eighmy, 2002, and Lengvel, 2010). These mod-178 els confirm the large-scale field movements depicted in DuBois' original VGP models (DuBois 179 & Watanabe, 1965, Watanabe & DuBois, 1965, and DuBois, 1989) but also show small-180 scale variability that has still not been reconciled. That is one of the aims of this data 181 recovery project. 182

In his professorial role, Jeffrey Eighmy trained and worked extensively with Stacey 183 Lengyel, now a faculty member at East Tennessee State University (ETSU). Together they expanded the datasets from Arizona and brought new paleomagnetic perspectives 185 to the conventional archaeomagnetic approach founded by DuBois. After Eighmy's re-186 tirement, Lengyel continued to work in the discipline and founded an archaeomagnetism 187 laboratory at the Illinois State Museum, before moving to ETSU. Of all the dedicated 188 archaeomagnetists in the United States, Lengyel and Eighmy are best known for pub-189 lishing their data in accessible journals. The majority of the archaeomagnetic data in 190 GeoMAGIA (Brown et al., 2015) from the United States is a result of their efforts, of-191 ten in partnership with Sternberg. 192

Through the decades, a few students of primarily DuBois used pottery from the Four Corners region to understand the archaeointensity variation through time. These data were evaluated in Jones et al., 2020.

#### <sup>196</sup> 3 Brief description of terminology used in this paper

The final destination for the data recovered here is the MagIC database, as such this paper's data files are formatted to be consistent with the nomenclature used in the MagIC database (adopted from the paleomagnetism community). This nomenclature is slightly different from the definitions traditionally used by archaeologists (Table 1). The MagIC database understands a site as a heated feature with uniform magnetic proper-

MagIC definition	Geologic example	Archaeodirectional application (this archive)
Geographical location with several different aged sites	Stratigraphic section	Archaeological site
Feature whose magnetic properties and age are expected to be uniform	A single lava flow	Archaeological feature (e.g. hearth)
Piece of material collected from a single site	Multi-centimeter drilled cylinder of lava	Plaster cube encasing burned material
Piece that was measured	Standard 1-inch paleomagnetic core	Subdivisions of the material <sup><math>a</math></sup>
Larger geographic area encompassing multiple locations	Maui Island, Hawaii	Mesa Verde National Park
	Geographical location with several different aged sites Feature whose magnetic properties and age are expected to be uniform Piece of material collected from a single site Piece that was measured Larger geographic area encompassing multiple	Geographical location with several different aged sitesStratigraphic sectionFeature whose magnetic properties and age are expected to be uniformA single lava flowPiece of material collected from a single siteMulti-centimeter drilled cylinder of lavaPiece that was measured Larger geographic area encompassing multipleStandard 1-inch paleomagnetic core

#### Table 1. MagIC Terminology use in this paper

<sup>a</sup> In this study, no original plaster cubes (samples) were subdivided into specimens; as such, the MagIC sample and specimen names are equivalent. For simplicity, in this study, the MagIC sample table reports the interpreted vector direction in geographic coordinates, transformed using the field azimuth and dip. The MagIC specimen table reports the interpreted vector direction in the same coordinate system as the measurements.

ties and a single age (Tauxe et al., 2016). An example of a paleomagnetic site would be a single lava flow. Applied to archaeology, this nomenclature most closely aligns with the archaeological definition of a feature (e.g. hearths). The use of the MagIC definition of site eliminates the potential age ambiguity associated with the archaeological definition of a site, due to generational reuse and reoccupation.

Applying the MagIC definition of site to an archaeological context (e.g., a hearth), 207 promotes an archaeological 'site' to MagIC's definition of a location. In this study, the 208 archaeological site names (MagIC locations) are frequently recorded with alternative names, 209 because United States' archaeological sites are designated by an official alpha-numeric 210 identifier and a common name. For example, the archaeological site in New Mexico known 211 as Lower Arroyo Hondo is also known as LA12. If both names are identified within the 212 metadata of the recovered legacy data, then both are recorded in the MagIC compat-213 ible files. If only one archaeological site name was found within the metadata, it was used 214 as the MagIC location and no alternative name was added by these authors. 215

The MagIC definition of a sample is material collected from a MagIC site. As an 216 analogy with a lava flow, a sample is the multi-centimeter long drilled cylinder. Back in 217 the laboratory, that sample can be subdivided into MagIC specimens, which are mea-218 sured. The sampling custom used in archaeomagnetism in the United States is to col-219 lect multiple cubes of material from a single heated feature (i.e. the MagIC site). In this 220 case, each individual cube is synonymous with the MagIC definition of a sample. Any 221 subdivisions of these sample cubes would be defined as multiple MagIC specimens from 222 the sample. However, it is not the practice of United States-based archaeomagnetists to 223 subdivide the material encased in the plaster sample cubes, as such the collected sam-224 ple is equivalent to the measured specimen. The legacy data recovered in this project 225 and compiled into MagIC compatible data files use a cube's identification number for 226 both the MagIC sample name and the MagIC specimen name. 227

At a larger level, if an archaeological site (MagIC location) is identified in the metadata as being from a specific well-known archaeological location, this was noted in the MagIC compatible column "region" (e.g. Chaco Canyon National Historical Park or Mesa Verde National Park). The use of the "region" column is optional and incompletely used in the project.

All archaeological sites (MagIC locations) are recorded in the MagIC compatible 233 table with a country identifier and, where possible, state/province information. Some 234 of this information was clearly defined within the recovered dataset's metadata, but not 235 always. Where the political boundary information was not defined by the original con-236 tributors, it was identified and included by the authors of this paper. This was completed 237 using the latitudinal and longitudinal data provided and/or the official alpha-numerical 238 archaeological site names, which encode the US state information within the identifier. 239 These political boundary identifiers are critically important to the sorting and analysis 240 of these data by geographic region. The authors of this paper advocate for the inclusion 241 of these information in future archaeomagnetic contributions to MagIC. 242

All the geographical metadata included in this dataset are with respect to the sam-243 ple's provenience (the point of recovery in the archaeological record) (Blinman, 1988: 97). 244 In this project, the site provenance (the geographic point of origin) (Blinman, 1988: 97) 245 and the provenience of a sample are equivalent, since the thermal remanent magnetiza-246 tion (TRM) vector under investigation was imparted in the same location and orienta-247 tion that it was recovered (a requirement of directional paleomagnetic studies). This equiv-248 alence may not hold true for pottery-based archaeointensity studies, since some pottery 249 can be transported great distances from the location of magnetic acquisition (provenance) 250 and the point of archaeological recovery (provenience). 251

#### <sup>252</sup> 4 State of the datasets and methods

Over the course of six years, with the help of a few dedicated undergraduates, the accessible data from the DuBois, Wolfman, and Eighmy-Lengyel datasets were converted into a format compatible with upload into the MagIC database. For the DuBois and half the Wolfman datasets, this involved extensive hand digitization of the measurement data and locational metadata. For the second half of the Wolfman dataset and the Eighmy-Lengyel dataset, this involved detailed reformatting of non-conforming digital formats (early 1990's formatting and a single 2000-page Word document, respectively).

Collectively there were twelve different formats of measurement data, representing nearly 60 years of sampling, measurement, and technology advancements. The locational and chronological metadata were all uniquely formatted, ranging from tables, to hand written notes in margins, to field notes, to personal correspondence, to tagged pages in books and manuscripts. In most cases, citable archaeological reports are not associated with the archaeomagnetic data, but where present those citations were noted.

The DuBois and Wolfman archives are housed at the Office of Archaeological Stud-266 ies (OAS) in New Mexico, USA. These archives are nearly complete repositories of their 267 respective life-work with nearly all samples, field notes, measurement data, metadata, 268 and equipment safely stored within the working facility. This project represents the first comprehensive attempt to digitize these datasets and was conducted in two parts. First, 270 if the records did not have a digital copy, a scan of the original paper records was taken. 271 This permitted the second step of the digitization process (typing/ reformatting the data 272 into a MagIC compatible format) to occur off-site, as well as ensures that a back-up of 273 the primary records exists. An ongoing follow up aim is to create a searchable digital 274 database for these primary scanned records. 275

In the process of organizing the paper records for scanning, it was noted that a not insignificant portion of the DuBois estate documents were stored in sub-par conditions prior to their rescue by OAS staff and volunteers in 2013. These less than ideal conditions resulted in damage from mold and rodents. Fortunately, in general the data destroyed by mold and rodents were usually also duplicated on other printouts, permitting the successful preservation and digitization of those data.

