

Melatonin Levels and Low-Frequency Magnetic Fields in Humans and Rats: Reconciling Opposite Results with a Bayesian Regression

Nicolas F. Bouché, Kevin Mcconway

To cite this version:

Nicolas F. Bouché, Kevin Mcconway. Melatonin Levels and Low-Frequency Magnetic Fields in Humans and Rats: Reconciling Opposite Results with a Bayesian Regression. Bioelectromagnetics, In press, 40 (8), pp.539. 10.1002/bem.22218 hal-02334798

HAL Id: hal-02334798 <https://hal.science/hal-02334798>

Submitted on 27 Oct 2019

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

[Distributed under a Creative Commons Attribution - NonCommercial 4.0 International License](http://creativecommons.org/licenses/by-nc/4.0/)

Melatonin Levels and Low-Frequency Magnetic Fields in Humans and Rats: Reconciling Opposite Results with a Bayesian Regression

Nicolas F. Bouché¹ & Kevin McConway²

Submitted: 25-04-2019 ; Accepted: 27-08-2019

Abstract

Background: The present analysis revisit the impact of extremely low-frequency magnetic fields (ELF MF) on melatonin (MLT) levels in human and rat subjects using both a parametric and nonparametric approach. Method: In this analysis, we use 62 studies from review articles. The parametric approach consists in a Bayesian Logistic Regression (LR) analysis and the non-parametric approach consists of a Support Vector analysis which are designed to be robust against spurious/false results. Results: Both approach reveal a unique well ordered pattern, and show that humans and rat studies are consistent with each other once the MF strength is restricted to cover the same range (with $B \lesssim 50 \mu$ T). In addition, the data reveal that chronic exposure (longer than \sim 22 days) to ELF MF appears to decrease MLT levels only when the MF strength is below a threshold of 30μ T (log $B_{\rm thr}/\mu$ T= 1.4 $^{+0.7}_{-0.5}$ $\binom{0.7}{0.5}$ i.e. when the man-made ELF MF intensity is below that of the static geomagnetic field. Conclusions: Studies reporting an association between ELF MF and changes to MLT levels and some the opposite (no association with ELF MF) can be reconciled under a single framework.

Keywords: Statistics: Bayesian – Epidemiology – Non-ionizing Radiation, Electro-Magnetic field (EMF) – Melatonin

1 Introduction

Since the epidemiological study of Wertheimer and Leeper [1979], concerns for an adverse health effect (in particular for childhood leukemia) due to electrical and magnetic fields (MFs) generated in the Extremely Low Frequency [ELF] regime (< 300 Hz, but mostly at 50-60 Hz) by power lines have been raised in the west and also from case-reports of electrical substation workers in the former Soviet Union [e.g. Zhadin, 2001]. This potential association between residential exposure to ELF Magnetic Fields (ELF-MF) and childhood leukemia has remained from the various pooled analysis of the numerous epidemiological studies [Ahlbom et al., 2000; Savitz, 2003; Draper et al., 2005; Kheifets and Shimkhada, 2005; Schüz et al., 2007; Sermage-Faure et al., 2013; Kheifets et al., 2013; Schüz et al., 2016] revealed that the relative risk for leukemia is 2× for MF of intensities $\geq 0.4 \mu$ T. This elevated risk for childhood leukemia has led to the World Health Organization to label ELF MF as possible carcinogen 'class 2B' based on International Agency for Research on Cancer (IARC) report on the subject [IARC, 2002], a conclusion recently re-affirmed by the IARC chair on non-ionizing radiation [Schüz et al., 2016].

Historically, Stevens and Davis [1996] proposed the so-called melatonin hypothesis in the context of breast cancer involving ELF MFs discussed in the 90s [as reviewed in Brainard et al., 1999; Kliukiene et al., 2004]. Under this hypothesis, the well-known melatonin (MLT) hormone produced by the pineal gland that controls the body's sleep/wake cycle [e.g. Reiter, 1985, 1991], would be an intermediary agent where ELF MF would somehow impact MLT levels and this in turn would increase the risk of developing a disease or cancer. This hypothesis was put forward because (i) it was known by Stevens and Davis [1996] that somehow the pineal gland responds to artificial EMF [since the 80s: Stemm et al., 1980; Wilson et al., 1989, 1990; Reiter, 1992, 1993, 1994], and (ii) because MLT is an effective anti-oxident agent, free radical scavenger, and a potent oncostatic agent [e.g. Panzer and Viljoen, 1997; Allegra et al., 2003; Rodriguez et al., 2004; Henshaw and Reiter, 2005; Jung and Ahmad, 2006; Reiter et al., 2016]. Thus reduced MLT levels could lead to an increase risk of cancer [e.g. Guénel et al., 1996; Kliukiene et al., 2004; Koeman et al., 2014] and other neurodegenerative illnesses [e.g. Feychting et al., 2003; Huss et al., 2007; Davanipour et al., 2014] by increasing the oxidative stress as described in Mevissen et al. [1998] and reviewed in Consales et al. [2012].

This hypothetical connection made by Stevens and Davis [1996] between circadian rhythm disruption and certain illnesses has been revisited in the context of childhood leukemia by Henshaw and Reiter [2005]. While this connection between MLT levels and ELF-MF lacked a clear mechanism, it seems to be related to the visual system since rats with severed optical nerves not longer respond to ELF-MF [Olcese and Reuss, 1985]. The exact mechanism with magneto-receptors in the retina is now a plausible scenario in light of recent developments in the study of magneto-reception from behavioural [e.g. Kirschvink and Kirschvink, 1991; Phillips and Borland, 1992; Ritz et al., 2004, 2009; Johnsen and Lohmann, 2005; Gegear et al., 2008; Malkemper et al., 2015; Yoshii et al., 2009; Bazalova et al., 2016; Wiltschko et al., 2005; Winklhofer et al., 2013; Wiltschko and Wiltschko, 2014; Wiltschko et al., 2016; Sherrard et al., 2018] and theoretical investigations [e.g. Ritz et al., 2010a; Hore and Mouritsen, 2016] where the cryptochrome CRY proteins discovered in the 90s [Ahmad, 1993; Ahmad et al., 2007; Ahmad, 1999; Chasmore et al., 1999; Chaves et al., 2011; Ahmad, 2016] would provide the radical pair mechanism postulated by Schulten et al. [1978] and be the (light-dependent) MF receptor [Ritz et al., 2010b; Liedvogel and Mouritsen, 2010; Hore and Mouritsen, 2016; Michael et al., 2017]. CRY proteins are widely expressed in cones, amacrine cells of the retina [e.g. Foley et al., 2011; Wong et al., 2018] and are thought to be the prime MF receptors involved in avian compass.

As discussed in Lagroye et al. [2011], CRYs which are ubiquitous, and recently discovered (blue) light dependent magneto-photoreceptor, should be assessed as a plausible mechanism behind some of the bioeffects of ELF MFs. CRYs are also involved in the regulation of circadian biorhythms [e.g. van der Horst et al., 1999; Yoshii et al., 2009; Ono et al., 2013; Wong et al., 2018], which led Vanderstraeten et al. [Vanderstraeten and Burda, 2012; Vanderstraeten et al., 2012, 2015; Vanderstraeten, 2017] to revive the MLT hypothesis for childhood leukemia and to formulate the cryptochrome hypothesis in the context of the epidemiological results cited above [see also Lagroye et al., 2011; Juutilainen et al., 2018]. Under this hypothesis, weak MFs in the micro-tesla range disrupt the biorhythms, leading to disrupted MLT production rendering MLT as an effective marker to be used in relation to weak MFs. Moreover, it has been shown that pulsed MFs (PMF) can also stimulate a rapid accumulation of reactive oxygen species (ROS) —a metabolite implicated in stress response and cellular ageing— but only in insect cells expressing CRY [Sherrard et al., 2018] leading Landler and Keays [2018] to postulate that carcinogenesis associated with power lines, PMF-induced ROS generation, and animal magnetoreception share a common mechanism.

However, the epidemiological and laboratory studies on MLT levels and ELF MF are often contradictory [see reviews by Henshaw and Reiter, 2005; Jahandideh et al., 2010; Touitou and Selmaoui, 2012; Halgamuge, 2013; Lewczuk et al., 2014]. In this paper, we use both a Bayesian analysis and a non-parametric approach on a compilation of 62 studies the evolution of MLT levels on humans and rats exposed under weak ELF MFs. Given that these studies are often inconsistent (in reporting variation or no changes in MLT levels), we are making sure to include both types of results.

2 Materials and Methods

Here, we present the compilation of 62 studies reporting MLT levels on humans $(\S 2.1)$ and rats $(\S 2.2)$ and our Bayesian methodology in (§ 2.3).

