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# Insights from geodynamo simulations into long-term geomagnetic field behaviour

Christopher J. Davies<sup>a,b</sup>, Catherine G. Constable<sup>b</sup>

<sup>4</sup> <sup>a</sup>School of Earth and Environment, University of Leeds, Leeds LS2 9JT, UK (tel: +44 (0) 11 33
 <sup>5</sup> 43 55 43; email: c.davies@leeds.ac.uk

<sup>6</sup> <sup>b</sup>Institute of Geophysics and Planetary Physics, Scripps Institution of Oceanography, University of

California at San Diego, La Jolla, CA, 92092-0225, USA

# 8 Abstract

Detailed knowledge of the long-term spatial configuration and temporal variability of the geomagnetic field is lacking because of insufficient data for times prior to 10 ka. We use realisations from suitable numerical simulations to investigate three important questions about stability of the geodynamo process: is the present field representative of the past field; does a time-averaged field actually exist; and, supposing it exists, how long is needed to define such a field. Numerical geodynamo simulations are initially selected to meet existing criteria for morphological similarity to the observed magnetic field. A further criterion is introduced to evaluate similarity of long-term temporal variations. Allowing for reasonable uncertainties in the observations, observed and synthetic axial dipole moment frequency spectra for time series of order a million years in length should be fit by the same power law model. This leads us to identify diffusion time as the appropriate time scaling for such comparisons. In almost all simulations, intervals considered to have good morphological agreement between synthetic and observed field are shorter than those of poor agreement. The time needed to obtain a converged estimate of the time-averaged field was found to be comparable to the length of the simulation, even in non-reversing

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models, suggesting that periods of stable polarity spanning many magnetic diffusion times are needed to obtain robust estimates of the mean dipole field. Long term field variations are almost entirely attributable to the axial dipole; non-zonal components converge to long-term average values on relatively short timescales (15 - 20 kyr). In all simulations, the time-averaged spatial power spectrum is characterised by a zigzag pattern as a function of spherical harmonic degree, with relatively higher power in odd degrees than in even degrees. We suggest that long-term spatial characteristics of the observed field may emerge on averaging times that are within reach for the next generation of global time-varying paleomagnetic field models.

9 Keywords: Geodynamo models, Secular variation, Geomagnetic frequency

<sup>10</sup> spectrum, Earth's core

#### 11 1. Introduction

Earth's magnetic field of internal origin displays temporal variations spanning 12 a vast range of frequencies (Constable and Johnson, 2005; Korte and Constable, 13 2006). The field can change quickly as evidenced by so-called geomagnetic jerks, 14 abrupt changes manifest on <1 year timescales (Malin and Hodder, 1982; Alexan-15 drescu et al., 1995), and the more moderate but still rather rapid archaeomagnetic 16 jerks seen on centennial timescales (Gallet et al., 2009). Larger changes associated 17 with geomagnetic excursions and polarity reversals generally occur a few times ev-18 ery million years (Cande and Kent, 1992, 1995; Glatzmaier and Coe, 2007), but the 19 time taken for such changes (hundreds to thousands of years) remain a matter of 20 some debate. Global time-dependent models of the magnetic field at the core-mantle 21 boundary (CMB) now span the past 10 yrs (e.g. Olsen et al., 2010), 400 yrs (Jack-22 son et al., 2000), 3 kyrs (Korte and Constable, 2011), 7 kyrs (Korte and Constable, 23 2005), and 10 kyrs (Korte et al., 2011) and display common features such as a pre-24

dominantly dipolar field, weak flux near the geographic poles, and intense patches
of magnetic flux at high latitudes. These models have enabled significant advances
in understanding the geodynamo process.

On timescales longer than 10 kyr there are not yet any time-varying global models 28 of the same quality as for the Holocene time interval, although there is some progress 29 in this area. High-quality data have generally been confined to the dipole moment 30 (Valet et al., 2005; Ziegler et al., 2011), with time-series spanning the past 2 Myr, 31 and detailed well-dated directional data at a few sparse locations such as Hawaii and 32 Réunion Island (e.g. Laj et al., 2011); for the longest periods, only the geomagnetic 33 polarity timescale (Cande and Kent, 1992, 1995) is well documented. As a conse-34 quence, fundamental questions about the long-term behaviour of the geomagnetic 35 field remain unanswered. For example, it is not yet known if the modern field is rep-36 resentative of the past field, which is important for elucidating the role of external 37 forcings on the geodynamo (Biggin et al., 2012), or how the field structure changes as 38 it is averaged over successively longer periods. Does a time-averaged field exist, such 39 that when averaged over sufficient time there are no significant changes upon further 40 temporal averaging? If so, what is the structure of this field and what averaging 41 time is needed to attain this state? Additional information is needed to answer these 42 questions. This paper explores them using numerical geodynamo simulations and 43 comparisons with available paleofield models. 44

We consider geodynamo simulations as useful tools for investigating long-term field behaviour for three reasons. Firstly, they have recovered prominent features of the modern and paleomagnetic fields (e.g. Olson and Christensen, 2002; Coe and Glatzmaier, 2006; Gubbins et al., 2007; Bloxham, 2000; Christensen and Olson, 2003; McMillan et al., 2001; Davies et al., 2008). Secondly, they provide a global representation of the magnetic field at each time point, achieving a spatial resolution

that is much higher than in observational field models. Finally, high resolution sim-51 ulations can be run on long timescales, providing a detailed picture of long-term 52 processes. However, simulations cannot yet be run with the rapid rotation rates 53 and low diffusivities associated with Earth's core, and reaching this goal in the near 54 future seems unlikely (Glatzmaier, 2002; Davies et al., 2011). These parameters 55 determine the balance of forces, affecting the dynamics in the simulation and the 56 spatio-temporal characteristics of the generated magnetic fields. Indeed, a variety of 57 field morphologies have been obtained (Kutzner and Christensen, 2002; Olson and 58 Christensen, 2006), which raises the question of how to decide if a given simulation 59 exhibits "Earth-like" behaviour. 60

Previous studies have quantified the level of agreement between synthetic and 61 observed fields using measures based on properties of the observed field (Dormy 62 et al., 2000; Kono and Roberts, 2002). Christensen et al. (2010) made significant 63 progress in this regard by defining "Earth-like" behaviour based on four quantities, 64 derived from global field models, that characterise the spatial structure of the field. 65 The defined criteria require that the misfits between synthetic and observed values 66 of the four quantities fall below given tolerances; a simulation that meets the criteria 67 is considered to be morphologically similar to the observed field. We use these 68 definitions to select dynamo simulations that are suitable for further study. 69

For the long (> 10 kyr) timescales of interest in this paper we require one further criterion that measures the agreement between temporal variations in synthetic and observed fields. We use the axial dipole moment as a measure of global changes in the field and do not include further complexities. Several time-dependent models are available (Constable and Johnson, 2005; Valet et al., 2005; Ziegler et al., 2011), but we focus on the more recent 2 Myr model PADM2M of (Ziegler et al., 2011). Ziegler et al. (2011) have already established that the power spectral density for