Generally, the Wolfman dataset was in superior condition to the DuBois dataset.
The biggest limitation to digitization of the paper records was the fading ink on some
of the printouts. This led to some difficulties in completely digitizing the accessible dataset.
But thankfully, this did not affect the large majority of the dataset. Further work is needed
to read and digitize the few sites that are currently too faded to read.

The Eighmy dataset was entrusted to Stacey Lengyel. Those datafiles were curated under Lengyel at her archaeomagnetism laboratory associated with the Museum of Illinois, until her relocation to ETSU in 2017. The digital files associated with Eighmy's dataset were provided by Lengyel for this project, those files are complete to 2004.

#### <sup>291</sup> 5 Context and chronology

The locational and chronological metadata for the DuBois dataset were derived from 292 DuBois, 2008, a catalog compiled by DuBois but published after his death. The data were 293 included "as is" and were not verified for accuracy. In the decade since its publication, 294 a few inaccuracies have been noted. For the sake of consistency, any edits were not in-295 cluded unless the inaccuracy was an egregious error in the latitude and longitude reported. 296 These few locational errors were generally longitudinal hemisphere errors, since the con-297 vention used in DuBois, 2008 was -180° to 180°. Occasionally, a similar hemispherical 298 error was discovered in the latitudinal data and corrected. In a few cases, typos in the 299 longitudinal value resulted in sites from the continental United States plotting in the wrong 300 location (i.e. in the ocean or in an incorrect state), these were also corrected. All cor-301 rections were easily made because in most cases multiple sets of specimen cubes were collected from the same archaeological sites (i.e. multiple fire pits from one larger archae-303 ological site), so the correct latitude and longitude were borrowed from those data. 304

A note on the chronological metadata of the DuBois dataset presented here and 305 in DuBois, 2008: For the most part, the ages reported are age estimations recorded by 306 DuBois at the time of sample collection. These dates were rarely updated when the of-307 ficial archaeological reports were published, or as additional information was acquired 308 during subsequent excavation. The exception to this norm, is the chronology data com-309 piled by archaeologist Tom Windes for the specimens collected from the Chaco Canyon 310 National Historical Park (U.S. National Park Service). Windes compiled detailed chronolo-311 gies and reviewed the metadata for each heated feature that DuBois sampled for archaeo-312 magnetism. These detailed and cited information are included in the description column 313 of the MagIC formatted file. 314

Due to DuBois' convention of asking for an age estimate at the time of collection 315 and recording that age on his field records, nearly all the data from the DuBois estate 316 are associated with an age estimate. In general, these age estimates are usually quite ac-317 curate because the chronology of the United States Southwest is well understood. The 318 quantity and quality of archaeology conducted over the last century in this region, paired 319 with the large amount of datable materials and features (organic material preserved by 320 the dry climate, pottery variation, and architecture variation) allow for accurate in-field 321 age estimations to within a few dozen years. This is a unique attribute of United States' 322 Southwest archaeology. A detailed reassessment of the chronology is planned as part of 323 the long-term aims of this project, but that reassessment is likely to improve the pre-324 cision of the original estimates, rather than significantly change the age. 325

In constrast to DuBois' nearly complete age record, Wolfman and Eighmy have a significantly lower percentage of archaeomagnetic samples with associated ages. But in general, their reported chronologies are more precise than DuBois' and are usually as sociated with citable archaeological reports.

The Wolfman metadata were compiled from paper documents into a Microsoft Access database (by a volunteer in the early 2010s) with referencing to project names, archaeological site names, archaeologists, and cited reports. Each archaeological feature sampled for archaeomagnetism had varying levels of completeness in their metadata, ranging from very detailed to almost no information.

The chronological data for the Eighmy dataset was accessed from the Colorado State 335 University Archaeometric Lab Technical Series (CSU Technical Series) (Eighmy et al., 336 1987; Eighmy & McGuire, 1989; Eighmy & Klein, 1988, 1990; LaBelle & Eighmy, 1995; 337 Premo & Eighmy, 1997). These volumes include the age for each sampled archaeolog-338 ical feature that Eighmy, Lengyel, Sternberg and associates used in their regional pale-339 osecular VGP models (e.g. Eighmy, 1991, LaBelle & Eighmy, 1997, Lengyel & Eighmy, 340 2002, and Lengyel, 2010), but do not always cite the archaeological report that quali-341 fies those chronologies. 342

#### <sup>343</sup> 6 Formatting challenges, creating master file, merging the datasets

Following the digitization, the three datasets were independently reformated into 344 MagIC compatible files to ensure that the idiosyncrasies of each dataset could be addressed 345 completely. Since the DuBois dataset was completely hand-digitized, the formatting id-346 iosyncrasies were limited but still numerous because the DuBois datasets had several unique 347 data formats, nine of the twelve formats worked with in this project. In many cases, there 348 was ambiguity in the units of the measured moments as well as the order of magnitude 349 of the measured magnetic moment. As such, all the DuBois moments have been clas-350 sified as "uncalibrated moments", which is consistent with the MagIC column conven-351 tions. Future, very detailed and time-consuming work, may be able to reconcile the unit 352 ambiguity for a few of the nine formats, but it is unlikely that a complete reconciliation 353 will be possible. 354

The Wolfman database was stored in two formats. About half the accessible data 355 were stored in a 1990s era digital format with two files for each archaeomagnetic site: 356 a file with the basic locational metadata and a second file with the measured magneti-357 zations. The other half of the data were stored in printouts; these were hand-digitized. 358 Similar to the DuBois dataset, there was ambiguity in the units of the measured moments 359 and order of magnitude; as such the moments in the MagIC compatible format are also 360 classified as "uncalibrated moments". Future work will be required to address this chal-361 lenge. Additionally, there were significant difficulties with referencing the magnetic data 362 to the chronological and locational metadata. These metadata were stored within a Mi-363 crosoft Access database in a format that was not easily exportable into a single column 364 delimited file (like a Microsoft Excel file). The result was multiple exported files that were 365 inconsistently referenceable, limiting the ability to easily merge the metadata together 366 and then merge it with the magnetic data. 367

The Eighmy database had far more idiosyncrasies than the DuBois and Wolfman 368 datasets. This has been attributed to the file format that the data were preserved in: a 369 Microsoft Word document. The file had all the magnetic data and basic locational in-370 formation but had many typos and was inconsistently delimitated. Transferring the data 371 from the Word document to a delimited format that could be converted into a MagIC 372 compatible file required the development of a short python script to search line-by-line 373 for specific string patterns and characters. This python script worked remarkably well 374 but not completely. Accuracy verification was done visually and was corrected by hand. 375 The most common challenges were typos related to the demagnetization step. The orig-376 inal program that stored the data had a maximum number of characters permitted in 377

the specimen name and demagnetization step columns. This resulted in demagnetiza-378 tion steps 50 Oe, 100 Oe, 150 Oe, 175 Oe, etc. being recorded as 50, 10, 15, and 17 re-379 spectively. It also led to demagnetization step 100 Oe and 1000 Oe both being recorded 380 as 10. These corrections were easily edited by hand because the data were organized by 381 increasing demagnetization level and the set of demagnetization steps used was regular. 382 All demagnetization steps have been converted to tesla, for compatibility with the MagIC 383 database. Another common challenge was typos in the specimen or site name that made 384 referencing for principle component analysis and fisher mean site-level averaging diffi-385 cult. These typos were also corrected by hand. Where appropriate, all edits were noted 386 in the description column of MagIC compatible file. For consistency with Dubois and 387 Wolfman datasets, the reported magnetic moments are labeled as "uncalibrated moments". 388 It is likely that the units for these moments can be verified with moderate ease in the 389 future. 390

The biggest challenge with the Eighmy dataset was merging the chronology data from the CSU Technical Series publications with the magnetic data. The chronological data presented in the CSU Technical Series publications are associated with an archaeomagnetic sample's DVPG number rather than the archaeomagnetism laboratory specimen number. In most cases, an association between the two numbers was possible to determine, but not always. Where the association was possible, the DVGP number is recorded in the "alternative sample name" column of the MagIC compatible file.

#### <sup>398</sup> 7 Data Processing

After the three datasets were compiled into their respective MagIC compatible files, 399 the datasets were filtered for quality (Table 2) and visualized independently using the 400 plotting scripts within the PmagPy software package (Tauxe et al., 2016). After plot-401 ting the sample data that passed the acceptance criteria (Figure 4), it was noted that 402 each dataset had idiosyncrasies resulting in sample vector locations that were improb-403 able, as every site sampled is less than a few thousand years old (i.e., during the current 404 normal polarity field state). For example, the Dubois and Wolfman datasets (Figure 4a 405 and c) showed clusters of data, not only in the direction of the expected field (green dots) 406 but also to the east (blue), south (magenta) and west (yellow). As no excursions have 407 been reported for the last few thousand years, the unexpected directions are likely the 408 result of misunderstandings in the orientations of the sample cubes. 409

**Table 2.** Acceptance criteria: All the data digitized as a result of this project were reinterpreted using modern statistical conventions and subject to a set of acceptance criteria threshold to determine the highest quality sample vectors and site averages. Criteria described in (Paterson et al., 2014).