2.1 Melatonin Data on humans

Halgamuge [2013] compiled various studies on humans exposed to ELF published in the last 15-20 years where MLT levels —mostly urine (24hr)— were reported. These authors included both laboratory (short term) and epidemiological (long term) studies. From their collection of 33 studies, we noticed that some were duplicates, which were removed. We verified each entry listed in Halgamuge [2013] (their Table 4) regarding MF field strength and exposure duration, leading to some differences between their listing and this work.

Since our focus is on studying the putative effect of environmental/ambient (i.e. large scale) magnetic field on human MLT levels, mostly from power lines where the entire body is subject to the MF, we did not consider studies that involved very localized ELF such as those from electric blankets, video displays, nor cell phone usage. Furthermore, we did not consider those regarding geomagnetic storms, in-vitro studies, or involving static magnetic field.

Table 1 lists the studies from Halgamuge [2013] used in this analysis. Note that it includes the 14 studies listed in the review of Henshaw and Reiter [2005], and we included a few studies not included in the original review of Halgamuge [2013] but in the review article of Touitou and Selmaoui [2012], such as Griefahn et al. [2001]; Kurokawa et al. [2003]; Cocco et al. [2005]; Davis et al. [2006] and Warman et al. [2003]. The only study we rejected is that of Touitou et al. [2003] which is based on a small sample (30) of individuals/electrical workers preselected not to have any sleep disturbances, i.e. is biased against finding any sleep/MLT perturbation from ELF MF. We note that last study is in contrast to the recent work of Liu et al. [2014] on 854 workers showing an increase of sleep disturbance in some utility workers [see also Monazzam et al., 2014, on this subject].

In Table 1, some studies claim that MLT levels are affected, but the change is invariably in the sense of a decrease of the MLT production or a phase shift. In contrast, other studies claim that the MLT level is not affected by MFs. The effect/no-effect outcome naturally leads to logistic modelling (described in § 2.3) appropriate for such binary situations [Hosmer and Lemeshow, 2000]. The logistic approach makes no implicit assumption and is simpler than invoking a model that assumes a linear relation between MLT levels, exposure duration, etc.

Unfortunately, MLT studies are heterogeneous and there is no universal way to quantify the amount of decrease in MLT production across these studies. Thus, we assign the outcome of the studies listed in Table 1 a 1(0) depending on whether the original authors reported change (no change) in MLT levels, respectively. When the study reported 'some' change, we assign the outcome of the study a 0.5. This would correspond to, for instance, when changes were observed only for a sub-group of the study.

2.2 Melatonin Data on rats

Jahandideh et al. [2010] compiled various laboratory studies on the putative effect of ELF MF on rat MLT, whose list is reproduced in Table 2. We removed the entries that were not consistent with the original study, e.g. the entries with ID 13,14 and 15 from John et al. [1998]. In addition, we added the study of Löscher et al. [1994] and Löscher et al. [1998]. As in $\S 2.1$ we assign rat studies a 1(0) depending on whether the authors reported change (no change) in MLT levels, respectively.

Jahandideh et al. [2010] investigated whether the MF exposure duration, MF polarization and other factors play a role. They concluded that the only factor that seemed to be the most significant is the duration of exposition to ELF MF, albeit with a P-value of 0.07 implying that this factor is not significant at more than >95% level, using a model linear with exposure duration and with field strength.

2.3 A parametric bayesian analysis

As discussed in Jahandideh et al. [2010], logistic regression (LR) is a statistical technique commonly used to examine the possible relationship between a dichotomous-dependent variable (here the effect/non-effect on MLT excretion pattern) and independent variables (such as frequency, polarization, exposure duration, and MF). In general, the probability P to observe an effect (i.e. $Y = 1$) is given by the logistic function:

$$
P(Y=1) = \frac{1}{1 + \exp(-t)} = \frac{\exp(t)}{1 + \exp(t)} \equiv LR(t)
$$
\n(1)

where t is usually taken to be a linear combination of the dependent variables, X_n , i.e. $t = \alpha + \beta_1 X_1 +$ $\cdots + \beta_n X_n$. However, one should keep in mind that such a linear combination of dependent variables makes a critical assumption: namely that these variables are independent of one another. In other words, the probability to have an effect might depend on the field exposition duration and on the magnetic field strength, but the coefficient for each of these variables are assumed to be independent of one another.

In this work, we use a logistic function $(L(t); \mathbf{Eq}, 1)$ where t can be a non-linear function of the independent variables. $L(t)$ gives the probability to observe an effect $(p \equiv L(t))$, and the observed realization is given by the Bernoulli (Bern) probability distribution since the observables are dichotomous, with values at 0 or 1, which can be written as (see Supplementary Material):

$$
t = f(X_i; \theta) \tag{2}
$$

$$
p = L(t) \tag{3}
$$

$$
O \sim \text{Bern}(p) \tag{4}
$$

where \hat{O} are the simulated observables. The LR model is made robust to spurious data by including an (unknown) outlier fraction π , i.e. Eq. 3 becomes

$$
p = \pi p_{\text{out}} + (1 - \pi) L(t) \tag{5}
$$

where p_{out} is the logistic probability for outliers and π is taken from a Uniform distribution from 0 to 0.5. We use uniform priors on π and p_{out} .

Next, we will consider the following two parametric LR models. First, we use a model linear in exposure duration with $\log T$ as the single independent variables. Then, we will use a variant of the logistic model where the slope α is a function of the MF strength in a dichotomous fashion for reasons that will be clearer in § 3.4. The parametric models are

$$
\text{Model A:} \qquad t \equiv \alpha_T \left(\log_{10} T - \beta_T \right) \tag{6}
$$

$$
\text{Model B:} \qquad t \quad \equiv \quad \begin{cases} \alpha \left(\log_{10} T - \beta \right) & \text{if } B < B_t \\ \gamma \left(\log_{10} T - \beta \right) & \text{if } B \ge B_t \end{cases} \tag{7}
$$

where α, γ are the linear slope, β the transition point of the logistic function, and B_t is the threshold level for model B.

In order to find the best parameters $\hat{\theta}$ for our model, we use a Monte Carlo Markov Chain (MCMC) algorithm. Because traditional MCMC algorithms are somewhat sensitive to the step size and the desired number of steps. In what follows, we use the No-U Turn Sampler (NUTS) of Hoffman and Gelman [2014], a self-tuning variant of Hamiltonian Monte Carlo (HMC), except when the model is not continuous (as in model B) where we revert to the traditional Metropolis-Hasting sampling method. We typically use 2 MCMC chains per run and 15,000 iterations to 25,000 iterations per chain.

2.4 A non-parametric analysis

In order to investigate the inherent limitations of our parametric approach (as in any regression), we applied a non-parametric supervised classification algorithm to the data sets in order to determine whether there are robustly-defined regions in the parameter space that divide studies reporting a change in MLT levels with those that reported no change. We chose to apply the Support Vector Classification (SVC) algorithm [Cortes and Vapnik, 1995] implemented in the SVM module of the SCIKIT-LEARN python package v0.19.1 [Pedregosa et al., 2011]. Nonlinear regions were investigated, using a Gaussian RBF (Radial Basis Function) kernel which uses a Gaussian similarity measure between points in the parameter space. The use of the RBF kernel depends on two quantities, C, which describes the way in which smoothness of the boundaries of the classification regions in parameter space is traded off with misclassifications of the studies, and γ , which defines how much influence each individual study has. We used γ to be 1/number of features, and used a cross-validation technique to determine that $C \simeq 3$. Unlike the logistic regression methods, SVC does not directly give a probability of classification to each of the studies considered.

3 Results

3.1 Magnetic field strengths

Figure 1 shows the histogram of mean MF strengths for the studies compiled on humans in Table 1 (hatched) and on rats in Table 2 (solid). The strength of the static Earth magnetic field $B_0 \sim 50 \mu$ T is indicated with the vertical dotted line, but the local strength varies from ~ 30 to 60µT, depending on the latitude.

This figure shows that human studies cover the range of MF of strength from 0.1 to 50μ T, while rat studies are involving MF of higher strengths from 1 to 1000 μ T. The MF distributions for human and rat studies appear to be significantly different as a KS-test indicate the two histograms are not drawn from the same parent population, with a P-value of 0.01. This difference is perhaps due to an implicit bias induced by researchers looking to bring out a signal in the lab, i.e. induced by a dose-response expectation [as in Warman et al., 2003].

3.2 Results on human studies

Regarding model A (described in § 2.3), we use the following (uninformative) priors for the slope α and zero-point β :

$$
\alpha_T \sim \mathcal{N}(0, 10)|_{\text{lo}=-5}^{\text{up}=\text{5}} \qquad \beta_T \sim \mathcal{U}(-2, 3.5) \tag{8}
$$

where the $\mathcal{N}(\mu, \sigma)$ is the normal distribution truncated on the interval [-5,5] and U is the Uniform distribution. The best fit parameters of model A with their 95% credible intervals are $\beta = 1.3^{+1.6}_{-1.0}$ and $\alpha = 2.5^{+2.3}_{-1.8}$ (Table 3).