PADM2M is compatible with that from Sint-2000 (Valet et al., 2005), and Ziegler 77 and Constable (2011) indicate that the spectrum falls off at a rate of about  $f^{-7/3}$ , 78 where f is frequency, for PADM2M above a corner frequency of about 10  $Myr^{-1}$ 79 in agreement with falloff rate observed in some dynamo simulations. We build a 80 power law fit to the frequency spectrum of PADM2M and require that observed 81 and synthetic axial dipole moment spectra can be fit by the same power law model, 82 within appropriate uncertainty levels for the observations. Simulations that meet 83 this criterion are considered to exhibit temporal variations similar to the PADM2M 84 model. 85

This paper is organised as follows. In §2 we describe the observational and nu-86 merical models used in this study. In §3 we first discuss the problem of scaling di-87 mensionless model time into dimensional units and select two plausible time scalings 88 based on intrinsic timescales of the magnetic field. We then compare morphological 89 properties of the simulations with global field models using the criteria of Christensen 90 et al. (2010) in §3.1, and temporal variations exhibited by the simulations with the 91 observed axial dipole moment variation in  $\S3.2$ . In  $\S4$  we use simulations that meet 92 all criteria to investigate the length of time required to obtain the mean observed and 93 synthetic axial dipole fields. We also investigate how the synthetic fields change when 94 averaged over successively longer periods. Discussion and conclusions are presented 95 in §5. 96

# 97 2. Models

#### 98 2.1. Global Field Models

We use three time varying representations of the geomagnetic field: the 400 yr historical model gufm1 (Jackson et al., 2000), the 3 kyr model CALS3k.4b (Korte and

Constable, 2011), and the 2 Myr model for axial dipole moment variations PADM2M 101 (Ziegler et al., 2011). gufm1 and CALS3k.4b are constructed by expanding the 102 spatial dependence of the magnetic field  $\mathbf{B}$  in spherical harmonics and the temporal 103 dependence of  $\mathbf{B}$  in cubic B-splines. These models are regularised in space and time 104 and for the most recent portion of CALS3k.4b departures from the gufm1 model 105 are penalised. It should be noted that the quality of the paleomagnetic models 106 derived for millennial time scales is vastly inferior to that of gufm1. This is a direct 107 consequence of poor data coverage in the southern hemisphere, and lower accuracy 108 in the data. Detailed descriptions of the methods and inversion strategy used to 109 construct the global models are given in Bloxham and Jackson (1992); Jackson et al. 110 (2000); Korte and Constable (2003, 2008, 2011); Constable (2011). For longer time 111 periods we use PADM2M which again uses cubic B-splines for temporal dependence 112 but only aims to model variations in axial dipole moment. A complete description 113 of PADM2M is given in Ziegler et al. (2011). 114

# 115 2.2. Geodynamo Models

The model setup and solution method for our convection-driven dynamo models 116 is standard and only a brief description is given here. An incompressible, electrically 117 conducting Boussinesq fluid with constant thermal diffusivity  $\kappa$ , constant coefficient 118 of thermal expansion  $\alpha$ , constant viscosity  $\nu$ , and constant magnetic diffusivity  $\eta$  is 119 contained in a spherical shell of thickness  $d = r_{\rm o} - r_{\rm i}$  and a spect ratio  $r_{\rm i}/r_{\rm o} = 0.35$ 120 rotating at a rate  $\Omega$ . Here,  $r_i$  corresponds to the inner boundary and  $r_o$  to the outer 121 boundary. The nondimensional parameters are the Ekman number E, the Prandtl 122 number Pr, the magnetic Prandtl number Pm, and the Rayleigh number Ra given 123 by 124

$$E = \frac{\nu}{2\Omega d^2}, \quad Pr = \frac{\nu}{\kappa}, \quad Pm = \frac{\nu}{\eta}, \quad Ra = \frac{\alpha g\beta d^4}{\nu\kappa},$$
 (1)

where g is gravity and  $\beta$  is the temperature gradient at the outer boundary.

The parameters that define the dynamo simulations used in this study are sum-126 marised in Table 1. Some of these models have been reported before (Davies et al., 127 2008; Davies and Gubbins, 2011) and some are new. All simulations employ a no-128 slip outer boundary that is electrically insulating with the heat-flux fixed. On the 129 inner boundary a no-slip condition is imposed in all models, while both conducting 130 and insulating magnetic boundary conditions and temperature and heat-flux ther-131 mal boundary conditions are included. Five models employ a spatially non-uniform 132 heat-flux pattern on the outer boundary. The heat-flux pattern is derived from maps 133 of shear-wave anomalies in the lowermost mantle (Masters et al., 1996) and is dom-134 inated by spherical harmonic degree and order two. The amplitude of the lateral 135 variations is measured by  $\epsilon$ , the ratio of peak-to-peak boundary variations and mean 136 outer boundary heat-flux. Further details of the numerical model can be found in 137 Willis et al. (2007) and Davies et al. (2011). 138

Previous studies have found that the value of the magnetic Reynold's number, Rm, is important for obtaining Earth-like dynamos (Christensen et al., 2010; Olson et al., 2012). Rm is an output of the simulation and is given by

$$Rm = \frac{Ud}{\eta},\tag{2}$$

where U is a characteristic velocity. Estimating U based on the RMS velocity just below the CMB obtained from core flow inversions gives  $U = 3.8 - 5 \times 10^{-4} \text{ ms}^{-1}$ (Holme, 2007). Together with  $\eta = 0.7 \text{ m}^2 \text{s}^{-1}$  (Pozzo et al., 2012, 2013),  $Rm \approx$ 1200 - 1500. In geodynamo simulations U is usually estimated as the RMS velocity averaged over the whole shell. With this definition Christensen and Tilgner (2004) obtained  $Rm \approx 1000$  from a scaling analysis of a suite of geodynamo simulations. Obtaining numerical dynamos with such high values of Rm is a significant challenge, requiring high Ra and hence high numerical resolution. This inevitably leads to short run times. The highest values of Rm used in this study are ~600 (Table 1), which is a necessary compromise when investigating long-term dynamo behaviour.

Figure 1 illustrates our suite of simulations (details are in Table 1), which follows 152 Christensen et al. (2010) by plotting  $E_{\eta} = E/Pm$  against Rm. Dashed lines delineate 153 the region found by Christensen et al. (2010) to contain Earth-like simulations as 154 defined in Section 3. Most of the model runs exhibit a stable dipolar field and do 155 not reverse, although the suite does include some in the reversing dipole-dominated 156 regime and reversing multipolar regimes identified by Olson and Christensen (2006). 157 The run times in some cases are so short that the simulations cannot be expected 158 to exhibit reversals. In §3 we compare these simulations to the geomagnetic field at 159 appropriate timescales. 160

# <sup>161</sup> 3. Comparing Geodynamo Simulations and Geomagnetic Data

To compare simulation outputs with data the synthetic timestep must be rescaled into dimensional units. We are interested in the evolution of the magnetic field so it is natural to consider the two timescales that characterise diffusion and advection of magnetic field, each representing fundamental physical process in Earth's core, and given respectively by

$$\tau^d = \frac{d^2}{\eta}, \quad \text{and} \quad \tau^a = \frac{d}{U},$$
(3)

The ratio of these two timescales is the magnetic Reynold's number,  $Rm = \tau^d/\tau^a$ . In our simulations dimensionless time  $t^*$  is measured in units of the magnetic diffusion time,  $t^* = t/\tau^d$  where t is dimensional time, which may be converted to advective time units by  $t^* = t/(Rm\tau^a)$ .