Criteria Group	Statistic	Threshold
Specimen/sample criteria	N <sub>measurements</sub> DANG MAD	$\leq 5$
Site criteria		$ \begin{array}{l} \geq 3 \\ \geq 100 \\ \leq 5 \end{array} $

To adjust for the evident idiosyncrasies within the datasets, the data from each collector's datasets were analyzed independently and by region. The regions were very broadly defined as data from the United States, from Mexico and Central America, and from South

America. These divisions were required to limit the latitudinal dependence of inclina-413 tion within the datasets that would add ambiguity to the cluster analyses used in clas-414 sifying the data that required adjustment. Any data from regions not defined above, were 415 not evaluated for adjustment, due to the low number of records. Mathematical cluster-416 ing using functions within the OPTICS function in the sklearn.cluster python module 417 (Pedregosa et al., 2011) were used to identify the data that required systematic adjust-418 ment. These functions helped eliminate the subjectivity of human bias, while allowing 419 for the expected variability in magnetic direction due to the paleosecular variation over 420 the last several thousand years. A discussion of parameters used is included in the sup-421 plemental information and a sample python Jupyter Notebook is provided (see Acknowl-422 edgments for the link). 423

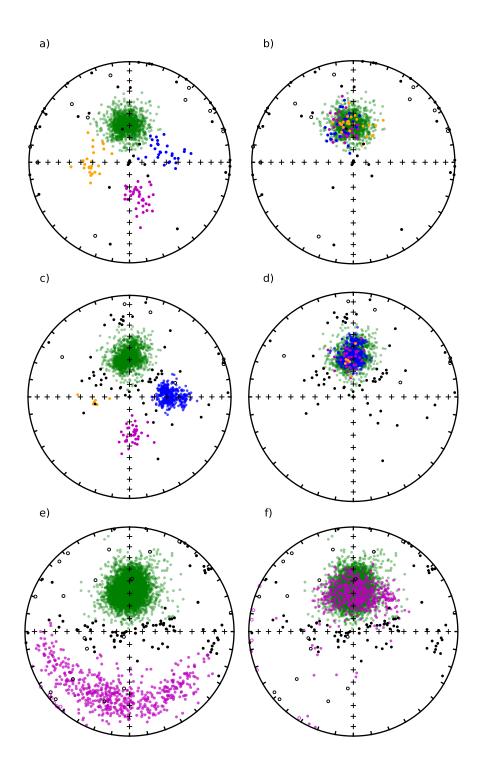
The DuBois and Wolfman datasets required very similar adjustments of  $90^{\circ}$ ,  $180^{\circ}$ , 424 or  $270^{\circ}$  in the measured field azimuth. The prevalence of this inaccuracy is likely the re-425 sult of the collection protocol used by both these contributors. Their convention was to 426 collect heated anthropogenic material encased in plaster cubes, level the top surface of 427 the cube (i.e. a dip of zero degrees), and then measure the azimuth with respect to a ref-428 erence corner marked on the top of the cube. The clustering analysis indicates that there 429 are a non-negligible number of sample cubes with azimuth directions measured along an 430 incorrect side of the cube, resulting in the prevalence of magnetic vector directions that 431 are  $90^{\circ}$ ,  $180^{\circ}$ , of  $270^{\circ}$  off the expected northerly direction for this recent time period (Fig-432 ure 4a and c). 433

The cluster analysis was used to classify each of the sample directions into five clus-434 ters (expected northerly direction, 90 degrees east of north, 180 degrees from north, 90 435 west of north, and unable to cluster). For the Dubois and Wolfman USA data, this clus-436 tering was completed in two steps, due to the overwhelming prevalence of northerly di-437 rections. The first clustering code isolated out the northerly directions, while the sec-438 ond code clustered the remaining non-north data into their respective clusters. Then the 439 data were merged back together and the required 90, 180, or 270 degree azimuth adjust-440 ment was applied (Figure 4b and d). 441

The Eighmy dataset required a different adjustment, the dataset does not exhibit 442 the same prevalence of 90, 180, and 270-degree clusters. It is unclear if this distinct lack 443 of 90-degree inaccuracies is a result of corrections applied prior to the dataset's submis-444 sion to this project or if the collection procedure used by the Eighmy laboratory con-445 tributed to this notable decrease. Eighmy also collected archaeomagnetic material us-446 ing the plaster cube convention, but instead of measuring the field azimuth with respect 447 to a reference corner like DuBois and Wolfman, his convention was to measure the az-448 imuth with respect to an arrow parallel to a chosen side of the cube. 449

The pre-adjustment Eighmy sample data exhibit a southern hemisphere spread of positive directions, with shallower inclinations than predicted by the geocentric axial dipole (GAD) equation (Figure 4e). This behavior is not consistent with an inaccuracy in the field azimuth reading, as was seen in the Wolfman and DuBois datasets. But the shallowed inclination is consistent with an inaccuracy in the dip reading (recording 0 instead of 90, or visa versa) in addition to an non-90-degree inaccuracy in the field azimuth.

Visual interpretation of the specimen data (i.e. the vector data in specimen coor-456 dinates – not transformed into geographic coordinates) yielded a cluster of data with the 457 expected inclination and northerly declination. Through comparing the specimen data 458 and the geographically transformed sample data, it was noted that the cube identifica-459 tion numbers were the same between the southern hemisphere spread with shallow pos-460 itive inclination in the sample data and the northerly cluster in the specimen data. This 461 suggests that the measurement data received for these cubes were provided in geographic 462 coordinates rather than the expected specimen coordinates. To correct for this incon-463 sistency, mathematical clustering was used identify and isolate the cubes that required 464



**Figure 4.** Stereonets of accepted samples, by contributor, pre- and post- adjustment: Inconsistencies in data collection and management through time resulted in idiosyncrasies within each of the three archives (shown here the US-based data). a) DuBois directions original. b) Dubois after adjustment. c) Wolfman original. d) Wolfman after adjustment. e) Eighmy original. f) Eighmy after adjustment. The clusters of data oriented East, South, and West in the DuBois and Wolfman datasets (a,c) are attributed to reading the field azimuth along the incorrect side of the sample cube. Applying an adjustment of either 90°, 180°, or 270° to the originally noted field azimuth yields adjusted directions for Dubois and Wolfman (b,d). The swath of south and down directions in the Eighmy dataset (e) is attributed to that subset of data already transformed into geographic coordinates, when provided to these authors. Ensuring those data are not doubly transformed into geographic coordinates, results<sub>1</sub>the adjusted Eighmy dataset (f).

adjustment (those in the southern spread). In the MagIC compatible specimen table,
 those cubes were identified to be in geographic coordinates, and the vector direction was
 copied into the MagIC compatible sample table (Figure 4f).

#### 8 Site-Level Results

468

After the required sample-level adjustments, Fisher means (Fisher, 1953) were calculated for each site using the pmag.fisher\_mean function within the PmagPy package. Only samples that satisfied the acceptance criteria were included in the site-level average (Table 2). These site-level averages were filtered for quality using the acceptance criteria in Table 2 then by regional location.