Figure 2(left) shows the result from the LR model A applied on the 28 human studies reporting change or no change to human MLT levels (§ 2.1). The top panel shows the data in the plane $\log B - \log T$ where the model predictive values are represented by the grey scale. The vertical line represents the best fit β parameter, i.e. where the probability to have an effect is modeled to be 0.5. The bottom panel shows the model prediction (red solid line) as a function of exposure duration T where vertical dotted-dashed lines indicating a day, a month, and a year. The shaded gray region represents the 95% posterior uncertainties, calculated using the Wilson [1927] score confidence interval for binomial distributions, verified to be a continuous representation of the uncertainties found from the MCMC posteriors. This figure shows that ELF-MFs start to have an effect on MLT levels with a probability larger than 50% at around ∼22 days.

Figure 2(right) shows the same 28 human studies where we applied a non-parametric SVC algorithm and studies reporting change, partial change and no change on MLT levels are shown in red, yellow and blue respectively. This figure confirms that the studies reporting changes in MLT levels are predominantly in the region of parameter space with long exposure duration, supporting the results from the parametric LR shown on the left panel, and is not driven by a few rogue false data points.

3.3 Results on rat studies

We performed a similar analysis on the studies available on laboratory rats (described in § 2.2) and the results are listed in Table 4. One notable diff erence between studies involving humans or rats, is that the duration coefficient α_T appears to be much weaker in the case of rat studies ($\alpha_T \approx 1.2$) than in the case of humans ($\alpha_T \approx 2.5$) and $\alpha_T \neq 0$ is much less significant for rats. However, we remind the reader that, as shown in Fig. 1, only a handful of human studies have MF strength above $\sim 50 \mu$ T, while about half of the studies on rats have MFs above this level.

3.4 Towards a unified frame work

Given that human and rat studies differ significantly in the field strengths, we show in Figure 3 the results for studies on laboratory rats when the MF strength is below (above) 45μ T¹, shown in the bottom (top) panels, respectively. These two panels clearly show that the effect on MLT levels becomes random with respect to exposure duration T when the MFs are above \sim 50µT. In both panels, the red solid line represents the best model (model A) obtained from the LR Bayesian analysis whose parameters are listed in Table 4.

Comparing Table 4 with the results of model A on humans Table 3, one sees that the statistics of change/no-change on MLT levels in rat and human studies are consistent with each other, only after restricting animal and human studies over the same range of MF strengths. The time-dependent factor is $\alpha_T = 2.5^{+2.3}_{-1.8}$ for human studies and $\alpha_T \simeq 3.0^{+1.9}_{-2.5}$ for rat studies. Furthermore the exposure duration where the MF exposure becomes significant (with a probability to affect MLT levels greater than 50%) is in both cases at $\beta_T \sim 1.0$, corresponding to ~ 10 days.

Inspired by these results, we extended our LR model to include some (unknown) threshold MF, B_t , i.e. model B introduced in § 2.3. Figure 4(left) shows the data in the $\log T$ -log B plane along with the model predictions respresented as the grey scale. Figure 4 (right) shows the non-parametric SVC analysis, and strongly supports the results from the Bayesian parametric LR. Figure 5 shows that posterior distribution on each of the parameters for model B, whose best parameters are listed in Table 4.

The best threshold value determined by the data is $\log B_t = 1.4_{-0.5}^{+0.7}$ (68% CL), i.e. the magnetic threshold is $B_t \simeq 10-65\mu$ T². We note that the transition field strength of ~ 50 μ T corresponds to two different regimes, one where the ELF MF are a mere perturbation to the ambient static terrestrial MF, which has an amplitude of $B_{\odot} \simeq 50 \mu$ T, and the other where time varting ELF MF are the sole dominant contribution. We will return to this in the discussion $(\S 3.6)$.

3.5 Model selection

In order to determine the model that performs the best, several information criteria have been proposed that penalize complex models with large number of parameters p [e.g. Raftery, 1995; Gelman et al., 2014; Sharma, 2017] such as: Schwartz's Bayesian Information Criterion (BIC= $-2\ln\mathcal{L}(\hat{\theta}) + p\log n$), Akaike's Information Criterion (AIC = $-2 \ln \mathcal{L}(\hat{\theta}) + 2 p$), the corrected (for small sample size) Akaike Information Criterion (AICc= $-2 \ln \mathcal{L}(\hat{\theta}) + 2 p + 2p(p+1)/N - p - 1$) and the popular Deviance Information Criterion

 145μ T is chosen to avoid the four studies which are at 50.0μ T.

²The threshold is somewhat loosely constrained owing to the spare sampling of MF strengths between 1 and 50 μ T in published rat studies.

 $(DIC = -2 \ln \mathcal{L}(\hat{\theta}) + 2 p_D)$ introduced by [Spiegelhalter et al., 2002]. As discussed in Gelman et al. [2014] and Sharma [2017], AIC and DIC favors the model with the best predictive performance while BIC favors the model with the smallest degrees of freedom.

However, these information criterion (BIC, AICs, DIC) are applicable only when the likelihood can be approximated by a continuous function (which is approximated by a Gaussian). When, this condition is not met, as in our case due to the discontinuity in model B, one can use the Widely Available Information Criteria [WAIC, from Watanabe, 2013] or the Leave-One-Out (LOO) Cross-Validations [e.g. Vehtari et al., 2016] technique which asymptotes to WAIC [Watanabe, 2010].

Table 5 lists the numerical values for these information criterion for the models explored in this paper and both WAIC and LOO-CV indicates that model B is slightly favored over model A.

3.6 Discussion

Our result of a threshold-dependent impact of man-made ELF MFs on MLT levels at intensities at or below B_{\odot} calls for a possible role of the geomagnetic field. Indeed, the amplitude of the static Earth MF $|B_{\odot}|$ is not constant with time as there are fluctuations on a range of time-scales, from daily fluctuations to monthly, annual variations and up to time-scales of millions of years [see e.g. Courtillot and Le Mouel, 1988] due to complex interactions between the solar wind and the magnetosphere. The daily variations are of the order of 20 to a few hundreds of nT (i.e. 1000 \times smaller than the field strength) due to the impact of the solar wind pressure in the upper atmosphere [e.g. Hitchman et al., 1998], and this led Liboff [2014] suggested that the biological genesis for interactions between living beings and weak ELF could originate from these tiny (∼50 nT) daily swing in the geomagnetic field because it is a remarkably constant effect exactly in phase with the solar diurnal change. Hence, as argued in Liboff [2014], the widespread sensitivity of biological systems to weak ELF magnetic fields is derived from the diurnal geomagnetic variations. However, while numerous studies show that MF can influence the circadian system, no study has experimentally established that the natural GMF variations can act as a reliable secondary zeitgeber.

In the context of our result of a threshold-dependent impact of man-made ELF MFs on MLT levels it is relevant to discuss the functional window discussed by Wiltschko and Wiltschko [2014] in the case of the avian magnetic compass. The functional window at $\sim 50 \mu$ T has been shown to be adaptable to variations in the static field. Indeed, Wiltschko and Wiltschko [2014] and collaborators have shown that, after a few hours, migratory birds regain their magnetic sense at other intensities both low [e.g. Winklhofer et al., 2013, as low as 4μ T] and high [Wiltschko et al., 2006, up to 92μ T]. Note the coupling between such a weak field and biological organisms [e.g. Ritz et al., 2000; Vanderstraeten and Gillis, 2010; Vanderstraeten, 2018; Hore and Mouritsen, 2016; Kattnig and Hore, 2017] is far more complex than having an 'internal compass' in their beak and appears to involve chemical reactions on spin-correlated radical pairs, even though little is understood on the downstream signalling cascade mechanism(s) [as reviewed in Nordmann et al., 2017].

3.7 Possible Limitations

Our study did not consider other possible parameters that may influence MLT excretion levels due to the lack of consistency in the parameters reported in MLT studies. In light of the main mechanism of interaction between MF and biological systems (discussed in § 3.6), such parameter might include (1) the MF polarization, (2) the amount of light and more importantly, whether or not the spectrum includes blue photons as magneto-reception appears to be blue-light dependent [e.g. Chasmore et al., 1999; Ritz et al., 2000; Gegear et al., 2008; Chaves et al., 2011; Michael et al., 2017; Vanderstraeten, 2018], (3) the intensity of blue-light [as magneto-reception might be inversely proportional to the photon flux, e.g. Vanderstraeten, 2018], (4) the time of exposure with respect to MLT rise [as suggested by Wood et al., 1998; Vanderstraeten and Burda, 2012], (5) the MF orientation with respect to the geomagnetic field since the radical pair (RP) mechanism involved in CRY might depend on the direction of the field line [Wiltschko and Wiltschko, 2014; Zhang et al., 2015], (6) the (blue) light polarization [as discussed in Stoneham et al., 2012; Hore and Mouritsen, 2016], (7) the possible adaptation time reported by Wiltschko and Wiltschko [2014] for the avian magnetic compass, (8) the age [Vanderstraeten and Burda, 2012] and genetic factors as Fedrowitz et al. [2004] indicated that significant differences might occur from different substraints of rats.