Both advective (Lhuillier et al., 2011, 2013) and diffusive (e.g. Bloxham, 2000; 171 Davies et al., 2008; Driscoll and Olson, 2009; Olson et al., 2013) scaling have been 172 used in the past. Previous works that compared the relative merits of both scalings 173 have advocated the advective scaling when studying relatively short term field vari-174 ations. Olson et al. (2012) also noted particularly good agreement with advective 175 scaling in the high frequency regime, but found that "there is little to choose between 176 the two scalings at low frequencies". In the following subsections we scale time in 177 our suite of numerical simulations using both the diffusive and advective timescales: 178

$$t^d = \tau^d_E t^* \qquad diffusive \ scaling \tag{4}$$

$$t^a = \tau_E^d t^* \frac{Rm_m}{Rm_E} \qquad advective \ scaling \tag{5}$$

<sup>179</sup> We take  $\tau_E^d = 2 \times 10^5$  yrs (Pozzo et al., 2013) and  $Rm_E = 10^3$  (Christensen and <sup>180</sup> Tilgner, 2004).

# <sup>181</sup> 3.1. Morphological Comparisons with Historical and Millennial Observational Field <sup>182</sup> Models

In this section we compare our suite of numerical simulations with global timedependent geomagnetic field models using the four quantities proposed by Christensen et al. (2010) (hereafter CAH). The first three are derived from the spatial power spectrum at the CMB,

$$R(l, r_{\rm o}) = (l+1) \sum_{m=0}^{l} \left(\frac{r_{\rm e}}{r_{\rm o}}\right)^{2l+4} [(g_l^m)^2 + (h_l^m)^2], \tag{6}$$

where  $g_l^m$  and  $h_l^m$  are Gauss coefficients of degree l and order m,  $r_e$  is the radius of the Earth ,  $r_o$  is the CMB radius, and L is maximum harmonic degree. The fourth measures the extent to which magnetic flux on the CMB is concentrated into patches.The four quantities are:

- 191 1. AD/NAD: the ratio of power in the axial dipole, AD (l = 1, m = 0), to the 192 rest of the field, NAD;
- <sup>193</sup> 2. O/E: the ratio of the power in equatorially antisymmetric nondipole compo-<sup>194</sup> nents, O (coefficients with l - m odd) to the power in equatorially symmetric <sup>195</sup> nondipole components, E (l - m even);
- <sup>196</sup> 3. Z/NZ: the ratio of power in nondipole zonal, Z (m = 0), to nondipole nonzonal, <sup>197</sup> NZ ( $m \neq 0$ ), components;
- 4. FCF:  $(\langle B_r^4 \rangle \langle B_r^2 \rangle^2) / \langle B_r^2 \rangle^2$ , where  $B_r$  is the radial component of the magnetic field and angled brackets denote the average over a spherical surface.

The choice of quantities reflect the special significance of the axial dipole field, the equatorial symmetry properties of a magnetic field generated in a spherical shell (Gubbins and Zhang, 1992), and the prominence of intense patches of magnetic flux in historical (Jackson et al., 2000) and archeomagnetic (Korte and Holme, 2010; Amit et al., 2011) field models.

<sup>205</sup> CAH measure the agreement between a simulated field and the geomagnetic field <sup>206</sup> through the normalised squared logarithmic deviation of each simulated quantity  $P_i$ <sup>207</sup> from its value derived from an observational field model,  $P_i^E$ :

$$\chi^2 = \sum_{i=1}^{4} \left[ (\ln P_i - \ln P_i^E) / \ln \sigma_i \right]^2, \tag{7}$$

where *i* represents the criteria (1)–(4) and  $\sigma_i$  is the standard deviation of quantity *i*.  $P_i^E$  and  $\sigma_i$  are calculated from Gauss coefficients of the gufm1 and CALS3k.4b models averaged over 400 and 3000 yrs respectively. The agreement between a simulation and an observational field model is defined as "excellent" if  $\chi^2 < 2$ , "good" if  $\chi^2 < 4$ , and "poor" otherwise.

To compute the quantities (1)-(4) Gauss coefficients for the numerical simula-213 tions are calculated by upward continuing the radial component of the poloidal field 214 from  $r_{\rm o}$  to  $r_{\rm e}$ . It is well-known that rescaling the dimensionless coefficients is non-215 unique. We choose to keep the synthetic coefficients in dimensionless form and in-216 stead nondimensionalise the observational field models. The scaling factor  $\sqrt{2\rho\Omega\mu_0\eta}$ 217 we use is the same as that used to nondimensionalise the simulation equations, where 218  $\rho = 10^4$  kg m<sup>-3</sup> is the average outer core density and  $\Omega = 7.272 \times 10^{-5}$  s<sup>-1</sup> is the ro-219 tation frequency. Note that the quantities (1)-(4) are all relative and do not depend 220 on any choice of scaling for the Gauss coefficients. 221

We compare simulations to the 400 yr gufm1 model and the 3000 yr CALS3k.4b 222 model using the following strategy. We first rescale time in the dimensionless series 223 for each simulation using both the diffusive scaling (equation (4)) and the advective 224 scaling (equation (5)). We then split the dimensional time-series into bins of length 225 400 yrs or 3000 yrs and average the Gauss coefficients over each bin. The new time-226 series of coefficients  $g_l^m$  and  $h_l^m$ , each averaged over 400 or 3000 yr intervals, are used 227 in (6). For gufm1 the series in (6) is truncated at L = 8, as in CAH. For CALS3k.4b 228 the series is truncated at L = 4, reflecting the lower resolution of this model (Korte 229 and Constable, 2008). Because the starting time in each simulation is arbitrary 230 we require that each model contain a minimum of one interval with  $\chi^2 < 4$  to be 231 judged compatible with the observed field; such intervals, obtained independently 232 when comparing to gufm1 and CALS3k.4b, must also overlap. 233

Figure 2 shows time-series of  $\chi^2$  for three geodynamo simulations using the diffusive scaling (4). Each of the criteria vary significantly with time. The first simulation (model B3 in Table 1) has  $E_{\eta} = 5 \times 10^{-5}$  and Rm = 475 and plots inside the wedge-

shaped region in Figure 1. The simulation spans 440 kyrs, but we found no time 237 interval with  $\chi^2 < 4$  when comparing to gufm1 or CALS3k.4b. This is because 238 magnetic flux is concentrated into many small-scale patches, while the axial dipole 239 is generally much weaker than the observed field. This result is independent of po-240 sitions for the boundaries of the averaging intervals. The second simulation (model 241 C4 in Table 1) has  $E_{\eta} = 1.2 \times 10^{-5}$  and Rm = 130 and plots outside the wedge-242 shaped region in Figure 1. Nevertheless, agreement between this simulation and 243 gufm1 (CALS3k.4b) was classed as excellent in 11 (8) intervals and good in 92 (36) 244 intervals. The final simulation in Figure 2 (model F2 in Table 1) has  $E_{\eta} = 2 \times 10^{-5}$ 245 and Rm = 500, plots inside the wedge-shaped region in Figure 1 and displays low 246 values of  $\chi^2$  across the course of the simulation. Excellent agreement with gufm1 247 and CALS3k.4b is obtained at a number of intervals. 248