The application of the selection criteria filtered the data significantly (Table 3), es-474 pecially the number of acceptable sites from the DuBois' dataset. The percentage of DuBois' 475 sites that passed this study's selection criteria is extremely low (3.3%). This low percent-476 age is attributed to the laboratory methodologies used by DuBois through the decades, 477 which were customary at the time. DuBois' convention was to measure a "pilot group" 478 of specimen cubes from a site through a multi-step demagnetization protocol, this pi-479 lot group usually consisted of only one to three cubes. The remaining cubes collected 480 from the site were usually only measured at NRM and the "optimum" demagnetization 481 step, identified from the pilot group study, typically 150 Oe (15 mT). A side effect of this 482 laboratory convention is that the vast majority of DuBois' specimen cubes have only two 483 demagnetization steps, which results in a significant number of them failing the spec-484 imen acceptance criteria. Additionally, due to the low number of cubes measured as part 485 of the pilot group, many sites failed to meet the site-level criteria which require at least 486 three samples. Later in life, DuBois changed his laboratory conventions slightly to increase the number of cubes within his pilot group, this change results in a higher per-488 centage of DuBois' later studies to successfully pass our acceptance criteria. Fortunately, 489 nearly all of DuBois' original specimen cubes still exist in storage at OAS, so additional 490 steps could be measured and the percentage of sites that pass this paper's acceptance 491 criteria has to potential to increase. 492

Category	Contributor	Number
Samples Total = $51,166$ (16,079 accepted)	DuBois Wolfman Eighmy	$\begin{array}{c} 15,312 \ (1,903 \ \text{accepted}) \\ 29,662 \ (10,673 \ \text{accepted}) \\ 6,192 \ (3,503 \ \text{accepted}) \end{array}$
Sites (e.g. archaeological features) Total = $5,377$ (1,183 accepted)	DuBois Wolfman Eighmy	1,991 (67 accepted) 778 (331 accepted) 2,608 (785 accepted)
Locations (e.g. archaeological sites) Total = $1,185$	DuBois Wolfman Eighmy	497 157 531

Table 3. Number of samples, sites, and locations - by contributor

#### <sup>493</sup> 9 Results from the Four Corners region

One of the motivations for initiating this project, in addition to archiving these valuable datasets into FAIR compliant database, was to use the composite dataset to develop a model that reconciles the differences between the commonly used models of the Four
Corners region of the United States Southwest. Historically, the different scientists used

primarily their own laboratory's data in the production of their VGP curves, separate
from the data of the other contributors. Because the data, up to now, were not publicly
available, it has not been possible to develop a regional model of paleosecular variation,
using the composite datasets of DuBois, Wolfman, and Eighmy.

The aim of producing a composite regional model requires the chronology information to be reported with the magnetic vector information collected by the contributors. Filtering for sites that have reported chronology eliminates a significant number of sites from all three contributor's datasets. The quality of the age reported was not used as a filter, and the chronology reported was not updated (as described in Section 5).

In the Four Corners region, a combined 3920 archaeological features were sampled 508 for archaeomagnetism. Of these, 422 have reported ages and 223 passed the selection cri-509 teria (Table 4). Plotted against age, these data show a clear trend in declination and in-510 clination over the last 1500 years (Figure 5a and b). The data are plotted by contrib-511 utor, with the accepted archaeomagnetic sites noted as solid symbols and all the data 512 with ages noted as open symbols. Superimposed on these data is a degree-10 polynomial 513 fit calculated using functions within the python Seaborn module. The uncertainty bounds 514 are defined through a Monte Carlo style resampling with 1000 iterations. 515

Region	Contributor	Sites	Sites with ages	Accepted Sites with ages
Four Corners	DuBois	1050	71	22
	Wolfman	486	229	114
	Eighmy	2384	122	87
Lower Mississippi	DuBois	287	17	3
River	Wolfman	33	5	4
	Eighmy	63	0	0
Mesoamerica	DuBois	251	18	10
	Wolfman	117	29	14
	Eighmy	8	0	0
Northern Mexico	DuBois	3	1	0
	Wolfman	14	7	7
	Eighmy	7	0	0
South America	DuBois	56	9	4
	Wolfman	37	5	2
	Eighmy	0	0	0

Table 4.Summary of the number of archaeomagnetic sites within the datasets bycontributor and region

The declination and inclination data modeled by the polynomial fit and its respec-516 tive uncertainty bounds, is based on the sub-portion of the dataset that satisfies the fil-517 ter of  $\alpha_{95} \leq 4$ , paired with eleven predictions from the GUFM paleosecular variation 518 model equally spaced between 1700 CE and 1950 CE (Jackson et al., 2000). The latter 519 are denoted as black plus-signs. The addition of the GUFM predictions constrain the 520 polynomial fit model in the historic time period, during which there is a low density of 521 archaeomagnetic records. We chose 1700 CE as the minimum extent of the GUFM pre-522 dictions used in these models because in the land-locked Four Corners region of the United 523 States few historical records prior to 1700 CE were included in the development of GUFM, 524 limiting the precision of the predictions for the region during the  $17^{th}$  century. 525

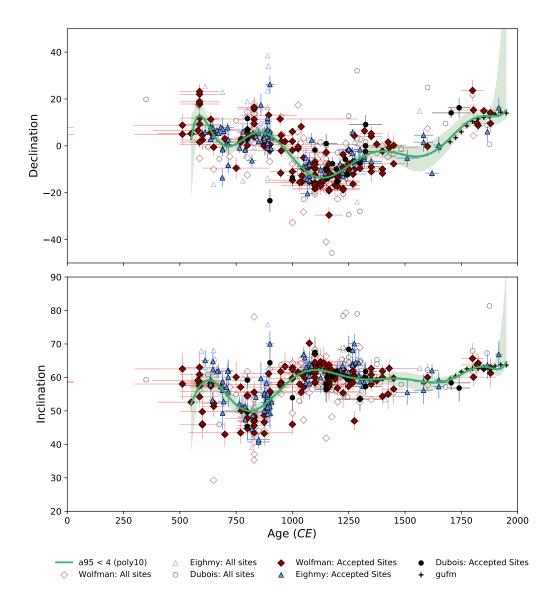
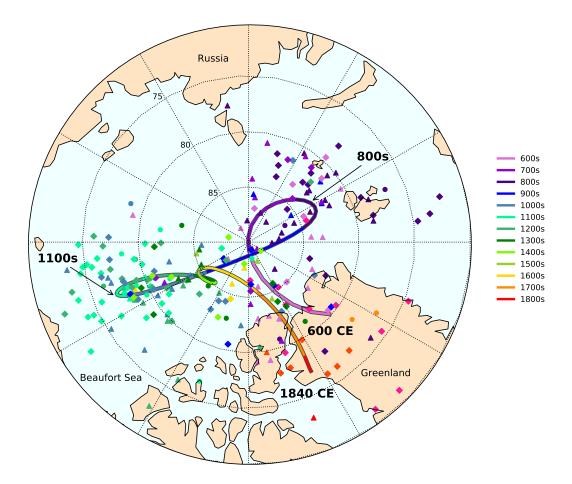


Figure 5. Magnetic declination and inclination of sites from the Four Corners region with respect to time: The data are plotted by contributor. Sites that do not meet our acceptance criteria but have ages are represented as open symbols. The accepted archaeomagnetic sites are denoted as solid symbols. Superimposed on the data is a degree-10 polynomial model fit based on the subset of data that satisfy a filter of  $\alpha_{95} \leq 4$ . The uncertainty bounds of the fit are defined by a Monte Carlo style bootstrapping of 1000 iterations. The black plus-signs are field values predicted by GUFM (Jackson et al., 2000) to constrain the polynomial fit during the most recent centuries that have limited data density.

In addition to modeling the data with a polynomial fit based on the subset of data that satisfy  $\alpha_{95} \leq 4$ , three other fits were explored (all the data with age constraints, the data that passed this paper's acceptance criteria, and  $\alpha_{95} \leq 3$ ). Analysis of the four polynomial fit models resulted in the decision to select the curve derived from the subset of data that meet the  $\alpha_{95} \leq 4$ . A discussion is included in the supplemental information.

Using the python function get\_children, one hundred declination and inclination pairs of data were retrieved from the polynomial fit derived from the subset of data with  $\alpha_{95} \leq 4$ . These data pairs were evenly distributed between the ages 550 CE and 1950 CE. A central latitude and longitude defined as 36°N, 108°W was used in the conversion of the modeled fit to VGP coordinates (Figure 6). Prior to plotting, the modeled curve was truncated to between 600 CE and 1840 CE to limit the any potential inaccuracies at the margins of the polynomial fit model caused by a lack of data.



**Figure 6.** Newly interpreted Four Corners regional VGP curve, superimposed on the accepted sites by contributor and colored by age: The overlaid VGP curve is based on the accepted sites from the composite dataset that have age chronology recorded in the metadata. The curve is transformed from a degree-10 polynomial fit model of regional declination and inclination. The data and curve are are colored by century between 600-1900 CE. Circle symbols represent data derived from the DuBois estate. Diamond symbols represent Wolfman data and triangle symbols represent Eighmy data.