4 Conclusions

From our analysis of 62 studies on the possible variations of MLT levels in humans and rats from Jahandideh et al. [2010]; Touitou and Selmaoui [2012]; Halgamuge [2013], we examined the possible relationship between a dichotomous dependent variable (corresponding to studies showing an effect or no effect on MLT excretion pattern) and independent variables such as exposure duration and magnetic field strength using a Bayesian approach and a simple logistic regression model. We find that :

- the MF exposure duration is the most significant parameter in causing changes in MLT levels both in human (Fig. 2) and rat (Fig. 4) studies, as others have reported [e.g. Savitz, 2003; Kurokawa et al., 2003; Selmaoui and Touitou, 1995; Jahandideh et al., 2010; Vanderstraeten et al., 2012];
- human and rat studies are entirely consistent with one another, but only after matching the MF strengths to similar ranges, i.e. $B \lesssim \! 50 \mu \mathrm{T}$;
- there seems to be no dose-dependence between any change in MLT levels with MF strengths ranging from 0.5 to 100μ T as others have reported [e.g. Kato et al., 1993; Reiter, 1993; Pfluger and Minder,

1996; Halgamuge, 2013] 3 ;

• the impact of MF on MLT levels **does**, however, depend on the ELF MF strength, in the regime where ELF MFs are weaker than $B_t \sim 30\mu$ T (Fig. 5). Such a window effect was already discussed in Löscher et al. [1998].

In light of these results, we suggest to perform additional research on rats with ELF MF with intensities in the range from 20nT to 20μ T, while controlling the additional factors listed below (§ 3.7), because epidemiological studies have indicated that adverse effects on human health become noticeable at ∼0.4µT. But so far very few rat studies involved ELF MF with intensities below 5μ T. This range 20nT to a few μ T covers the regime experienced by humans in man-made and natural environments. Indeed, the natural variations of the geomagnetic field ranges from 20nT to a few hundred of nT [Hitchman et al., 1998].

Because MF strengths $> 100\mu$ T are not found in nature, studies on rats with MF strengths $> 100\mu$ T, or mT levels, might reveal a different (likely acute effect) than the duration-dependent effect discussed here, where perhaps one of the other factors listed below has become dominant.

Acknowledgments

This research did not receive any specific grant from funding agencies in the public, commercial or not-forprofit sectors. We are grateful to Prof. J. Vanderstraeten for very useful comments and perspectives on an earlier draft. The entire code used to generate the tables and figures in this paper is available on the CERN zenodo server at https://doi.org/10.5281/zenodo.3250993.

Software: This work made use of the following open-source software: Numpy [Van Der Walt et al., 2011], SCIPY [Jones et al., 2001], MATPLOTLIB [Hunter, 2007], PYMC3 [Salvatier et al., 2016] and SCIKIT-LEARN [Pedregosa et al., 2011].

References

- Ahlbom, A., Day, N., Feychting, M., Roman, E., Skinner, J., Dockerty, J., Linet, M., McBride, M., Michaelis, J., Olsen, J. H., Tynes, T., and Verkasalo, P. K. 2000. A pooled analysis of magnetic fields and childhood leukaemia. Br. J. Cancer, 83(5):692–698.
- Ahmad, M. 1993. HY4 gene of A. Thaliana encodes a protein with characteristics of a blue-light photoreceptor. Nature, 366:162–166.
- Ahmad, M. 1999. Seeing the world in red and blue: insight photoreceptors Margaret Ahmad. Curr. Opin. Plant Biol., 2:230–235.
- Ahmad, M. 2016. Photocycle and signaling mechanisms of plant cryptochromes. Curr. Opin. Plant Biol., 33:108–115.
- Ahmad, M., Galland, P., Ritz, T., Wiltschko, R., and Wiltschko, W. 2007. Magnetic intensity affects cryptochrome-dependent responses in Arabidopsis thaliana. Planta, 225(3):615–624.
- Åkerstedt, T., Arnetz, B., Ficca, G., Paulsson, L. E., and Kallner, A. 1999. A 50-Hz electromagnetic field impairs sleep. J. Sleep Res., 8(1):77–81.
- Allegra, M., Reiter, R. J., Tan, D.-X., Gentile, C., Tesoriere, L., and Livrera, M. A. 2003. The chemistry of melatonin's interaction with reactive species. J. Pineal Res., 34:1–10.
- Bakos, J., Nagy, N., Thuróczy, G., and Szabó, L. D. 1995. Sinusoidal 50 Hz 500 μ T magnetic field has no acute effect on urinary 6-sulphatoxymelatonin in wistar rats. Bioelectromagnetics, 16(6):377-380.
- Bakos, J., Nagy, N., Thuróczy, G., and Szabó, L. D. 1997. Urinary 6-Sulphatoxymelatonin Excretion Is Increased in Rats after 24 Hours of Exposure to Vertical 50 Hz, 100 μ T Magnetic Field. Bioelectromagnetics, 18(2):190–192.
- Bakos, J., Nagy, N., Thuróczy, G., and Szabó, L. D. 1999. Urinary 6-sulphatoxymelatonin excretion of rats is not changed by 24 hours of exposure to a horizontal 50-hz, 100-mut magnetic field. Electro- Magnetobiol., 18(1):23–31.
- Bakos, J., Nagy, N., Thuróczy, G., and Szabó, L. D. 2002. One Week of Exposure to 50 Hz, Vertical Magnetic Field Does Not Reduce Urinary 6-Sulphatoxymelatonin Excretion of Male Wistar Rats. Bioelectromagnetics, 23(3):245–248.
- Bazalova, O., Kvicalova, M., Valkova, T., Slaby, P., Bartos, P., Netusil, R., Tomanova, K., Braeunig, P., Lee, H.-J., Sauman, I., Damulewicz, M., Provaznik, J., Pokorny, R., Dolezel, D., and Vacha, M. 2016. Cryptochrome 2 mediates directional magnetoreception in cockroaches. Proc. Natl. Acad. Sci. U.S.A., 113(6):201518622.
- Brainard, G. C., Kavet, R., and Kheifets, L. 1999. The relationship between electromagnetic field and light exposures to melatonin and breast cancer risk:. J. Pineal Res., 26:65–100.

³Note this conclusion is not in contradiction with the dose-response effect reported in epidemiological studies at the 0.1–0.5 $\mu \mathrm{T}$ levels.