Table 1 shows for each simulation the number of intervals with  $\chi^2 < 4$  expressed 249 as a percentage of the total number of intervals. These quantities, denoted  $\%(\chi^2)$ , 250 are shown for both the diffusion and advective time scalings and for comparisons 251 with gufm1 and CALS3k.4b. For the diffusive scaling only two of the 31 simulations 252 achieve a  $\chi^2 < 4$  in more than half the intervals when compared to gufm1; comparing 253 with CALS3k.4b reduces this to one. Values of  $\%(\chi^2)$  are systematically lower when 254 the advective time scaling (equation (5)) is used. This is not surprising because all 255 of our models have a lower Rm than the Earth. With the advective time scaling 256 only one model achieves a  $\chi^2 < 4$  in more than half the intervals when compared 257 to gufm1; comparing for CALS3k.4b reduces this to zero. In our simulations the 258 generated fields are generally morphologically different from the modern observed 259 field. 260

We find that a wide range of simulations comply with the CAH criteria in at least one interval for both diffusive and advective timestep scalings. Results for the

diffusive scaling are summarised in Figure 1. The majority of simulations with  $\chi^2 < 4$ 263 plot inside the wedge-shaped region. Other simulations, such as C4 in Figure 2, 264 plot outside the wedge but still achieve  $\chi^2 < 4$ . Four of the five simulations with 265 heterogeneous outer boundary heat-flux are in this category;  $\chi^2_{AD/NAD}$  and  $\chi^2_{O/E}$ 266 vary significantly over time in these models, while  $\chi^2_{FCF}$  and  $\chi^2_{Z/NZ}$  are persistently 267 low because the heterogeneous boundary condition tends to concentrate magnetic 268 flux into pairs of equatorially symmetric patches. We did not find any interval in 269 each of the 5 simulations with  $E > 10^{-4}$  that agreed with the CALS3k.4b field. A 270 shorter interval with  $\chi^2 < 4$  may exist somewhere in the time-series or might emerge 271 if the simulations were run for longer; however, we choose not to study these models 272 further given the present evidence. For now we regard all 19 simulations with  $\chi^2 < 4$ 273 (shown by the grey and open symbols in Figure 1) as candidates for further analysis. 274

# 275 3.2. Comparisons based on Frequency Dependence of Variations in the Axial Dipole 276 Moment

We now introduce a new criterion that measures the agreement between temporal 277 variations in the simulations and the geomagnetic field on long timescales. As already 278 noted we compare to the model PADM2M, which describes the temporal evolution 279 of the axial dipole moment over the past 2 Myr (Ziegler et al., 2011); results are 280 also presented for the 800 kyr model Sint-800 (Guyodo and Valet, 1999) and the 281 2 Myr Sint-2000 model (Valet et al., 2005). We first convert to a time-series of  $g_1^0$ 282 by multiplying the axial dipole moment (ADM) of each model by  $\mu_0/(4\pi r_e)$ , where 283  $\mu_0$  is the permeability of free space. We then nondimensionalise  $g_1^0$  as described in 284 §3.1 for comparison with the dimensionless  $g_1^0$  output from geodynamo simulations. 285 Our criterion for agreement between simulations and data is based on a comparison 286 of the power spectral density (PSD) of  $g_1^0$ . 287

As in Constable and Johnson (2005) our spectral estimates are computed using 288 the code PSD written by Robert L. Parker (http://igppweb.ucsd.edu/~parker/Software/index.ht 289 which is based on an adaptively smoothed sine multitaper method (Riedel and 290 Sidorenko, 1995) designed to minimize local bias in the spectrum. Several tunable 291 parameters influence the results: 1) whether to prewhiten (pw) the spectra; 2) the 292 spline used for interpolation (Akima or Natural); 3) the smoothness of the PSD, S, 293 which affects the number k of tapers used at each frequency. k also varies with fre-294 quency depending on the amount of structure present in the spectrum. Prewhitening 295 is recommended for red spectra (such as the ADM) as it suppresses spectral leakage 296 and this was used to compute the spectra in this paper. We tested how the different 297 choices affect the PSD. The spline choice makes little difference, while the primary 298 impact of the smoothing factor is to improve frequency resolution at the expense 299 of greater uncertainty in spectral amplitude. Prewhitening also changes the low-300 frequency part of the spectrum, introducing stronger smoothing in that region (and 301 thereby greatly limiting the frequency resolution) and softening the sharpness of the 302 corner transition, while leaving the intermediate- and high-frequency parts relatively 303 unaffected as it should. The basic shape of the spectrum and transition frequencies 304 do not depend strongly on these choices. 305

Following Olson et al. (2012) we divide the PADM2M spectrum into three fre-306 quency ranges: a low frequency (LF) range characterised by a flat spectrum with 307 amplitude a; an intermediate frequency (IF) range where the spectrum follows a 308 power law  $bf^{-n_b}$  with  $n_b = 2.1 \pm 0.2$ , where f is frequency; a high frequency (HF) 309 range where the spectrum follows a power law  $cf^{-n_c}$  with  $n_c = 6.1 \pm 0.5$  (see Fig-310 ure 3). Our criterion for agreement is that the PSD of  $g_1^0$  in a geodynamo simulation 311 can be fit by a power law model with exponents that fall within the errors of the 312 PADM2M spectrum, a reasonable measure of the uncertainties. 313

The corner frequencies are determined by first inspecting the individual spectra 314 to establish frequency ranges that contain the transitions from LF to IF and from 315 IF to HF. In each range the frequency corresponding to the maximum curvature 316  $(d^2(PSD)/df^2)$  is taken as the corner frequency. Error estimates on the fitting 317 parameters for PADM2M are obtained by refitting the data with corner frequencies 318 corresponding to the maximum curvature  $\pm \max(d^2(PSD)/df^2)/tol$  where tol =319 2, 5, 10, 100 is a tolerance. We then obtain power law fits to the PSD between the 320 corner frequencies using least squares (the least squares errors are much smaller than 321 the errors obtained by refitting the spectra). This procedure is repeated for each 322 simulation using first the advective time scaling (5) and then the diffusive scaling 323 (4). Values of  $a, b, c, n_b, n_c$  and the corner frequency  $cf_{\rm li}$  between LF and IF parts 324 of the spectrum obtained with the diffusive time scaling are given in Table 2 for 325 simulations that meet the criteria in  $\S3.1$ . 326

The parameters used to fit the PSD are subject to various sources of uncertainty. 327 Estimates of the low-frequency parameters a and  $cf_{li}$  are influenced by tunable pa-328 rameters in the spectral estimation (see above), the length of the available time-series 329 and differences between ADM models. Table 2 shows that these factors cause es-330 timates of a to vary by over an order of magnitude between Sint-800, Sint-2000 331 and PADM2M. Moreover, if the available time-series are not long enough to capture 332 the low frequency behaviour of the geodynamo the amplitude a will differ by some 333 unknown amount from the expected value for a longer time-series. The frequency 334 resolution of  $cf_{\rm li}$  in PADM2M and Sint-2000 is around 30–40 Myr<sup>-1</sup>, all other fac-335 tors being equal; prewhitening increases the uncertainty to  $\sim 200 \text{ Myr}^{-1}$ . Frequency 336 resolution can be reduced to about  $\sim 4 \text{ Myr}^{-1}$  by adjusting the smoothing parameter 337 at the expense of greater uncertainty in a and a more complex spectrum. We prefer 338 the relatively smooth prewhitened estimate because of the simplicity of the spectral 339

shape and reduced spectral leakage, despite the poorer frequency resolution. These considerations mean that we do not use the values of a and  $cf_{li}$  to define a criterion for temporal agreement between geodynamo simulations and the geomagnetic field (although we note that all dynamo models in Table 2 have values of  $cf_{li}$  within the observational errors, while only one model (C5) has a value of a outside the observed range).