The model shown in Figure 6 is the first VGP curve developed from a composite 539 dataset with significant contributions from DuBois, Wolfman, and Eighmy. On first or-540 der, this new polynomial-derived curve corroborates the pattern of VGP motion depicted 541 in the regional curves presented by the three individual datasets (Figure 3b-d and f). The 542 characteristic clockwise loop at roughly 800 CE, followed by a rapid movement towards 543 Alaska and the Pacific Ocean between 900 and 1100 CE, is seen in all curves, including 544 ours. Additionally, the clockwise loop at roughly 1200 CE is consistent with the previ-545 ously presented curves, as is the trend towards Greenland post 1600 CE. 546

547 There are stark differences between this new polynomial-derived VGP curve and the previous curves, however. Most notably, the amplitude of the loops is significantly 548 decreased in this new model compared to past curves. Additionally, the paleosecular vari-549 ation seen between 1200 CE and 1600 CE is inconsistent among all curves. We attribute 550 these differences to variations in the methods used in curve construction. This is an im-551 portant issue to reconcile, as the various curves have been and continue to be used as 552 reference VGP curves for enterprise archaeomagnetic dating. A statistically more robust 553 model with uncertainty bounds is required to further this aim; this work is ongoing. 554

# Results from the regions of Mesoamerica, South America, and the Lower Mississippi River

In addition to the significant volume of work conducted in the Four Corners region of the United States Southwest, a large amount of work was also conducted by DuBois and Wolfman in other regions of the Western Hemisphere. Specifically, their work targeted Mesoamerica, and, to a slightly lesser degree, the Lower Mississippi River region of the United States. There are also data from the greater Peruvian region of South America and northern Mexico in the archives.

The Lower Mississippi River region, formally replacing Wolfman's use "Southeast" 563 or "Arkansas and the border areas", is defined by the roughly 650-km radius between 564 Memphis, Tennessee and New Orleans, Louisiana. This newly defined Lower Mississippi 565 River region includes the states of Louisiana, Mississippi, Alabama, Tennessee, Kentucky, 566 Missouri, and Arkansas, and portions of southern Indiana, southern Illinois, and east-567 ern Texas (to roughly the city of Dallas). Within this region, DuBois sampled material 568 from 287 burned features, Wolfman sampled 33 features, and Eighmy sampled 63. Of 569 these only twenty-two have independent age chronology, and seven passed this paper's 570 acceptance criteria (Table 4). 571

Analysis of the data from Mexico and Central America required an additional di-572 vision between northern Mexico and Mesoamerica. A latitude of 25°N was chosen as a 573 threshold, which is consistent with the climatic variation that influenced the cultural trends 574 of the indigenous populations. This division is important for analysis because of the lat-575 itudinal dependence of inclination. The few archaeomagnetic sites sampled in northern 576 Mexico (24 sites) are culturally similar to the indigenous populations of southern New 577 Mexico and Arizona and may be in close enough proximity they could be included in the 578 Four Corners regional dataset for future modeling purposes. In total, samples were col-579 lected from 400 archaeomagnetic sites in Mexico and Central America; of those only 55 580 have reported ages, of which 31 satisfied the acceptance criteria (Table 4). 581

The fewest number of sites were collected from South America, with a total of 96 archaeomagnetic sites. Of these, DuBois collected the majority of the data (56 sites), and Wolfman in partnership with Dodson sampled 37 archaeomagnetic sites. Only 14 sites have independently dated age constraints and of those only six passed the acceptance criteria (Table 4).

The low quantities of accepted archaeomagnetic sites from these regions, complete with independent chronology, limit our ability to corroborate the previously developed models from these areas (Lower Mississippi River region - Wolfman, 1982, reproduced
in Wolfman, 1990a:250-251; Mesoamerica - Wolfman, 1973:179,238,244,247 and Wolfman,
1990b:287; Peruvian - Dodson & Wolfman, 1983, Wolfman & Dodson, 1986, and Wolfman
& Dodson, 1998). Reproductions of these previously published curves are available upon
request. The recovered magnetic vector data for each region are plotted against age are
available in the supplemental information.

#### <sup>595</sup> 11 Conclusions and Future Goals

The datasets compiled as a result of this multi-year recovery and digitization project contribute previously unpublished measurement data for 51,166 archaeomagnetic specimens from 5377 heated archaeological features. Of these, 1183 reinterpreted archaeomagnetic sites have been accepted by our selection criteria. At present, only 283 archaeomagnetic sites are recorded with independent age constraints, and 239 of the dated sites come from the Four Corners region of the United States Southwest.

Future work on these datasets aims increase the proportion of data that satisfy this paper's selection criteria, while also improving the accuracy and precision of the independent chronologies. These improvements are possible through continued demagnetization of the archived specimens, further analysis of existing demagnetization data, and recovering additional metadata for the archaeological features that currently have limited archaeological details.

The value of verification and refinement of the archaeological chronologies is high-608 lighted in Figure 6, where occasional VGP pole positions are incongruent with the ex-609 pected positions based on its assigned ages. Although the vast majority of independent 610 ages appear to be accurate, ages were assigned beginning in the early 1960s. Archaeo-611 logical dating tools and models have improved over the decades, and reassessment can 612 correct errors and improve the accuracy and precision of the age assignments, while main-613 taining the independence and integrity of the geomagnetic data. Verifying and refining 614 the chronology of these archaeological features that have incongruent VGP pole posi-615 tion and a history of site reoccupation is an ongoing project. 616

Additionally, just over 2000 archaeological features (MagIC sites) from the dataset 617 have been targeted for continued research (Table 5). These archaeological features have 618 been targeted because they either passed this paper's acceptance criteria but were not 619 paired with an independent age date (878 features), or they have an independent age date 620 and at least eight cubes were collected from the feature but did not pass this paper's se-621 lection criteria (1138 features). The majority of the later group are features within the 622 DuBois archive, nearly 890, and the result of DuBois' use of a "pilot group" protocol for 623 demagnetization. Fortunately, the sample cubes for these archaeological features are ac-624 cessible for further demagnetization and measurement. With effort, the inclusion of these 625 additional data will greatly enhance the spatial diversity of accepted data and has the 626 potential to aid in the development of additional regional VGP reference curves (Fig-627 ure 7). 628

And finally, over the years, there have been a number of additional scientists, primarily archaeologists, that have contributed to and are contributing to the archaeomagnetic record of the United States. Identifying all the collaborators and finding their data has proved to be a challenge. Their contributions are not presented in this paper, as that work is ongoing.

The effort directed at documenting these existing records is critically important because one of the unique aspects of this archive is that nearly all of the samples were collected from archaeological features that either no longer exist or are no longer accessible. Most United States-based archaeology today occurs when features are set to be destroyed by construction development projects and archaeology tends to be inherently

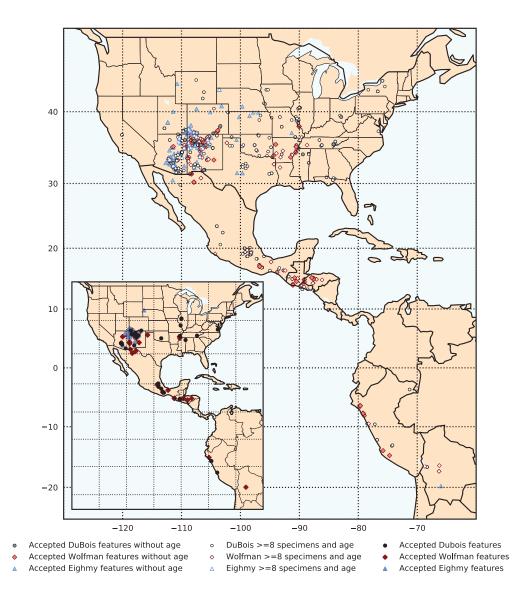


Figure 7. Provenience location map for sites targeted for future study, by contributor: The solid symbols on the inset map depicts the 283 site locations that do satisfy this paper's criteria (Table 4). The 878 faded-solid symbols do not satisfy this paper's criteria because an independent chronology is not paired with the accepted magnetic data (Table 5). The 1138 white-filled symbols do not currently meet this paper's acceptance criteria but have at least eight sample cubes available for reanalysis or continued measurement (Table 5). The circle symbols represent data derived from the DuBois estate. Diamond symbols represent Wolfman data and the triangle symbols represent Eighmy data.

Category	Contributor	Number
Have independent chronology	DuBois	890
and at least eight sample cubes	Wolfman	169
Total = 1138	Eighmy	79
Accepted quality of magnetism but	DuBois	22
requires an independent chronology	Wolfman	159
Total = $878$	Eighmy	697

Table 5. Number of sites targeted for further study - by contributor

destructive. In either case, the physical specimens within these archives are often the only
 surviving components of the archaeological and archaeomagnetic record.

These data represent the legacy of nearly 130 person-years of collective archaeomagnetic sampling and measurement, by DuBois, Wolfman, and Eighmy. This archive will serve as the foundation for continued archaeomagnetic research in North America and will enhance global magnetic field modeling efforts for decades to come. The data span a temporal and spatial completeness that is unprecedented in North America. Such high quality, temporally diverse, and globally distributed data are required for accurate time-varying global magnetic field models.