- Burch, J. B., Reif, J. S., Noonan, C., and Yost, M. G. 2000. Melatonin metabolite levels in workers exposed to 60-Hz magnetic fields: work in substations and with 3-phase conductors. Journal Of Occupational Environmental Medecine, 42(2):136.
- Burch, J. B., Reif, J. S., Yost, M. G., Keefe, T. J., and Pitrat, C. A. 1998. Nocturnal excretion of a urinary melatonin metabolite among electric utility workers. Scand. J. Work. Environ. Health, 24(3):183–189.
- Burch, J. B., Reif, J. S., Yost, M. G., Keefe, T. J., and Pitrat, C. A. 1999. Reduced excretion of a melatonin metabolite in workers exposed to 60 Hz magnetic fields. American J. Epidemiol., 150(1):27–36.
- Chacón, L. 2000. 50-Hz sinusoidal magnetic field effect on In Vitro pineal N-acetyltransferase activity. Electro- Magnetobiol., 19(3):339–343.
- Chasmore, A. R., Jarillo, J. A., Wu, Y.-L., and Liu, D. 1999. Cryptochromes: Blue Light Receptors for Plants and Animals. Science, 284(April):760–766.
- Chaves, I., Pokorny, R., Byrdin, M., Hoang, N., Ritz, T., Brettel, K., Essen, L. O., van der Host, G. T., Batschauer, A., and Ahmad, M. 2011. The Cryptochromes: Blue Light Photoreceptors in Plants and Animals. Annu. Rev. Plant Biol., 62:335–364.
- Cocco, P., Cocco, M. E., Paghi, L., Avataneo, G., Salis, A., Meloni, M., Atzeri, S., Broccia, G., Ennas, M. G., Erren, T. C., and Reiter, R. J. 2005. Urinary 6-sulfatoxymelatonin excretion in humans during domestic exposure to 50 hertz electromagnetic fields. Neuroendocrinology Letters, 26(2):136-142.
- Consales, C., Merla, C., Marino, C., and Benassi, B. 2012. Electromagnetic Fields, Oxidative Stress, and Neurodegeneration. InterNatl. J. (Wash.) of Cell Biology, 2012:e683897.
- Cortes, C. and Vapnik, V. 1995. Support-Vector Networks. Machine Learning, 20:273–297.
- Courtillot, V. and Le Mouel, J. L. 1988. Time variations of the earth's magnetic field From daily to secular. Annu. Rev. Earth Planet. Sci., 16:389–476.
- Crasson, M., Beckers, V., Pequeux, C., Claustrat, B., and Legros, J. J. 2001. Daytime 50 Hz magnetic field exposure and plasma melatonin and urinary 6-sulfatoxymelatonin concentration profiles in humans. J. Pineal Res., 31(3):234–241.
- Davanipour, Z., Tseng, C.-C., Lee, P.-J., Markides, K. S., and Sobel, E. 2014. Severe Cognitive Dysfunction and Occupational Extremely Low Frequency Magnetic Field Exposure among Elderly Mexican Americans. British J. Med. and medical research, 4(8):1641–1662.
- Davis, S., Kaune, W., Mirick, D., Chen, C., and Richard, S. 2001. Residential Magnetic Fields, Light-at-Night, and Nocturnal Urinary 6-Sulfatoxymelatonin Concentration in Women. American J. Epidemiol., 154(7):591–600.
- Davis, S., Mirick, D. K., Chen, C., and Stanczyk, F. Z. 2006. Effects of 60-Hz Magnetic Field Exposure on Nocturnal 6-Sulfatoxymelatonin, Estrogens, Luteinizing Hormone, and Follicle-Stimulating Hormone in Healthy Reproductive-Age Women: Results of a Crossover Trial. Ann. Epidemiol., 16(8):622–631.
- Draper, G., Vincent, T., Kroll, M. E., and Swanson, J. 2005. Childhood cancer in relation to distance from high voltage power lines in England and Wales: a case-control study. BMJ , 330(7503):1290.
- Fedrowitz, M., Kamino, K., and Lo, W. 2004. Significant Differences in the Effects of Magnetic Field Exposure on 7 , 12- Dimethylbenz (a) anthracene-Induced Mammary Carcinogenesis in Two Substrains of Sprague-Dawley Rats. Cancer Res., 64:243–251.
- Fedrowitz, M., Westermann, J., and Löscher, W. 2002. Magnetic Field Exposure Increases Cell Prolif. but Does Not Affect Melatonin Levels in the Mammary Gland of Female Sprague Dawley Rats 1. Cancer Res., 62(13):1356–1363.
- Feychting, M., Jonsson, F., Pedersen, N. L., and Ahlbom, A. 2003. Occupational magnetic field exposure and neurodegenerative disease. Epidemiology, 14(4):413–419.
- Foley, L. E., Gegear, R. J., and Reppert, S. M. 2011. Human cryptochrome exhibits light-dependent magnetosensitivity. Nat. Commun., 2:356.
- Gegear, R. J., Casselman, A., Waddell, S., and Reppert, S. M. 2008. Cryptochrome mediates light-dependent magnetosensitivity in Drosophila. Nature, 454:1014–1018.
- Gelman, A., Hwang, J., and Vehtari, A. 2014. Understanding predictive information criteria for Bayesian models. Statistics and Computing, 24(6):997–1016.
- Graham, C., Cook, M. R., Gerkovich, M. M., and Sastre, A. 2001a. Examination of the Melatonin Hypothesis in Women Exposed at Night to EMF or Bright Light. Environ. Health Prospectives, 109(5):501–507.
- Graham, C., Cook, M. R., and Riffle, D. W. 1997. Human melatonin during continuous magnetic field exposure. Bioelectromagnetics, 18:166–171.
- Graham, C., Cook, M. R., Riffle, D. W., Gerkovich, M. M., and Cohen, H. D. 1996. Nocturnal melatonin levels in human volunteers exposed to intermittent 60 Hz magnetic fields. Bioelectromagnetics, 17(4):263– 273.
- Graham, C., Cook, M. R., Sastre, A., Riffle, D. W., and Gerkovich, M. M. 2000. Multi-night exposure to 60 Hz magnetic fields: effects on melatonin and its enzymatic metabolite. J. Pineal Res., 28(1):1–8.
- Graham, C., Sastre, A., Cook, M. R., and Gerkovich, M. M. 2001b. All-night exposure to EMF does not alter urinary melatonin, 6-OHMS or immune measures in older men and women. J. Pineal Res., 31(2):109–113.
- Griefahn, B., Künemund, C., Blaszkewicz, M., Golka, K., Mehnert, P., and Degen, G. 2001. Experiments on the effects of a continuous 16.7 Hz magnetic field on melatonin secretion, core body temperature, and heart rates in humans. *Bioelectromagnetics*, 22(8):581-588.
- Gu´enel, P., Nicolau, J., Imbernon, E., Chevalier, A., and Goldberg, M. 1996. Exposure to 50-Hz electric field and incidence of leukemia, brain tumors, and other cancers among French electric utility workers. American J. Epidemiol., 144(12):1107–1121.
- Halgamuge, M. N. 2013. Pineal Melatonin Levels Disruption on Human Due to Electromagnetic Fields and ICNIRP Limits. Radiat. Prot. Dosim., 154(4):405–416.
- Henshaw, D. L. and Reiter, R. J. 2005. Do magnetic fields cause increased risk of childhood leukemia via melatonin disruption? Bioelectromagnetics, 26(SUPPL. 7):86–97.
- Hitchman, A. P., Lilley, F. E. M., and Campbell, W. H. 1998. The quiet daily variation in the total magnetic field: Global curves. Geophys. Res. Lett., 25:2007–2010.
- Hoffman, M. D. and Gelman, A. 2014. The No-U-Turn Sampler: Adaptively Setting Path Lengths in Hamiltonian Monte Carlo. Journal of Machine Learning Research, 15:1593–1623.
- Hore, P. J. and Mouritsen, H. 2016. The Radical-Pair Mechanism of Magnetoreception. Ann. Rev. Biophysics, 45:299–344.
- Hosmer, D. W. and Lemeshow, S. 2000. Applied logistic regression. John Wiley and Sons, Inc, 2 edition.
- Hunter, J. D. 2007. Matplotlib: A 2D Graphics Environment. Computing in Science and Engineering, 9:90–95.
- Huss, A., Egger, M., Hug, K., Huwiler-müntener, K., and Röösli, M. 2007. Source of Funding and Results of Studies of Health Effects of Mobile Phone Use : Systematic Review of Experimental Studies. Environmental Health Prospectives, 115(1):7–10.
- IARC 2002. IARC Monogr. Eval. Carcinog. Risks Hum., volume 80. Lyon, France: IARC Press.
- Jahandideh, S., Abdolmaleki, P., and Movahedi, M. M. 2010. Comparing Performances of Logistic Regression and Neural Networks for Predicting Melatonin Excretion Patterns in the Rat Exposed to ELF Magnetic Fields. Bioelectromagnetics, 31:164–171.
- John, T. M., Liu, G. Y., and Brown, G. M. 1998. 60 Hz magnetic field exposure and urinary 6 sulphatoxymelatonin levels in the rat. Bioelectromagnetics, 19(3):172–180.
- Johnsen, S. and Lohmann, K. J. 2005. The physics and neurobiology of magnetoreception. Nat. Rev. Neurosci., 6(9):703–712.
- Jones, E., Oliphant, T., Peterson, P., et al. 2001. SciPy: Open source scientific tools for Python.
- Jung, B. and Ahmad, N. 2006. Melatonin in Cancer Management: Progress and Promise. Cancer Res., 66(20):9789–9793.
- Juutilainen, J., Herrala, M., Luukkonen, J., Naarala, J., and Hore, P. J. 2018. Magnetocarcinogenesis : is there a mechanism for carcinogenic effects of weak magnetic fields ? Proc. R. Soc. B, 285:20180590.
- Juutilainen, J., Stevens, R. G., Anderson, L. E., Hansen, N. H., Kilpelainen, M., Kumlin, T., Laitinen, J. T., Sobel, E., and Wilson, B. W. 2000. Nocturnal 6-hydroxymelatonin sulfate excretion in female workers exposed to magnetic fields. J. Pineal Res., 28:97–104.
- Kato, M., Honma, K., Shigemitsu, T., and Shiga, Y. 1993. Effects of exposure to a circularly polarized 50-Hz magnetic field on plasma and pineal melatonin levels in rats. Bioelectromagnetics, 14:97–106.
- Kato, M., Honma, K., Shigemitsu, T., and Shiga, Y. 1994a. Circularly polarized 50-Hz magnetic field exposure reduces pineal gland and blood melatonin concentrations of Long-Evans rats. Neurosci. Lett., 166:59–62.
- Kato, M., Honma, K.-i., Shigemitsu, T., and Shiga, Y. 1994b. Horizontal or Vertical 50 Hz, 1 microT fields have no effect on pineal gland or plasma melatonin concentration of albino rats. Neurosci. Lett., 168:205–208.