Table 2 shows that the HF regions of observational ADM models are not in good 346 agreement, reflecting the different methods by which they were constructed and poor 347 age resolution for paleomagnetic records in the  $100 - 1000 \text{Myr}^{-1}$  range. However, 348 PADM2M, Sint-800 and Sint-2000 all provide a good sampling of the IF range and 349 we obtain similar fits to the models in this region. We therefore require that our 350 models fit the IF range of the observed ADM models. This amounts to requiring 351 that values of  $n_b$  for the geodynamo simulations fall within the range of errors for the 352 observed models. Also, as we are interested in long timescale behaviour, we require 353 that the PSD from simulations contain LF and IF regions. 354

Figure 3 shows the frequency spectrum of  $g_1^0$  for selected models using respectively 355 the advective and diffusive scalings. These Figures show the result established by Ol-356 son et al. (2012) that the advective scaling does the best job of collapsing the spectra 357 in the high-frequency range. Note that our spectra based on the advective time scal-358 ing are shifted towards higher frequencies compared to those based on the diffusive 359 scaling, the opposite to the results in Olson et al. (2012), because we use dimen-360 sional time while Olson et al. (2012) use dimensionless time]. At low  $(O(10^3 - 10^0))$ 361 frequencies the dispersion of the spectra are comparable for both scalings. The spec-362 tra for both scalings show energy at higher frequencies than those in PADM2M. 363 This is expected from the limited temporal resolution achieved by PADM2M. How-364 ever, the advective spectra are also systematically offset towards higher frequencies 365

with respect to PADM2M but, as is to be expected, the spectral slopes remain unchanged. For the diffusive scaling the spectra plot closer to PADM2M; in particular, the spectra for models with Rm = 130 and Rm = 261 lie very close to the PADM2M spectrum. Power-law fits, shown by black solid lines, demonstrate that the models in Figure 3 conform to the basic shape of the PADM2M spectrum. This analysis also indicates that the diffusive time scaling is an appropriate choice for making comparisons involving temporal variations at timescales of 10kyr or longer.

Table 2 shows that ADM spectra from 12 of the 19 remaining simulations provide a satisfactory fit to the PADM2M spectrum. Models C1-5, D1, F1 and G1 are too short to fit the LF part of the PADM2M spectrum. In the following sections we focus on the four geodynamo simulations in Figure 3; results for all simulations are listed in Table 2. To simplify the presentation we now focus on results obtained with the diffusive time scaling. We note that this choice does not affect our conclusions regarding the long-term behaviour of our geodynamo models.

# 380 4. Long-term variations in geodynamo simulations

We are now in a position to investigate the existence of a time-averaged field (a field that does not change upon further averaging) and to attempt to determine the length of time required to obtain a stable average. We do this for both PADM2M and the simulated fields, first defining the running average of the sum of Gauss coefficients,  $\overline{g(t)}$ , as

$$\overline{g(t)} = \overline{g(t-1)}\frac{(t-1)}{t} + \frac{1}{t}\sum_{l,m}^{L,M} \left[g_l^m(t) + h_l^m(t)\right], \qquad t = 1, 2, \dots, n$$
(8)

where M is the maximum harmonic order. We define  $\overline{g_1^0(t)}$  by setting L = 1, M =386 0 in (8), while  $\overline{g_{z}(t)}$  and  $\overline{g_{nz}(t)}$  are defined by retaining respectively the zonal or 387 nonzonal coefficients in (8) as described in §3.1. To define a time-average, the graph 388 of g(t) should tend to a horizontal line as t increases. Small fluctuations will always 389 arise as the length of the time-series is extended. To estimate the time needed to 390 obtain the mean dipole field we define the parameter  $\tau_{ave}$  as the time after which 391 fluctuations in  $\overline{g_1^0(t)}$  do not exceed 1% of the final value of  $\overline{g_1^0}$ . This strategy will 392 yield an underestimate for short runs. 393

Figure 4 shows the time variation of  $g_1^0$  and  $\overline{g_1^0}$  for PADM2M. Field reversals 394 cause a sudden change in  $\overline{g_1^0}$ , leading to a lack of stability from 2.0 - 0.78 Ma when 395 the field reverses regularly. Since the most recent reversal  $\overline{g_1^0}$  appears to flatten out; 396 fluctuations reduce to < 1% of the final value after  $\tau_{ave} = 1.8$  Myr of averaging. If 397 the running average is started following the most recent reversal,  $\tau_{ave} = 600$  kyr of 398 averaging is required to obtain the mean value of  $g_1^0$ . However, as noted by Ziegler 399 et al. (2011) there are differences in the 0.78 Myr and 2 Myr averages, indicating 400 that the power spectrum for the actual field is not flat at long periods. 401

Figure 5 shows the time variation of  $\overline{g_1^0}$  for four geodynamo simulations. The 402 starting time has been picked arbitrarily, but further calculations verify that it does 403 not change the results. In most cases the value of  $\tau_{ave}$  (see Table 2) is comparable 404 to the length of the simulation (compare to Table 1 with one time unit equal to 405  $2 \times 10^5$  yrs for the diffusive scaling). The long-term variations in the running averages 406 shown in Figure 5 suggest that larger values of  $\tau_{ave}$  may be obtained if the simulations 407 were run for longer. Indeed, it is expected based on the running average for PADM2M 408 that future reversals in models C8 and C10 (which are in the dipole reversing regime) 409 will destabilise the running average, while the values of  $\tau_{ave}$  obtained for the non-410 reversing models C1-4 and C4 are already longer than any period of stable polarity 411

<sup>412</sup> covered by PADM2M. Making the assumption that the values of  $\tau_{ave}$  in Table 2 are <sup>413</sup> robust gives  $0.3 \leq \tau_{ave} \leq 2.2$  Myr, which exceeds the magnetic diffusion timescale <sup>414</sup> and amounts to many dipole decay times (magnetic diffusion time divided by  $\pi^2$ <sup>415</sup> (Olson et al., 2012)).

Figure 5 also shows that the nonzonal component,  $\overline{g_{nz}}$ , reduces to less than 2% of  $|\overline{g}|$  within ~400 kyr of averaging in all simulations except the model with Rm = 564. The magnitude and variation of  $\overline{g_{nz}}$  is much less than  $\overline{g_z}$ . After an initial transient period at the start of the running average (not associated with the start of the dynamo simulation) the variations in  $\overline{g}$  tend to be reflected in  $\overline{g_z}$ . By far the biggest contribution to  $\overline{g_z}$  is from  $g_1^0$ .