#### 648 Acknowledgments

This work was supported in part by NSF grants EAR1547263 and EAR1827263 to LT, 649 a private donation from Robert Rex for the support of undergraduate help, and private 650 donations to the Museum of New Mexico Foundation's Friends of Archaeology, a non-651 profit that funded the physical collection of the DuBois scientific estate. Recovery of the 652 DuBois and Wolfman datasets would not have been possible without the incredible as-653 sistance from Tom Windes, Gary Hein, and Arielle Thibeault. Their efforts were instru-654 mental to the acquisition and digitization of the datasets. We gratefully acknowledge help-655 ful conversations with Catherine Constable, Nicholas Jarboe, Jeffrey Gee, Maxwell Brown, 656 and many more. We wish to acknowledge the reviewers (Catherine Batt and one anony-657 mous) and the Associate Editor (Adrian Muxworthy) for their helpful comments, which 658 improved the manuscript. 659

Author contributions: SAJ initially compiled the physical datasets and digital archives, 660 carried out the analyses, produced the figures, wrote the manuscript. EB provided ac-661 cess to the Wolfman and DuBois estates, provided archaeological context, and assisted 662 in writing the manuscript. LT obtained funding for and helped design the project, as-663 sisted in the digital reformatting and figure production, and assisted in writing the manuscript. 664 JRC manages the Wolfman scientific estate and helped collect and measure samples within 665 the Wolfman archive. SL provided access to the Eighmy dataset, helped collect and mea-666 sure samples within the Eighmy archive. RS instrumental in discussions by providing 667 historical context, and helped collect and measure samples within the Eighmy archive. 668 JE provided access to his unpublished data and edited the manuscript. DW collected 669 and measured samples within his archive, proposing several initial VGP curves. RD col-670 lected and measured samples within his archive, proposing several initial VGP curves. 671

The data presented in this paper will be available at https://earthref.org/Magic/17115 upon publication of this article. For the purposes of review the data are available here: https://earthref.org/MagIC/17115/194b1e5c-27bc-41e4-bf53-c5f8bae5dd5f An example Python code used in the clustering and adjustment of the systemic field azimuths is available here: https://earthref.org/ERDA/2478/

#### 677 **References**

689

702

703

704

- Aitken, M. J. (1961). Measurement of the magnetic anomaly. Archaeometry, 4, 28-30.
- Blinman, E. (1988). The interpretation of ceramic variability: A case study from the
   dolores anasazi (Unpublished doctoral dissertation). Washington State University, Pulman, Washington.
- Blinman, E., & Cox, J. R. (2018). Theory, technique, and circularity: Time for
   renewal in southwestern archaeomagnetic dating. presented at southwest symposium, denver museum of nature and science. Denver, Colorado.
- Brown, M. C., Donadini, F., Korte, M., Nilsson, A., Korhonen, K., Lodge, A., ...
  Constable, C. G. (2015). GEOMAGIA50.v3: 1. general structure and modifications to the archeological and volcanic database. *Earth, Planets and Space*,

67(1), 1-31. doi: doi.org/10.1186/s40623-015-0232-0

- Burlatskaya, S., & Petrova, G. (1961). First results of a study of the geomagnetic
   field in the past by the "archaeomagnetic" method. *Geomagnetism and Aeron- omy*, 1, 233-236.
- Cook, R., & Belshé, J. (1958). Archaeomagnetism: A preliminary report from
   britain. Antiquity, 32, 167-178.
- Deaver, W. L. (1998). Chronological issues of the lvap. In S. M. Whittlesey,
   R. Ciolek-Torrello, & J. H. Altschul (Eds.), Vanishing river: Landscapes and
   *lives of the lower verde valley, the lower verde archaeological project* (p. 447 490). Tucson, Arizona: SRI Press.
- Dodson, R. E., & Wolfman, D. (1983). Los resultados arqueomagneticos de las mues tras recogidas en el peru en 1982 (Tech. Rep.). Lima, Peru: Submitted to the
   Instituto Nacional de Cultura.
  - DuBois, R. (1989). Archaeomagnetic results from southwest united states and mesoamerica, and comparison with some other areas. *Physics of the Earth and Planetary Interiors*, 56, 18-33.
- DuBois, R. (2008). Geomagnetic results, secular variation, and archaeomagnetic chronology, united states and mesoamerica, including archaeomagnetic data
   and time assignments (Special Publication 2008-2). Norman, Oklahoma:
   Oklahoma Geological Survey.
- DuBois, R., & Watanabe, N. (1965). Preliminary results of investigations made to
  study the use of indian pottery to determine the paleointensity of the geomagnetic field for the united states a.d. 600-1400. Journal of Geomagnetism and
  Geoelectricity, 17, 417-423.
- Eighmy, J. (1991). Archaeomagnetism: new data on the us southwest master curve. *Archaeometry*, 33, 201-214.
- Eighmy, J. (2000). Thirty years of archaeomagnetic dating. In S. E. Nash (Ed.), It's about time: A history of archaeological dating in north america (p. 105-123).
  Salt Lake City, Utah: University of Utah Press.
- Eighmy, J., Hathaway, J., & Counce, S. (1987). Independently dated virtual geomagnetic poles: The colorado state university archaeometric data base (Technical Series No. 1). Fort Collins, Colorado: Colorado State University Archaeometric Laboratory.
- Eighmy, J., & Klein, P. Y. (1988). 1988 additions to the list of independently dated
  virtual geomagnetic poles and the south-west master curve (Technical Series
  No. 4). Fort Collins, Colorado: Colorado State University Archaeometric
  Laboratory.
- Eighmy, J., & Klein, P. Y. (1990). 1990 additions to the list of independently dated virtual geomagnetic poles and the south-west master curve (Technical Series No. 6). Fort Collins, Colorado: Colorado State University Archaeometric Laboratory.
- Eighmy, J., & McGuire, R. H. (1989). Archaeomagnetic dates and the hohokam
   phase sequence (Technical Series No. 3). Fort Collins, Colorado: Colorado

732	State University Archaeometric Laboratory.
733	Eighmy, J., & Sternberg, R. (1990). Archaeomagnetic dating. Tucson, Arizona: Uni-
734	versity of Arizona Press.
735	Eighmy, J., Sternberg, R., & Butler, R. F. (1980). Archaeomagnetic dating in the
736	american southwest. American Antiquity, 45, 507-51.
737	Fisher, R. A. (1953). Dispersion on a sphere. <i>Proceedings of the Royal Society of</i>
738	London, Series A, 217, 295-305.
	Hagstrum, J., & Blinman, E. (2010). Archaeomagnetic dating in western north
739 740	america. Geochemistry, Geophysics, Geosystems, 11(6), 1-18. doi: doi.org/10
	.1029/2009GC002979
741	Hathaway, J., Eighmy, J., & Kane, A. (1983). Preliminary modification of the south-
742	west virtual geomagnetic pole path ad 700 and ad 900: Dolores archaeological
743	program results. Journal of Archaeological Science, 10, 51-59.
744	Haury, E. (1976). The hohokam: Desert farmers and craftsmen. Tucson, Arizona:
745	University of Arizona Press.
746	
747	Jackson, A., Jonkers, A. R. T., & Walker, M. R. (2000). Four centuries of geomag-
748	netic secular variation from historical records. <i>Philosphical Transactions of the</i>
749	Royal Society of London, 358, 957-990.
750	Jones, S., Tauxe, L., Blinman, E., & Genevey, A. (2020). Archeointensity of the four
751	corners region of the american southwest. Geochemistry, Geophysics, Geosys-
752	<i>tems</i> , 21. doi: https://doi.org/10.1029/2018GC007509
753	Kawai, N., Hirooka, H., & Sasajima, S. (1965). Counterclockwise rotation of the
754	geomagnetic dipole axis revealed in the world-wide archaeo-secular variations.
755	Proceedings of the Japan Academy, 41, 398-403.
756	LaBelle, J., & Eighmy, J. (1995). 1995 additions to the list of independently dated
757	virtual geomagnetic poles and the south-west master curve (Technical Series
758	No. 7). Fort Collins, Colorado: Colorado State University Archaeometric
759	Laboratory.
760	LaBelle, J., & Eighmy, J. (1997). Additional archaeomagnetic data on the south-
761	west usa master geomagnetic pole curve. Archaeometry, 39, 431-439.
762	Lengyel, S. N. (2010). The pre-ad 585 extension of the us southwest archaeomag-
763	netic reference curve. Journal of Archaeological Science, 37(12), 3081-3090.
764	Lengyel, S. N., & Eighmy, J. (2002). A revision to the u.s. southwest archaeomag-
765	netic master curve. Journal of Archaeological Science, 29, 1423-1433.
766	Paterson, G., Tauxe, L., Biggin, A., Shaar, R., & Jonestrask, L. (2014). On improv-
767	ing the selection of thellier-type paleointensity data. Geochemistry Geophysics
768	Geosystems, 15(4). doi: doi.org/10.1002/2013GC005135
769	Pedregosa, F., Varoquaux, G., Gramfort, A., Michel, V., Thirion, B., Grisel, O.,
770	Duchesnay, E. (2011). Scikit-learn: Machine learning in python. Journal of
771	Machine Learning Research, 12, 2825-2830.
772	Premo, L. S., & Eighmy, J. (1997). A reanalysis of archaeomagnetic samples col-
773	lected for the mimbres foundation project (Technical Series No. 10). Fort
774	Collins, Colorado: Colorado State University Archaeometric Laboratory.
775	Schaafsma, P., & Schaafsma, C. (1996). Daniel wolfman 1939-1994. American Antiq-
776	uity, 61(2), 291-294. doi: doi.org/10.1017/S0002731600051921
777	Schiffer, M. B. (1982). Hohokam chronology: An essay on history and method. In
778	R. H. McGuire & M. B. Schiffer (Eds.), Hohokam and patayan: Prehistory of
779	southwestern arizona (p. 299-344). New York, New York: Academic Press.
780	Sternberg, R. (1982). Archaeomagnetic secular variation of direction and paleointen-
781	sity in the american southwest (Unpublished doctoral dissertation). University
782	of Arizona, Tucson, Arizona.
783	Sternberg, R. (1989). Secular variation of archaeomagnetic directions in the ameri-
784	can southwest, a.d. 750-1425. Journal of Geophysical Research, 94, 527-546.
785	Sternberg, R. (1996). Daniel wolfman: 1939-1994. Society for Archaeological Science