- Kato, M., Honma, K.-I., Shigemitsu, T., and Shiga, Y. 1994c. Recovery of nocturnal melatonin concentration takes place within one week following cessation of 50 Hz circularly polarized magnetic field exposure for six weeks. Bioelectromagnetics, 15:489–492.
- Kattnig, D. R. and Hore, P. J. 2017. The sensitivity of a radical pair compass magnetoreceptor can be significantly amplified by radical scavengers. Sci. Rep., $7(1):11640$.
- Kheifets, L., Crespi, C. M., Hooper, C., Oksuzyan, S., Cockburn, M., Ly, T., and Mezei, G. 2013. Epidemiologic study of residential proximity to transmission lines and childhood cancer in California: description of design, epidemiologic methods and study population. J. Expo. Sci. Environ. Epidemiol., 25:45–52.
- Kheifets, L. and Shimkhada, R. 2005. Childhood leukemia and EMF: Review of the epidemiologic evidence. Bioelectromagnetics, 26(S7):S51–S59.
- Kirschvink, J. L. and Kirschvink, A. K. 1991. Is Geomagnetic Sensitivity Real? Replication of the Walker-Bitterman Magnetic Conditioning Experiment in Honey Bees. Am. Zool., 31:169–185.
- Kliukiene, J., Tynes, T., and Andersen, A. 2004. Residential and occupational exposures to 50-hz magnetic fields and breast cancer in women: A population-based study. American J. Epidemiol., 159(9):852–861.
- Koeman, T., van den Brandt, P. A., Slottje, P., Schouten, L. J., Goldbohm, R. A., Kromhout, H., and Vermeulen, R. 2014. Occupational extremely low-frequency magnetic field exposure and selected cancer outcomes in a prospective Dutch cohort. Cancer Causes & Control, 25:203–214.
- Kurokawa, Y., Nitta, H., Imal, H., and Kabuto, M. 2003. Acute Exposure to 50 Hz Magnetic Fields with Harmonics and Transient Components: Lack of Effects on Nighttime Hormonal Secretion in Men. Bioelectromagnetics, 24:12–20.
- Lagroye, I., Percherancier, Y., Juutilainen, J., Poulletier De Gannes, F., and Veyret, B. 2011. ELF magnetic fields: Animal studies, mechanisms of action. Prog. Biophys. Mol. Biol., 107:369–373.
- Landler, L. and Keays, D. A. 2018. Cryptochrome : The magnetosensor with a sinister side ? PLoS Biol., 16(10):e3000018.
- Levallois, P., Dumont, M., Touitou, Y., Gingras, S., Masse, B., Gauvin, D., Kroger, E., Bourdages, M., and Douville, P. 2001. Effects of electric and magnetic fields from high-power lines on female urinary excretion of 6-sulfatoxymelatonin. Americal J. Epidemiol., 154(7):601–609.
- Lewczuk, B., Redlarski, G., B, N. Z., Przybylska-gornowicz, B., and Krawczuk, M. 2014. Influence of Electric , Magnetic , and Electromagnetic Fields on the Circadian System : Current Stage of Knowledge. Biomed. Res. International, 2014:1–13. Article ID 169459.
- Liboff, A. R. 2014. Why are living things sensitive to weak magnetic fields? Electromagn. Biol. Med., 33(3):241–245.
- Liedvogel, M. and Mouritsen, H. 2010. Cryptochromes—a potential magnetoreceptor: what do we know and what do we want to know? Journal of the Royal Society Interface, 7(November 2009):S147–S162.
- Liu, H., Chen, G., Pan, Y., Chen, Z., Jin, W., Sun, C., Chen, C., Dong, X., Chen, K., Xu, Z., Zhang, S., and Yu, Y. 2014. Occupational Electromagnetic Field Exposures Associated with Sleep Quality: A Cross-Sectional Study. PLoS ONE, 9(10):e110825.
- Löscher, W., Mevissen, M., and Lerchl, A. 1998. Exposure of Female Rats to a $100-\mu$ T 50 Hz Magnetic Field Does Not Induce Consistent Changes in Nocturnal Levels of Melatonin. Radiat. Res., 150:557–67.
- Löscher, W., Wahnschaffe, U., Mevissen, M., Lerchl, A., and Stamm, A. 1994. Effects of Weak Alternating Magnetic Fields on Nocturnal Melatonin Production and Mammary Carcinogenesis in Rats. Oncology, 51:288–295.
- Malkemper, E. P., Eder, S. H. K., Begall, S., Phillips, J. B., Winklhofer, M., Hart, V., and Burda, H. 2015. Magnetoreception in the wood mouse (Apodemus sylvaticus): influence of weak frequency-modulated radio frequency fields. Sci. Rep., 4:9917.
- Mevissen, M., Häussler, M., Szamel, M., Emmendoerffer, A., Thun-Battersby, S., and Loescher, W. 1998. Complex effects of long-term 50 Hz magnetic field exposure In Vivo on immune functions in female Sprague-Dawley rats depend on duration of exposure. Bioelectromagnetics, 19(4):259–270.
- Mevissen, M., Lerchl, A., and Löscher, W. 1996a. Study on pineal function and dmba-induced breast cancer formation in rats during exposure to a 100-mG, 50-Hz magnetic field. J. Toxicol. Environ. Health, 48(2):169–186.
- Mevissen, M., Lerchl, A., Szamel, M., and Löscher, W. 1996b. Exposure of DMBA-treated female rats in a $50-Hz$, 50μ Tesla magnetic field : effects on mammary tumor growth, melatonin levels, and T lymphocyte activation. Carcinogenis, 17(5):903–910.
- Michael, A. K., Fribourgh, J. L., Gelder, R. N. V., and Partch, C. L. 2017. Invited Review Animal Cryptochromes: Divergent Roles in Light Perception, Circadian Timekeeping and Beyond †. Photochem. Photobiol., 93:128–140.
- Monazzam, M. R., Hosseini, M., Matin, L. F., Aghaei, H. A., Khosroabadi, H., and Hesami, A. 2014. Sleep quality and general health status of employees exposed to extremely low frequency magnetic fields in a petrochemical complex. J. Environ. Health Science and Engineering, 12:78.
- Nordmann, G. C., Hochstoeger, T., and Keays, D. A. 2017. Magnetoreception A sense without a receptor. PLoS Biol., 15(10):e2003234.
- Olcese, J. and Reuss, S. 1985. Evidence for the involvement of the visual system in mediating magnetic field effects on pineal melatonin synthesis in the rat. Brain Res., 333(2):382–4.
- Ono, D., Honma, S., and Honma, K.-i. 2013. Cryptochromes are critical for the development of coherent circadian rhythms in the mouse suprachiasmatic nucleus. Nat. Commun., 4:1666.
- Panzer, A. and Viljoen, M. 1997. The validity of melatonin as an oncostatic agent. J. Pineal Res., 22:184–202.
- Pedregosa, F., Varoquaux, G., Gramfort, A., Michel, V., Thirion, B., Grisel, O., Blondel, M., Prettenhofer, P., Weiss, R., Dubourg, V., Vanderplas, J., Passos, A., Cournapeau, D., Brucher, M., Perrot, M., and Duchesnay, E. 2011. Scikit-learn: Machine learning in Python. J. Mach. Learn. Res, 12:2825–2830.
- Pfluger, D. H. and Minder, C. E. 1996. Effects of exposure to 16.7 Hz magnetic fields on urinary 6 hydroxymelatonin sulfate excretion of Swiss railway workers. J. Pineal Res., 21:91–100.
- Phillips, J. B. and Borland, S. C. 1992. Behavioural evidence for use of a light-dependent magnetoreception mechanism by a vertebrate. Nature, 359:142–144.
- Raftery, A. E. 1995. Bayesian Model Selection in research. Sociological Methodoloy, 25:113–163.
- Reiter, R. J. 1985. Action Spectra, Dose-Response Relationships, and Temporal Aspects of Light's Effects on the Pineal Gland. Annals New York Academy of Sciences, 453:215–230.
- Reiter, R. J. 1991. Melatonin: the chemical expression of darkness. Molecular and Cellular Endicronology, 79:C153–C158.
- Reiter, R. J. 1992. Alterations of the Circadian Melatonin Rhythm by the Electromagnetic Spectrum: A Study in Environ. Toxicol. Regul. Toxicol. Pharmacol., 244:226–244.
- Reiter, R. J. 1993. Static and Extremely Low Frequency Electromagnetic Field Exposure: Reported Effects on the Circadian Production of Melatonin. J. Cell. Biochem., 403:394–403.
- Reiter, R. J. 1994. Melatonin suppression by static and extremely low frequency electromagnetic fields: relationship to the reported increased incidence of cancer. Review Environ. Health, 10:171–186.
- Reiter, R. J., Mayo, J. C., Tan, D.-x., Sainz, R. M., Alatorre-jimenez, M., and Qin, L. 2016. Melatonin as an antioxidant: under promises but over delivers. J. Pineal Res., 61(August 5):253–278.
- Ritz, T., Adem, S., and Schulten, K. 2000. A model for photoreceptor-based magnetoreception in birds. Biophys. J., 78:707–718.
- Ritz, T., Ahmad, M., Mouritsen, H., Wiltschko, R., and Wiltschko, W. 2010a. Photoreceptor-based magnetoreception: optimal design of receptor molecules, cells, and neuronal processing. Journal of the Royal Society Interface, 7:S135–S146.
- Ritz, T., Thalau, P., Phillips, J. B., Wiltschko, R., and Wiltschko, W. 2004. Resonance effects indicate a radical-pair mechanism for avian magnetic compass. Nature, 429:177–180.
- Ritz, T., Wiltschko, R., Hore, P. J., Rodgers, C. T., Stapput, K., Thalau, P., Timmel, C. R., and Wiltschko, W. 2009. Magnetic Compass of Birds Is Based on a Molecule with Optimal Directional Sensitivity. *Biophys.* J., 96(8):3451–3457.
- Ritz, T., Yoshii, T., and Ahmad, M. 2010b. Cryptochrome: A photoreceptor with the properties of a magnetoreceptor? Communicative and Integr. Biol., 3:24-27.
- Rodriguez, C., Mayo, J. C., Sainz, R. M., Antolin, I., Herrera, F., Martin, V., and Reiter, R. J. 2004. Regulation of antioxidant enzymes: a significant role for melatonin. J. Pineal Res., 36:1–9.
- Rosen, L. A., Barber, I., and Lyle, D. B. 1998. A 0.5 G , 60 Hz Magnetic Field Suppresses Melatonin Production in Pinealocytes. Bioelectromagnetics, 19:123–127.