We now consider the spatial CMB power spectrum, obtained by averaging the 422 entire time-series of Gauss coefficients for each simulation (Figure 6). Power in equa-423 torially antisymmetric modes,  $R_{EA}$ , is much greater than power in equatorially sym-424 metric modes,  $R_{ES}$ , in all simulations.  $R_{EA}$  is characterised by a zigzag pattern with 425 peaks at odd l. This pattern has been found in other dynamo simulations (Dormy 426 et al., 2000; Christensen and Olson, 2003; Coe and Glatzmaier, 2006; Christensen 427 and Wicht, 2007; Driscoll and Olson, 2009). The zonal spectrum,  $R_z$ , has a very 428 similar shape to  $R_{EA}$  and further investigation shows that the zonal modes make the 429 dominant contribution to  $R_{EA}$ , as could be anticipated from Figure 5. Energy in  $R_{ES}$ 430 and  $R_{nz}$  increases with Rm, except for the simulation with Rm = 130, which includes 431 lateral variations in outer boundary heat-flux. Nevertheless, because power in  $R_{EA}$ 432 is greater than power in  $R_{ES}$ , the overall spectrum is dominated by EA modes and 433 retains the zigzag pattern. All of our models with a homogeneous outer boundary 434 heat-flux and a zigzag time-averaged spatial spectrum generate time-averaged fields 435 that are axial-dipole dominated with very little non-axisymmetric structure. 436

<sup>437</sup> A simple measure of the zigzag spectrum is obtained by dividing the sum of odd

<sup>438</sup> *l* components of the time-averaged nondipole (l > 1) power spectrum by the sum of <sup>439</sup> even *l* components up to degree L = 10. This quantity, EA/ES is provided in Table 2 <sup>440</sup> for all models and is generally  $\gg 1$ , as expected for a spectrum characterised by a <sup>441</sup> zigzag shape. Exceptions to this are model F1, which has been run for less than one <sup>442</sup> time unit, and models C4 and C5, which both incorporate a laterally-varying outer <sup>443</sup> boundary heat-flux. The significance of the outer boundary condition is discussed <sup>444</sup> further below.

The running averages in Figure 5 suggest that the zigzag spectrum may emerge for 445 averaging times much shorter than those required to obtain stable mean fields because 446 the nonzonal and equatorially symmetric contributions average out relatively quickly. 447 Figure 7 shows power spectra averaged over successively longer time periods for 448 four geodynamo simulations. Average spectra are very different from instantaneous 449 spectra because nonzonal and equatorially symmetric terms average out. Surface 450 spectra for model C1-4 (Rm = 261) show that the zigzag pattern emerges after 451 15 kyr and remains thereafter. In this model l = 7 is anomalous in the sense that 452 it is low compared to the adjacent even values of l = 6 and l = 8 modes, while all 453 other odd l up to l = 10 are higher than the adjacent even l. The surface spectrum 454 for model C1-4 averaged over 1000 kyr looks very similar to that averaged over 15 455 kyrs. Models C8 (Rm = 356) and C10 (Rm = 500) display spectra with the zigzag 456 pattern after 10 and 15 kyr respectively. Model C4 (Rm = 130), which includes 457 lateral variations in outer boundary heat-flux, displays the zigzag spectrum in the 458 3 kyr average but not in the 10, 15 and 20 kyr averages. In this case the  $h_2^1$  and  $g_3^2$ 459 Gauss coefficients are much larger than in the homogeneous geodynamo simulations 460 and make significant contributions to the average spectra (Davies et al., 2008). 461

## 462 5. Discussion and Conclusions

We have used a suite of geodynamo simulations to investigate long-term geomag-463 netic field behaviour. Simulations were selected based on agreement between the 464 synthetic and observed magnetic fields in terms of five quantities. Four of these were 465 defined by Christensen et al. (2010) and relate to the field morphology. We em-466 ployed a fifth quantity describing temporal field variations by a power law fit to the 467 frequency spectrum of the axial dipole moment and required that synthetic spectra 468 follow the same power law to within the observationally-determined errors. Seven of 469 19 models were rejected based on this criterion, indicating a sensitivity that is not 470 overly restrictive. 471

Our application of the morphological criteria differs from that of Christensen 472 et al. (2010): instead of dealing with the average we treated gufm1 and CALS3k.4b 473 separately and divided all simulation time-series into intervals 400 and 3000 years 474 long, applying the criteria to each interval separately. The misfit ratings vary signifi-475 cantly over time in our simulations. Short term averages can meet the morphological 476 criteria for being Earth-like, leading to conclusions that might not be supported by 477 longer term averages. We also found that some simulations display markedly differ-478 ent levels of agreement for gufm1 and CALS3k.4b. This suggests that each global 479 field model should be treated separately when compared to geodynamo simulations. 480 Similar issues may pertain to comparisons of the dipole moment. We chose to con-481 duct a detailed analysis based on the PADM2M axial dipole moment model (Ziegler 482 et al., 2011); this lengthy process could be attempted for other such models. 483

Over half of the models rejected on the basis of morphological comparisons, together with the additional criterion for temporal agreement based on the power spectra, lie inside the wedge-shaped region (Figure 1) defined in terms of magnetic Ekman

number and magnetic Reynold's number that Christensen et al. (2010) found to con-487 tain Earth-like dynamo models (models satisfying the criteria) for their extensive 488 suite of simulations. The region where Earth-like dynamo models exist in  $E_{\eta} - Rm$ 489 space must be bounded from below because there is a minimum Rm for dynamo 490 action; it is likely bounded from above because multipolar fields are generally ob-491 tained when the dynamo is strongly driven. Whether there exists a single region of 492 parameter space where simulations exhibit similar spatio-temporal characteristics to 493 the Earth seems to require more work. 494

It is interesting to note that three of the four simulations with an imposed hetero-495 geneous outer boundary heat-flux and relatively low Rm (125 - 137) achieve good 496 morphological similarity ( $\chi^2 < 4$  at some time) with the observed field. Of these 497 three models, two also pass our temporal criterion. These models do not reverse, but 498 can produce long-term fluctuations associated with the partial locking of convec-499 tive structures to the boundary anomalies (Davies et al., 2008). It would be highly 500 desirable to explore heterogeneous boundary conditions at higher Rm to establish 501 whether the excellent morphological agreement persists. 502

The majority (16/19) of our simulations that successfully match the morphology 503 of the modern field in at least one interval exhibit poor morphological agreement with 504 the observed field over more than half their duration. Extrapolating these results 505 to the geomagnetic field comes with the usual caveats that the simulations operate 506 with parameters that are very different to those pertaining to Earth's core. By 507 selecting simulations based on the five criteria described above we have confidence 508 that the spatio-temporal characteristics of the models resemble those of the data, 509 even if the physics in the model is not completely faithful to the core. Assuming the 510 simulation results can be extrapolated to the Earth, the past field may often have 511 been morphologically different from the modern field. 512

Simulations satisfying the five criteria were used to investigate the field behaviour 513 on timescales where the nondipole part of the field is poorly constrained by obser-514 vations. We found that the length of time needed to obtain a converged estimate 515 of the dipole field strength was comparable to the length of the simulation in the 516 majority of cases, including models that did not reverse polarity. Reversals tend to 517 destabilise the running average. These results suggest that long periods of stable po-518 larity spanning many magnetic diffusion times are needed to obtain robust estimates 519 of the mean dipole field strength. 520

We find that long-term fluctuations in the simulated magnetic fields are due al-521 most entirely to the axial dipole, with the running average of the non-axial dipole 522 field stabilising after only a few tens of kyrs. Furthermore, we find that, in all simu-523 lations, the spatial power spectrum at the CMB is characterised by a zigzag pattern 524 with high power in odd harmonic degrees. Our results suggest that this spectral 525 pattern may emerge after as little as 15 - 20 kyr of averaging. The numbers depend 526 on the choice of scaling for the dimensionless numerical timestep. An alternative 527 scaling based on the advection timescale will give smaller averaging times than the 528 diffusive scaling if Rm in the simulation is smaller than Rm in the Earth (as is the 529 case here), equal if the two values of Rm are equal, and larger otherwise. 530

Changes in the shape of the CMB power spectrum with increasing averaging 531 time may yield important insights into the long-term morphology of the geomagnetic 532 field. Figure 8 shows surface power spectra for the observational model CALS10k.1b, 533 the longest global model currently available, averaged over several different time 534 intervals. Zigzag patterns in the spectra with dominance by odd degrees can be seen 535 in 1 kyr and 5 kyr averages over some windows but not others; the same is true 536 of the dynamo simulations for these window sizes. However, the 10 kyr-averaged 537 spectrum for CALS10k.1b does not display such a pattern. There are hints that 538

this is due to decreasing model resolution as the model extends further back in time where the inherent lack of resolution with limited data quality and poor coverage in the southern hemisphere is especially pronounced. Alternatively, it may reflect an interesting property about the structure of the geomagnetic field. An observational geomagnetic field model spanning a period of 15 - 20 kyr with resolution up to harmonic order 5 would be the ideal test of the predictions made in this work.

