

# The connection between sleep spindles and epilepsy in a spatially extended neural field model

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## 4 **Abstract**

5 A connection between sleep spindles and epilepsy or in particular seizures  
6 has been stated in previous research. This is a project aiming to evaluate if  
7 this connection can be shown in a spatially extended cortical model. The  
8 model has earlier been used to generated spike and wave discharges,  
9 seizures, and it can therefore be thought to be able to show the wanted  
10 connection. The evaluation is made by changing the parameters in the  
11 cortical system when an external current is put into it. The external current  
12 is either a current of random spiking behavior or it has the pattern of sleep  
13 spindles. The conclusion of the evaluation is that this model is not  
14 sufficient enough to show the connection between sleep spindles and  
15 epilepsy.

## 18 **1 Background**

### 19 **1.1 Sleep spindles**

20 Sleep spindles are a type of oscillation that occur during one of the earlier stages of sleep, stage 2  
21 in the sleep cycle. They are present in both the beginning and the end of stage 2, which is a non  
22 REM part of the sleep cycle. Sleep spindles have the feature of waxing and waning field potential  
23 at 7-14 Hz and they last for 1-3 seconds and reoccur every 5-15 seconds. [1] Sleep spindles are  
24 generated from the thalamus [2].

### 26 **1.2 Epilepsy and seizures**

27 Epilepsy is a neurological disorder which is defined by the occurrence and reoccurrence of  
28 seizures. A seizure was in 2005 defined by Fisher et al. as a "transient of signs and/or symptoms  
29 due to abnormal excessive or synchronous neuronal activity in the brain". Hence seizures are a  
30 result of abnormal, synchronized attacks of electrical activity in restricted area of connected  
31 neurons, called the epileptogenic focus. The neurons in the epileptogenic focus should also be fast  
32 in recruiting other parts of the brain to act them same. When seizures involve most part of the  
33 brain they can cause unconsciousness while if they are more localized, focal, they only affect  
34 single parts of the body. Epilepsy can be a result of inborn abnormalities in the brain, genetic  
35 alterations concerning brain metabolism, excitability-causing proteins or brain injury.[3]

36 While looking at the pattern of seizures a distinct feature is spike and wave oscillations. A spike  
37 and wave oscillation can be shown through EEG, as has been done in figure 1 below. The  
38

39 frequency of the spike and wave oscillations are about 3 Hz in humans. This kind of pattern can be  
40 shown in one of the most common type of epileptic manifestations, absent seizures. This  
41 phenomenon, spike and wave discharges, is nonlinear and occur frequently in different kinds of  
42 epileptic disorders, especially in children. This type of seizures can also disappear with  
43 adolescence. Observation of similar seizures have been made in several animal models. [4]  
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## 1.2 The connection between sleep spindles and epilepsy

47 There are two descriptions concerning the connection between sleep spindles and seizures. One is  
48 that while a system is undergoing sleep spindle oscillations this pattern can turn in to seizures.  
49 This has been shown before in non-neural field models. [5] The other description is that sleep  
50 spindles and seizures originate from the same type of dynamical system. It has been shown that  
51 antagonizing manipulations made on sleep spindles have the same effect on seizures. [6]  
52

53

## 2 The model

54

### 2.1 Background

56 Spike and wave discharges are not well understood in terms of their spatiotemporal features, how  
57 they behave in both space and time. In earlier models spike and wave discharges were modeled as  
58 oscillations being both periodic and homogenous on a macroscopic spatial scale and therefore  
59 space independent. In the model *A spatially extended model for macroscopic spike-wave*  
60 *discharges* by Peter Neal Taylor and Gerold Baier in March 2011 a model is made that take these  
61 spatial properties into account. [7]  
62

63

64 Several experimental results point to the thalamus having a critical role in the generation of spike  
65 and wave discharges. It has been shown that if the thalamus is somehow inactivated these  
66 discharges disappear. [8] Even though, Taylor and Baier are able to generate spike-wave  
67 discharges in their cortical neural field model [9]. The cortex has also been shown having a critical  
68 role in modelling epilepsy [10].