- Salvatier, J., Wiecki, T. V., and Fonnesbeck, C. 2016. Probabilistic Programming in Python using PyMC. PeerJ Comput. Sci., 2:e55.
- Savitz, D. A. 2003. Health Effects of Electric and Magnetic Fields: Are We Done Yet? Epidemiology, 14(1):15–17.
- Schulten, K., Swenberg, C., and Weller, A. 1978. A biomagnetic sensory mechanism based on magnetic field modulated coherent electron spin motion. Zeitschrift für Physikalische Chemie, 111:1–5.
- Schüz, J., Dasenbrock, C., Ravazzani, P., Röösli, M., Schär, P., Bounds, P. L., Erdmann, F., Borkhardt, A., Cobaleda, C., Fedrowitz, M., Hamnerius, Y., Sanchez-Garcia, I., Seger, R., Schmiegelow, K., Ziegelberger, G., Capstick, M., Manser, M., Müller, M., Schmid, C. D., Schürmann, D., Struchen, B., and Kuster, N. 2016. Extremely low-frequency magnetic fields and risk of childhood leukemia: A risk assessment by the ARIMMORA consortium. Bioelectromagnetics, 37(3):183–189.
- Schüz, J., Svendsen, A. L., Linet, M. S., McBride, M. L., Roman, E., Feychting, M., Kheifets, L., Lightfoot, T., Mezei, G., Simpson, J., and Ahlbom, A. 2007. Nighttime exposure to electromagnetic fields and childhood leukemia: An extended pooled analysis. American J. Epidemiol., 166(3):263–269.
- Selmaoui, B., Lambrazo, J. E., and Touitou, Y. 1996. Magnetic Field and Pineal Funcion in Humans: Evaluation of Nocturnal Acute Exposure to Extremely Low Frequency Magnetic Fields on Serum Melatonin and Urinary 6-Sulfatoxymelatonin Circadian Rhythms. Life Sci., 58(18):1539–1549.
- Selmaoui, B. and Touitou, Y. 1995. Sinusoidal 50-hz magnetic fields depress rat pineal nat activity and serum melatonin. Role of duration and intensity of exposure. Life Sci., 57(14):1351-1358.
- Selmaoui, B. and Touitou, Y. 1999. Age-related differences in serum melatonin and pineal NAT activity and in the response of rat pineal to a 50-Hz magnetic field. Life Sci., 64(24):2291–2297.
- Sermage-Faure, C., Demoury, C., Rudant, J., Goujon-Bellec, S., Guyot-Goubin, A., Deschamps, F., Hemon, D., and Clavel, J. 2013. Childhood leukaemia close to high-voltage power lines - the Geocap study, 2002–2007. Br. J. Cancer, 108(9):1899–1906.
- Sharma, S. 2017. Markov Chain Monte Carlo Methods for Bayesian Analysis in Astronomy. Annual Review of Astron. Astrophys., 55:1–49.
- Sherrard, R. M., Morellini, N., Jourdan, N., El-esawi, M., Arthaut, L.-d., Niessner, C., Rouyer, F., Klarsfeld, A., Doulazmi, M., Witczak, J., Harlingue, A., Mariani, J., Mclure, I., Martino, C. F., and Ahmad, M. 2018. Low-intensity electromagnetic fields induce human cryptochrome to modulate intracellular reactive oxygen species. PLoS Biol., 16(10):e2006229.
- Spiegelhalter, D. J., Best, N. G., Carlin, B. P., and van der Linde, A. 2002. Bayesian Measures of Model Complexity anf Fit. Journal of the Royal Statistical Society Series B (Statistical Methodology), 64(4):583– 639.
- Stemm, P., Schneider, T., and Vollrath, L. 1980. Effects of an earth-strength magnetic field on electrical activity of pineal cells. Nature, 288:607–8.
- Stevens, R. G. and Davis, S. 1996. The Melatonin Hypothesis: Electric Power and Breast Cancer. Environ. Health Prospectives, 104:135–140.
- Stoneham, A. M., Gauger, E. M., Porfyrakis, K., Benjamin, S. C., and Lovett, B. W. 2012. A New Type of Radical-Pair-Based Model for Magnetoreception. Biophys. J., 102(5):961–968.
- Touitou, Y., Lambrozo, J., Camus, F., and Charbuy, H. 2003. Magnetic fields and the melatonin hypothesis: a study of workers chronically exposed to 50-Hz magnetic fields. American J. Physiol. (Lond.) Regulatory integrative and comparative physiology, 284(6):R1529–R1535.
- Touitou, Y. and Selmaoui, B. 2012. The effects of extremely low-frequency magnetic fields on melatonin and cortisol, two marker rhythms of the circadian system. Dialogues in Clin. Neurosci., 14(4):381–399.
- Tripp, H. M., Warman, G. R., and Arendt, J. 2003. Circularly Polarised MF (500 μ T 50 HZ) Does Not Acutely Suppress Melatonin Secretion from Cultured Wistar Rat Pineal Glands. Bioelectromagnetics, 24(2):118–124.
- van der Horst, G. T., Muijtjens, M., Kobayashi, K., Takano, R., Kanno, S., Takao, M., de Wit, J., Verkerk, A., Eker, A. P. M., van Leenen, D., Buijs, R., Bootsma, D., Hoeijmakers, J. H. J., and Yasui, A. 1999. Mammalian Cry1 and Cry2 are essential for maintenance of circadian rhythms. Nature, 398(6728):627–30.
- Van Der Walt, S., Colbert, S. C., and Varoquaux, G. 2011. The NumPy array: a structure for efficient numerical computation. Computing in Science and Engineering, 13(2):22–30.
- Vanderstraeten, J. 2017. Magnetic Fields and Health: From Epidemiology To Cryptochrome Chemistry. Rev Med Brux, 38:1–9.
- Vanderstraeten, J. 2018. Low-Light Dependence of the Magnetic Field Effect on Cryptochromes: Possible Relevance to Plant Ecology. Front. Plant Sci., 9(February):121.
- Vanderstraeten, J. and Burda, H. 2012. Does magnetoreception mediate biological effects of power-frequency magnetic fields? Sci. Total Environ., 417:299–304.
- Vanderstraeten, J., Burda, H., Verschaeve, L., and De Brouwer, C. 2015. Could Magnetic Fields Affect the Circadian Clock Function of Cryptochromes? Testing the Basic Premise of the Cryptochrome Hypothesis (ELF Magnetic Fields). Health Phys., 109(1):84–89.
- Vanderstraeten, J. and Gillis, P. 2010. Theoretical Evaluation of Magnetoreception of Power-Frequency Fields. Bioelectromagnetics, 31(5):371–379.
- Vanderstraeten, J., Verschaeve, L., Burda, H., Bouland, C., and Brouwer, C. 2012. Health effects of extremely low-frequency magnetic fields: reconsidering the melatonin hypothesis in the light of current data on magnetoreception. J. Appl. Toxicol., 32(12):952–958.
- Vehtari, A., Gelman, A., and Gabry, J. 2016. Practical Bayesian model evaluation using leave-one-out cross-validation and WAIC. Statistics and Computing, 27(5):1–20.
- Warman, G. R., Tripp, H., Warman, V. L., and Arendt, J. 2003. Acute Exposure to Circularly Polarized 50-Hz Magnetic Fields of 200-300 μ T Does Not Affect the Pattern of Melatonin Secretion in Young Men. The Journal of Clinical Endicronology & Metabolism, 88(12):5668–5673.
- Watanabe, S. 2010. Asymptotic Equivalence of Bayes Cross Validation and Widely Applicable Information Criterion in Singular Learning Theory. 11:3571–3594.
- Watanabe, S. 2013. A Widely Applicable Bayesian Information Criterion. Jounral of Machine Learning Research, 14:867–897.
- Wertheimer, N. and Leeper, E. D. 1979. Original Contributions. American J. Epidemiol., 109(3):553–554.
- Wilson, B., Stevens, R., and Anderson, L. 1989. Neuro-Endocrine Mediated Effects of Electromagnetic-Field Exposure - Possible Role of the Pineal-Gland. Life Sci., 45(15):1319–1332.
- Wilson, B., Wright, C., Morris, J., Buschbom, R., Brown, D., Miller, D., Sommersflannigan, R., and Anderson, L. 1990. Evidence for an Effect of Elf Electromagnetic-Fields on Human Pineal-Gland Function. J. Pineal Res., 9(4):259–269.
- Wilson, E. B. 1927. Probable inference, the law of succession, and statistical inference. J. Am. Stat. Assoc., 22:209–212.
- Wiltschko, R., Ahmad, M., Gehring, D., and Wiltschko, W. 2016. Light-dependent magnetoreception in birds: the crucial step occurs in the dark. Journal of Royal Society Interface, 13(Nov 15):20151010.
- Wiltschko, R., Ritz, T., Stapput, K., Thalau, P., and Wiltschko, W. 2005. Two Different Types of Light-Dependent Responses to Magnetic Fields in Birds. Curr. Biol., 15(16):1518–1523.
- Wiltschko, R. and Wiltschko, W. 2014. Sensing magnetic directions in birds: Radical pair processes involving cryptochrome. Biosensors, 4(3):221–242.
- Wiltschko, W., Stapput, K., Thalau, P., and Wiltschko, R. 2006. Avian magnetic compass: fast adjustment to intensities outside the normal functional window. Naturwissenschaften, 93:300–304.
- Winklhofer, M., Dylda, E., Thalau, P., Wiltschko, W., and Wiltschko, R. 2013. Avian magnetic compass can be tuned to anomalously low magnetic intensities. Proceedings of the Royal Society B, 280:20130853.
- Wong, J. C. Y., Smyllie, N. J., Banks, Gareth Tand Pothecary, C. A., Barnard, A. R., Maywood, E. S., Jagannath, A., Hughes, S., van der Horst, G. T. J., MacLaren, R. E., Hankins, M. W., Hastings, M. H., Nolan, P. M., Foster, R. G., and Peirson, S. N. 2018. "differential roles for cryptochromes in the mammalian retinal clock". The FASEB J.
- Wood, A. W., Armstrong, S. M., Sait, M. L., Devine, L., and Martin, M. J. 1998. Changes in human plasma melatonin profiles in response to 50 Hz magnetic field exposure. J. Pineal Res., 25(2):116–127.
- Yoshii, T., Ahmad, M., and Helfrich-Förster, C. 2009. Cryptochrome mediates light-dependent magnetosensitivity of Drosophila's circadian clock. PLoS Biol., 7(4):0813–0819.
- Zhadin, M. N. 2001. Review of russian literature on biological action of DC and low-frequency AC magnetic fields. Bioelectromagnetics, 22(1):27–45.
- Zhang, Y., Berman, G. P., and Kais, S. 2015. The Radical Pair Mechanism and the Avian Chemical Compass: Quantum Coherence and Entanglement. InterNatl. J. (Wash.) of Quantum Chemistry, 115:1327–1341.