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Label	E	Pm	Pr	RaE	Н	$\epsilon$	BC	Rm	Т	Reg	$\%(\chi^2)_g^d$	$\%(\chi^2)^d_c$	$\%(\chi^2)^a_g$	$\%(\chi^2)^a_c$
A1	1	1	0.1	40	В	0	TF	78	100	DN	0.04	0.0	0.0	0.0
B1	0.5	1	0.1	150	В	0	TF	278	9	DR	1.3	0.0	2.5	0.0
B2	0.5	10	1	200	В	0	TF	326	2	DN	0.3	0.0	0.5	0.0
B3	0.5	10	1	400	В	0	TF	475	1.2	DR	0.0	0.0	0.0	0.0
B4	0.5	5	1	300	В	0	TF	227	8	MR	0.0	0.0	0.0	0.0
C1-2*	0.12	2	1	20	B/I	0	TF	126	8	DN	73.9	39.2	57.4	14.9
C1-3*	0.12	2	1	50	B/I	0	TF	199	8	DN	58.7	0.1	39.4	0.0
C1-4*	0.12	2	1	100	B/I	0	TF	261	4.2	DN	36.8	13.5	22.0	2.3
C1-5*	0.12	2	1	200	B/I	0	TF	650	0.3	DR	7.5	10.3	9.1	5.0
C2-2*	0.12	2	1	20	B/I	0	TF	78	10	DN	0.1	43.3	0.0	6.3
C2-3*	0.12	2	1	50	B/I	0	TF	105	3	DN	39.5	52.9	6.2	16.7
C2-5*	0.12	2	1	200	B/I	0	TF	269	0.6	DN	41.4	19.7	30.0	5.0
C3-2*	0.12	2	1	20	В	0	TF	72	12	DN	28.5	39.9	4.7	15.2
C3-3*	0.12	2	1	50	В	0	TF	102	10	DN	25.0	7.9	14.1	5.9
C3-4*	0.12	2	1	100	В	0	TF	153	2	DN	46.0	14.6	34.7	7.7
C3-5*	0.12	2	1	200	B/I	0	TF	427	1	MR	0.0	0.0	0.0	0.0
C4	0.12	10	1	34.9	I	0.3	TF	130	10	DN	2.1	4.9	0.9	0.0
C5	0.12	10	1	34.9	I	0.6	TF	125	6.5	DN	3.1	5.9	1.9	2.9
C6	0.12	10	1	57.5	I	0.6	TF	192	1.4	DN	0.3	0.0	0.0	0.0
C7	0.12	10	1	34.9	I	0.9	TF	137	10	DN	5.3	3.0	3.5	0.0
C8	0.12	10	1	150	В	0	TF	356	2	DR	4.5	3.4	5.2	2.9
C9	0.12	10	1	150	В	0.9	TF	353	2	DN	0.0	0.0	0.0	0.0
C10	0.12	10	1	300	В	0	TF	564	1.8	DR	11.6	15.2	12.8	14.8
D1	0.10	3	1	350	В	0	$\mathbf{FF}$	154	0.5	-	2.1	1.1	0.8	0.0
D2	0.10	3	1	255	В	0	TF	192	0.1	-	5.9	0.0	3.0	0.0
E1	0.06	3	1	765	В	0	$\mathbf{FF}$	264	0.1	-	14.3	0.0	8.4	0.0
E2	0.06	3	1	380	В	0	FF	164	0.2	-	7.8	0.0	3.9	0.0
E3	0.06	2	1	765	В	0	FF	184	0.2	-	15.4	0.0	8.5	0.0
F1	0.02	1	0.1	60	I	0	TF	198	1	DN	47.0	29.1	40.0	16.7

F2	0.02	1	0.1	240	В	0	TF	500	0.5	-	27.3	21.1	27.9	18.2
G1	0.005	1	0.1	120	В	0	TF	401	0.1	-	22.0	7.1	8.3	16.7
Table 1: Geodynamo simulations used in this work. $E = \text{Ekman number } (\times 10^{-3});$														

Pm = magnetic Prandtl number; Pr = Prandtl number; Ra = Rayleigh number. H = heating mode used to drive the dynamo: bottom heating (B) or internal heating (I).  $\epsilon =$  amplitude of thermal anomalies imposed at the outer boundary;  $\epsilon = 0$  refers to a homogeneous outer boundary, otherwise the pattern is derived from seismic tomography. BC= thermal boundary condition with the first letter referring to the inner boundary and the second letter referring to the outer boundary: T=fixed temperature; F=fixed heat-flux.  $Rm = \sqrt{(2E_K/V_s)}$ , the magnetic Reynolds number, where  $E_K$  is the time-averaged nondimensional kinetic energy and  $V_s = 14.59$  is the nondimensional volume of the fluid shell. T =length of the simulation in units of  $d^2/\eta$ . Reg= dynamo regime following Olson and Christensen (2006): DN=dipoledominated, non-reversing; DR=dipole-dominated, reversing; MR=multipolar, reversing.  $\%(\chi^2)$  indicates the percentage of windows with  $\chi^2 < 4$  when comparing to gufm1 (subscript g) and CALS3k.4b (subscript c) using the diffuse time scaling (superscript d) and advective time scaling (superscript a). Simulations denoted by an asterisk are driven by buoyancy profiles described in Davies and Gubbins (2011) where the formulation for the basic heating model can be found. Further description of the simulations can be found in the text.