Bulletin, 19(3/4), 5-6.

786

787	Tauxe, L., Shaar, R., Jonestrask, L., Minnett, R., Koppers, A. A. P., Constable,		
788	C. G., Sciences, P. (2016). PmagPy: Software package for paleomagnetic		
789	data analysis and a bridge to the Magnetics Information Consortium (MagIC)		
790	Database. Geochemistry, Geophysics, Geosystems, 17(6), 2450-2463. doi:		
791	doi.org/10.1002/2016GC006307		
792	Thellier, E., & Thellier, O. (1951). Magnétisme terrestre: Sur la directioni du champ		
793	magnétique terrestre, retrouvée sur des parois de fours des époques panique et		
794	romaine, à carthage. Comptes Redus des Seances de l'Academie des Sciences,		
795	233, 1476-1479.		
796	Watanabe, N. (1959). The direction of remnant magnetization of baked earths and		
797	it application to chronology for anthropology and archaeology in japan. Jour-		
798	nal of the Faculty of Science, University of Tokyo, 2, 1-188.		
799	Watanabe, N., & DuBois, R. (1965). Some results of an archaeomagnetic study		
800	of the secular variation in the southwest of north america. Journal of Geomag-		
801	netism and Geoelectricity, 17, 395-397.		
802	Weaver, K. F. (1967). Magnetic clues help date the past. National Geographic, May,		
803	696-701.		
804	Wilkinson, M. D., Dumontier, M., Aalbersberg, I. J., Appleton, G., Axton, M.,		
805	Baak, A., Mons, B. (2016). The fair guiding principles for scientific data		
806	management and stewardship. Scientific Data, 3 (article no 160018). doi:		
807	doi.org/10.1038/sdata.2016.18		
808	Wolfman, D. (1973). A re-evaluation of mesoamerican chronology: A.d. 1-1200 (Un-		
809	published doctoral dissertation). University of Colorado.		
810	Wolfman, D. (1982). Archeomagnetic dating in arkansas and the border areas of		
811	adjacent states. In N. Trubowitz & M. Jeter (Eds.), Arkansas archeology in re-		
812	view (p. 277-300). Fayetteville, Arkansas.		
813	Wolfman, D. (1990a). Archaeomagnetic dating in arkansas and the border areas of		
814	adjacent states - ii. In J. Eighmy & R. Sternberg (Eds.), Archaeomagnetic dat-		
815	ing (p. 237-260). Tucson, Arizona: University of Arizona Press.		
816	Wolfman, D. (1990b). Mesoamerican chronology and archaeomagnetic dating, a.d.		
817	1-1200. In J. Eighmy & R. Sternberg (Eds.), Archaeomagnetic dating (p. 261-		
818	308). Tucson, Arizona: University of Arizona Press.		
819	Wolfman, D., & Dodson, R. E. (1986). Los resultados arqueomagneticos de las mues-		
820	tras recogidas en el peru en 1983 (Tech. Rep.). Lima, Peru: Submitted to the		
821	Instituto Nacional de Cultura.		
822	Wolfman, D., & Dodson, R. E. (1998). Archaeomagnetic results from peru: A.d.		
823	700-1500. Andean Past, 5(20). Retrieved from digitalcommons.library		

.umaine.edu/andean\_past/vol5/iss1/20

### Supporting Information for MagIC as a FAIR repository for America's directional archaeomagnetic legacy data

Shelby A. Jones <sup>1,2</sup>, Eric Blinman <sup>2</sup>, Lisa Tauxe <sup>1</sup>, J. Royce Cox <sup>2</sup>, Stacey Lengyel <sup>3</sup>, Robert Sternberg <sup>4</sup>, Jeffrey Eighmy <sup>5</sup>, Daniel Wolfman <sup>6</sup>, Robert DuBois <sup>6</sup>

<sup>1</sup>Scripps Institution of Oceanography, University of California, San Diego, La Jolla, CA 92093

<sup>2</sup>New Mexico Department of Cultural Affairs, Office of Archaeological Studies, Santa Fe, NM, 87507

<sup>3</sup>East Tennessee State University, Johnson City, TN, 37614

<sup>4</sup>Franklin and Marshall College, Lancaster, PA, 17604

<sup>5</sup>Unaffiliated

 $^{6*}$ Posthumously

#### Contents of this file

1. Table S1: Parameters used in data clustering

2. Figure S1: Other polynomial fit models explored

3. Figure S2: Lower Mississippi River region Declination and Inclination

4. Figure S3: Northern Mexico Declination and Inclination

5. Figure S4: Mesoamerica Declination and Inclination

6. Figure S5: South America Declination and Inclination

#### Introduction

Four subsets of data from the Four Corners region were explored in the development of the polynomial fit model of paleosecular variation. Only the selected model based on the subset of data that satisfy  $\alpha_{95} \leq 4$  was included in the main text and transformed into to a VGP projection. The other three (all the data,  $\alpha_{95} \leq 5$  or  $\kappa \geq 100$ , and  $\alpha_{95} \leq 3$ ) are presented here in Figure S1.

Due to the low density of accepted data from the Lower Mississippi River region, northern Mexico, Mesoamerica, and South America, those data were not graphically depicted in the text. The magnetic declination and inclination of the sites from these regions, with respect to time, are presented here in Figures S2, S3, S4 and S5, respectively.

Digital reproductions of previously published but difficult to access VGP models for the other regions are available by contacting the corresponding author (saj012@ucsd.edu).

Copyright 2021 by the American Geophysical Union.  $0148{-}0227/21/\$9.00$ 

#### Table S1: Parameters used in data clustering

To eliminate subjectivity of human bias and ensure that the scatter caused by paleosecular variation was maintained, the azimuth adjustments required to correct the archived data were completed using the OPTICS clustering functions within the sklearn.cluster python module. The parameters used are presented in Table S1 and an example python Jupyter Notebook, associated with this paper, is available on ERDA (https://earthref.org/ERDA/2478/). The notebook presents the code used to cluster and adjust the DuBois data from the United States.