Notes: (1) survey identification number as in Halganuge [2013]; (2) ELF magnetic fields on MLT excretion in human subjects taken from Halgamuge [2013].
level; (8) References.
level; (8) References. Table 1: Studies on the putative effect of ELF magnetic fields on MLT excretion in human subjects taken from Halgamuge [2013]. Notes: (1) survey identification number as in Halgamuge [2013]; (2) ELF frequency (Hz); (3) EMF strength (μ μ T); (4) Sample size; (5) Comment; (6) MF exposition duration in hours; (7) Impact on MIT excretion level; (8) References.

Table 2: Studies on the putative effect of ELF magnetic fields on MLT excretion in rats.

Notes: (1) survey identification number as in Jahandideh et al. [2010]; (2) ELF frequency (Hz); (3) EMF strength (μT) ; (4) polarization; (5) MF exposition in hours; (6) Impact on MLT excretion level; (7) Sample exposed/sham; (8) References.

Human studies				
Model A				
α	2.5 [0.7-4.9] (95%)			
B	1.3 $[0.4-2.9]$ (95%)			
π	0.3 [0.0-0.5] (95%)			
p_{out}	0.2 [0.0-0.9] (95%)			

Table 3: Results on the LR on MLT levels in humans from the logistic regression using our Bayesian analysis (see text).

	Rat studies		
	Model A	$ B \leq 45 \mu T$	$B > 45 \mu T$
α	1.2 $[-0.3-4.7]$ (95%)	3.0 $[0.5-4.9]$ (95%)	-0.3 [$-4.4-4.3$] (95%)
β	1.5 $[-1.4-3.2]$ (95%)	1.2 $[-0.0-2.2]$ (95%)	0.5 [-1.9-3.3] (95%)
π	0.3 $[0.0-0.5]$ (95%)		
p_{out}	0.6 [0.0-1.0] (95%)		
	Model B		
α	4.0 $[1.4-7.1]$ (68%)		
β	1.1 $[0.2-1.6]$ (68%)		
γ	-0.1 [$-2.9-2.5$] (68\%)		
$\log B_t$	1.4 $[0.9-2.1]$ (68%)		
π	0.3 [0.2-0.5] (68%)		
p_{out}	0.3 [0.1-0.7] (68%)		

Table 4: Results from our Bayesian LR on MLT levels in rats (see text) with confidence intervals.

model	$t(\theta)$	Data-Set	N	WAIC	LOO-CV
(1)	(2)	(3)	(4)	5)	(6)
	$\alpha(\log T - \beta)$	Humans	28	26.3	26.4
	$\alpha(\log T - \beta)$	Rats	34	47.3	47.3
	$\alpha, \gamma(\log T - \beta)$ with $\log B \leq B_t$	Rats	34	46.4	46.6

Table 5: Information Criterion for the models considered in this paper. Notes: (1) Model number; (2) Functional form t in Eq. 2; (3) Date-set; (4) Number of studies; (5) WAIC: Widely Available Information Criteria from Watanabe [2013]; (6) LOO-CV: Leave-One-Out Cross-Validations from Vehtari et al. [2016].

Figure 1: Histogram of MF strength for studies involving human (hatched) and rats (solid). The vertical dotted line represents the geomagnetic field B_{\odot} at 50 μ T. A KS-test indicate the two histograms are not drawn from the same parent population, with a P-value of 0.01.

Figure 2: Left: Bayesian Logistic Regression (model A) on human studies. The top panel shows the data in the $\log T$ –log B plane along with the model A prediction (grey scale). The vertical line shows the best fit β parameter, i.e. where the probability p for having an effect is 0.5. The bottom panel shows the data as a function of exposure duration $\log T$ and the red solid line represents the best fit logistic model with the shaded region representing the 95% posterior predictive interval. Right: Non-parametric Support Vector Classification (SVC) using a Radial Basis Function (RBF) kernel with penalty parameter $C = 3.2$ determined by cross-validation. In both panels, the x-values have been offseted by a small (random) amount to help distinguish overlapping data points.

Figure 3: Bayesian Logistic Regression (model A) on rat studies with magnetic field strength B above (below) 45μ T shown in the top (bottom) panel respectively

Figure 4: Left: Bayesian Logistic Regression (model B) on laboratory rat studies shown in the logT–log B plane shown along with the model predictions (grey scale). The horizontal dot-dashed line represents the best fit B_t threshold inferred by the model and the vertical solid line represents the best fit β parameter, i.e. where the probability p for having an effect is 0.5. Right: Non-parametric Support Vector Classification (SVC) using a RBF kernel with penalty parameter $C = 3.2$ determined by cross-validation. In both panels, the x-values hasve been offseted by a small (random) amount to help distinguish overlapping data points.

Figure 5: MCMC posterior distribution for the parameters of LR model B applied on MLT levels in rats