Label	Rm	a	b	$n_b$	С	$n_c$	$cf_{ m li}$	$ au_{ave}$	EA/ES
C1-2	126	0.4	0.03	-2.0	80	-6.4	9	$0.6\ (0.08)$	148
C1-3	199	0.3	0.009	-1.6	80	-6.0	9	0.8(0.2)	193
C1-4	261	1.4	0.07	-2.2	80	-5.8	6	0.9(0.3)	156
C1-5	650	-	1.72	-2.3	60	-5.5	-	-	-
C2-2	78	1.2	0.04	-2.2	52	-4.6	2	1.2 (0.1)	125
C2-3	105	1.2	0.03	-2.3	80	-6.7	4	0.5  (0.06)	21
C2-5	269	0.2	0.006	-1.6	80	-5.9	9	0.3  (0.1)	14
C3-2	72	0.5	0.03	-2.0	80	-6.5	2	2.2 (0.2)	71
C3-3	102	0.5	0.07	-2.1	80	-6.5	11	$0.3\;(0.03)$	65
C3-4	153	0.3	0.11	-2.0	80	-6.2	19	0.4  (0.07)	38
C4	130	2.8	0.19	-2.1	80	-6.3	8	1.9 (0.2)	6
C5	125	130	0.06	-1.9	9	-6.0	2	2.2 (0.3)	2
C7	137	1.0	0.01	-1.8	80	-6.4	3	0.7  (0.1)	7
C8	356	0.9	3.51	-2.2	80	-6.5	27	0.3  (0.1)	114
C10	564	0.1	1.00	-1.9	950	-6.5	38	0.3(0.2)	77
D1	154	-	0.94	-3.8	3	-7.0	-	-	-
F1	198	-	3.10	-2.2	80	-5.4	-	-	-
F2	500	0.7	3.44	-2.2	200	-5.6	52	0.07  (0.04)	7
G1	401	-	0.20	-2.9	70	-4.9	-	-	-
Sint-800		0.39	0.07	-1.9	500	-6.0	14.1		
Sint-2000		1.35	0.27	-2.3	$4.2 \times 10^{-9}$	-3.0	9.8		
Sint-2000 <sup>+</sup>		1.63	0.07	-1.9	$2.3\times10^{-10}$	-2.1	8.3		
PADM2M		0.99	0.08	-2.1	3	-6.2	7.7	0.6 (Brunhes)	
				$\pm 0.2$		$\pm 0.5$	$\pm 210$	1.8 (2  Myr)	
PADM2M <sup>+</sup>		0.58	0.07	-2.1	4	-6.3	10.1	0.6 (Brunhes)	
				$\pm 0.2$		$\pm 0.5$	$\pm 53$	1.8 (2  Myr)	

Table 2: Fitting parameters a (×10<sup>-6</sup>), b (×10<sup>-3</sup>), c (×10<sup>5</sup>),  $n_b$  and  $n_c$  that give the best-fitting power-law spectrum to PADM2M for each simulation.  $cf_{\rm li}$  (Myr<sup>-1</sup>) denotes the corner frequency between low-frequency and intermediate-frequency parts of the power spectrum.  $\tau_{ave}$  (Myr) denotes the time after which fluctuations in  $\overline{g_1^0}$ did not exceed 1% of the final value of  $\overline{g_1^0}$ .  $\tau_{ave}$  is given for the both diffusive and advective (in brackets) scalings of the model time. EA/ES denotes the ratio of total power in equatorially antisymmetric to equatorially symmetric components of the time-averaged nondipole power spectrum up to degree L = 10. Dashes indicate that the quantity was not calculated because the model did not fit the power law model for PADM2M based on the criterion described in §3.2, while models highlighted in green are deemed successful based on this criterion. + indicates that the spectrum was not prewhitened.



Figure 1: Dynamo models used in this study plotted as a function of magnetic Ekman number  $E_{\eta}$  and magnetic Reynold's number Rm following Christensen et al. (2010). Open symbols denote models where the morphological agreement between a simulated field and the fields of both gufm1 and CALS3k.4b was either good or excellent ( $\chi^2 < 4$ ) and where the synthetic dipole moment power spectrum provided a satisfactory fit to the spectrum of PADM2M. Models with black symbols were found to give poor morphological compliance, while models with grey symbols gave either good or excellent morphological compliance but did not provide a satisfactory fit to the PADM2M dipole moment spectrum. The dashed lines delineate the wedge-shaped region found by Christensen et al. (2010) to contain simulations with  $\chi^2 < 4$ . The large asterisk denotes the values of Rm and  $E_{\eta}$  estimated for the Earth.



Figure 2:  $\chi^2$  rating (left column) for three numerical geodynamo simulations. Black lines show the final rating for each model when compared to gufm1; red dashed lines for CALS3k.4b; horizontal lines indicating excellent ( $\chi^2 = 2$ ) and good ( $\chi^2 =$ 4) agreement. The right column shows the radial magnetic field  $B_r$  at the outer boundary for a single interval of 400 yrs plotted to spherical harmonic degree L = 12. The three dynamo simulations are: model B3 (top), C4 (middle) and F2 (bottom). The diffusion time scaling  $\tau^d$  has been used to scale the time axis. Further details of the models can be found in Table 1.



Figure 3: Dimensionless power spectral **36** msity (PSD) of the axial dipole magnetic field plotted against frequency f in Myr<sup>-1</sup> for the geodynamo simulations C4 (Rm =130), C1-4 (Rm = 261), C8 (Rm = 356) and C10 (Rm = 564) in Table 1, which satisfy the criteria of Christensen et al. (2010). In the top panel the simulation time has been scaled by the advection timescale,  $\tau^a$ . In the bottom panels simulation time has been scaled by the diffusive timescale,  $\tau^d$ , and solid black lines show best-fit power-law models based on the spectrum of PADM2M. See text for further details.



Figure 4: Time-series of  $g_1^0$  (blue line) and the running average of  $g_1^0$ ,  $\overline{g_1^0}$  (black line), for the model PADM2M (Ziegler et al., 2011). The green line shows  $\overline{g_1^0}$  for the last 780 kyr with a running average started following the most recent field reversal. Reversals indicated by vertical red lines. Note that PADM2M is derived from measurements of the squared field strength (Ziegler et al., 2011) and so the  $g_1^0$  we determine from PADM2M must be bounded below by zero.  $g_1^0$  does not go to zero when the field reverses due to uncertainties in timescales of the individual records combined to generate PADM2M and the smoothing applied in generating PADM2M via regularized inversion.



Figure 5: Running averages for the geodynamo simulations C4 (Rm = 130), C1-4 (Rm = 261), C8 (Rm = 356) and C10 (Rm = 564) in Table 1. Top left: the axial dipole coefficient,  $\overline{g_1^0}$ ; top right: the sum of all coefficients,  $\overline{g}$ ; bottom left: the sum of zonal (m = 0) coefficients,  $\overline{g_z}$ ; bottom right: the sum of nonzonal ( $m \neq 0$ ) coefficients,  $\overline{g_{nz}}$ . See text for details of model selection criteria.



Figure 6: Components of the core surface power spectrum for the geodynamo simulations C4 (Rm = 130), C1-4 (Rm = 261), C8 (Rm = 356) and C10 (Rm = 564) in Table 1. Top left: equatorially antisymmetric (l - m odd) power,  $R_{EA}$ ; top right: equatorially symmetric (l - m even) power,  $R_{ES}$ ; bottom left: zonal (m = 0) power,  $R_z$ ; bottom right: nonzonal ( $m \neq 0$ ) power,  $R_{nz}$ . Gauss coefficients are averaged before calculating the spectra using (6) with the averaging time given in Table 1.



Figure 7: Core surface power spectra  $R(l, r_{\rm o})$  averaged over increasing time periods (pink lines) with some averages highlighted. Models are C4 (Rm = 130, top left), C1-4 (Rm = 261, top right), C8 (Rm = 356, bottom left) and C10 (Rm = 564, bottom right).



Figure 8: Radial component of the average magnetic field in  $\mu$ T at the CMB (top) and surface power spectra for different time-averages for the observational model CALS10K.1b (Korte et al., 2011). Dashed lines represent spectra from the early part of the model (5–10 ka) which has generally poorer spatial resolution.