In some cases, a filter was used in addition to the OP-TICS clustering to ensure that directions that fell between clusters (i.e. Declination = 45 or  $135^{\circ}$ ) were not included in a cluster. Instead those data were filtered out and assigned to no cluster, to avoid misidentifying the cluster they belong

 $\operatorname{to.}$ 

Contributor	Step 1	Step 2
DuBois		
- USA	Epsilon = 11	Epsilon = 19
- Mexico and Central Am.	Not Corrected	
- South America	Not Corrected	
Wolfman		
- USA	Epsilon = 10	Epsilon = 18
- Mexico and Central Am.	Epsilon = 21	Filter = Decs $330-20^{\circ}$ , $60-110^{\circ}$ , $150-220^{\circ}$ , and $240-290^{\circ}$
- South America	Filter = Decs $60-130^{\circ}$	
Eighmy		
- USA	Epsilon = 18	
- Mexico and Central Am.	Not Corrected	
- South America	Not Corrected	

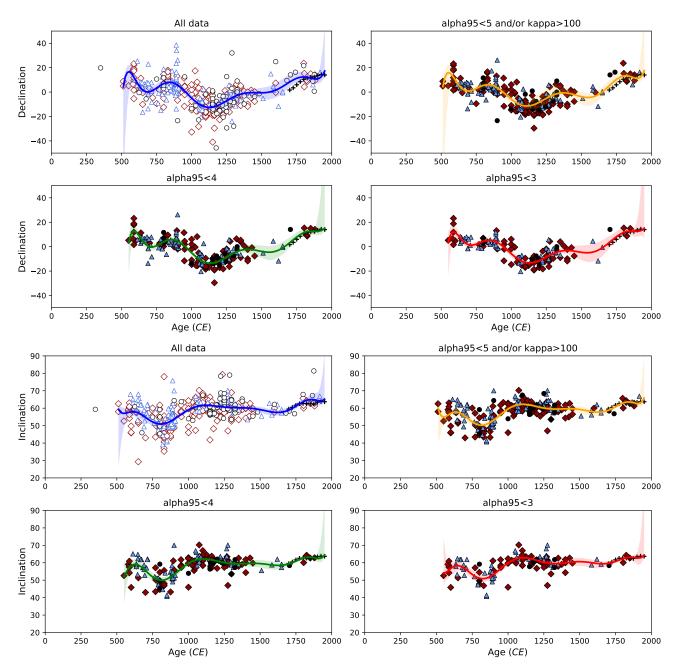
#### Figure S1: Other polynomial fit models explored

Blue (top-left): The model derived from all the data (402 data points in the last 2000 years) does not reliably fit the declination predictions from gufm, black plus-sign symbols.

Yellow (top-right): The model derived from the subset of data that passed this paper's selection criteria (239 data points in the last 2000 years) has a phase offset in the declination during the  $8^{th} - 14^{th}$  centuries that does not fit the data adequately.

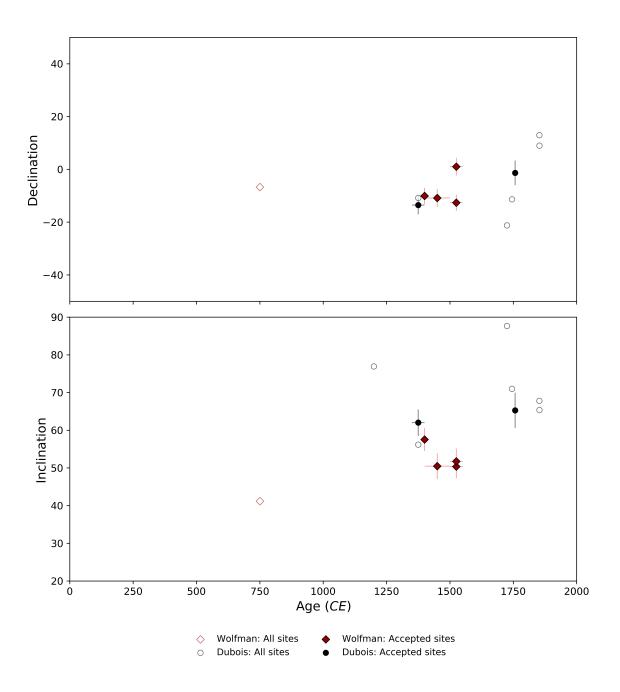
Red (bottom-right): An  $\alpha_{95}$  threshold of 3 degrees, decreased the subset of data available for modeling to 130 data points in the last 2000 years and was deemed to be an overly strict interpretation for the data.

Green (bottom-left): A balance of precision and quantity of data was favored, resulting in the preference to select this model based on the subset of data with an  $\alpha_{95}$  threshold of 4 degrees (152 data points during the last 2000 years) for conversion into VGP coordinates.



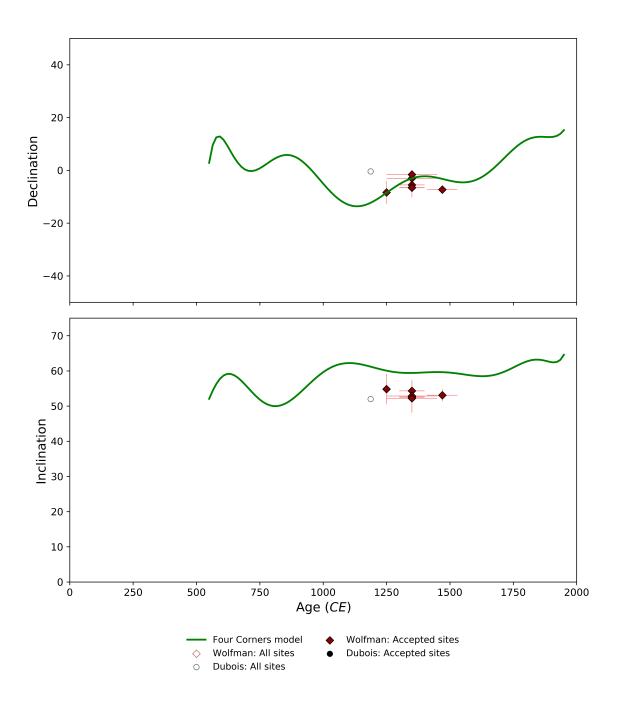
#### Figure S2: Lower Mississippi River region

Within the Lower Mississippi River region, DuBois sampled material from 287 burned features, Wolfman sampled 33 features, and Eighmy sampled 63. Of these only twentytwo have independent age chronology (ten of which are older than 2000 years before present), and seven passed this paper's acceptance criteria (Table 4 in the main text). Those data are presented here, with respect to age. There are too few data to confirm or refute the previously published models for the region that were compiled by Wolfman.



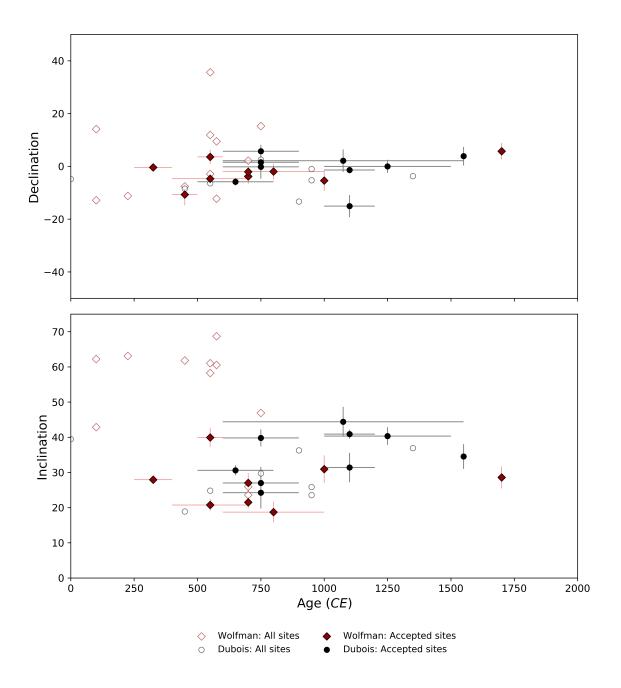
#### Figure S3: Northern Mesoamerica

Due to the latitudinal dependence of inclination, the data from Mexico and Central America were interpreted in two divisions - northern Mexico and Mesoamerica. The few sites in the northern region (24 archaeological features), are culturally similar to the indigenous populations of the southern Four Corners region and are in close enough proximity that they could potentially be included in regional modeling efforts in the future. Those data are presented here, with respect to age. The eight sites are overlaid on top of the new polynomial fit model for the Four Corners region. The inconsistency noted between the inclination data and the model could be the result of a latitudinal dependence but could also be an artifact in the model, due to low data density in the Four Corners region, during the same time interval.



#### Figure S4: Mesoamerica

Of the 376 archaeomagnetic sites sampled in Mesoamerica, forty-seven have independent age constraints and only twenty-four passed this paper's acceptance criteria (Table 4 in the main text). Those data are presented here, with respect to age. The data are too dispersed to confirm or refute the previously published models for the region that were compiled by Wolfman.



#### Figure S5: South America

South America is the least sampled region in the archive and of those, only fourteen archaeomagnetic sites passed our acceptance criteria. Those data are presented here, with respect to age. There are too few data to confirm or refute the previously published models for the region that were compiled by Wolfman and Dodson.