### 2.2 Epilepsy and seizure

69 Spatially extended neural field models are systems of equations describing the spatiotemporal  
70 evolution of for example firing rate at tissue level. The Amari model is such a model. [11] Taylor  
71 and Baier simplified the Amari neural field model [12] to an ordinary differential equation of low  
72 dimension. They then extended this model and showed that it results in a model capable of  
73 generating spike and wave discharges. Further on they converted their model back to a neural field  
74 equation with three neural populations and they showed the existence of spike and wave  
75 discharges for the first time in such a model. [13]  
76

77

78 Their model is these ordinary differential equations with three variables

79

$$\dot{E}(t) = h_1 - E + w_1 f[E] - w_2 f[I_1] - w_3 f[I_2]$$

80

$$\dot{I}_1(t) = (h_2 - I_1 + w_4 f[E])/T_1$$

81

$$\dot{I}_2(t) = (h_3 - I_2 + w_5 f[E])/T_2$$

82

83 Where  $E$  stands for the excitatory population of the model while  $I_1$  and  $I_2$  stand for the two  
84 inhibitory populations of the model.  $h_i$  are the constants arising from the Amari model,  $w_i$  are the  
85 connectivity parameters and  $T_1$  and  $T_2$  are time scale parameters, for which it holds that  $T_1 < T_2$ .  
86  
87  
88

89  $f$  is the piecewise linear function with the behaviour:

90

$$f = 0 \text{ if } v \leq -1$$

91

$$f = \frac{v+l}{2 \cdot l} \text{ if } -1 < v < 1$$

92

$$f = 1 \text{ if } v \geq 1$$

93

94 where  $l > 0$  determines the steepness of the transition and  $v$  is defined as either  $E$ ,  $I_1$  or  $I_2$ .  $f$  is  
 95 replacing the Heaviside step function in the original model by Amari, which has been shown to not  
 96 be generating spike and wave discharges. In addition to the piecewise linear function a sigmoid  
 97 function is also used.

98

99 If  $w_i, i = 1, \dots, 5$  are left as constants the model is a spatially homogenous version of the Amari  
 100 model with an additional inhibitory population operating in a different time scale than the first  
 101 inhibitory population. The model is also using the piecewise linear function or the sigmoid  
 102 function. If  $w_i, i = 1, \dots, 5$  instead are set to the form of a "Mexican hat" connectivity, as in the  
 103 original Amari model, a modified version of it is constructed with an additional inhibitory  
 104 population as following:

105

$$\left. \begin{aligned} \dot{E}(i) &= h_1 - E + \sum_{j=1}^n w_1(i-j)f[E(j)] - \sum_{i=1}^n w_2(i-j)f[I_1(j)] - \sum_{i=1}^n w_3(i-j)f[I_2(j)] \\ \dot{I}_1(i) &= (h_2 - I_1(i) + w_4 f[E(i)])/T_1 \\ \dot{I}_2(i) &= (h_3 - I_2(i) + w_5 f[E(i)])/T_2 \end{aligned} \right\} (1)$$

106

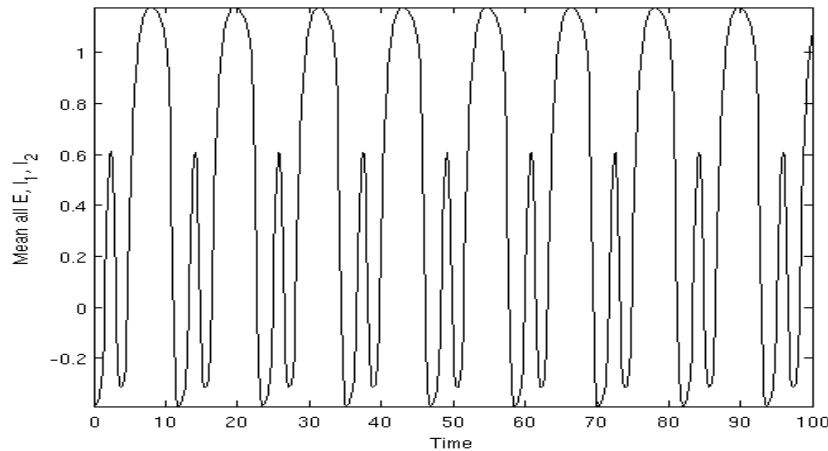
107

108 where  $n$  is the number of spatial locations.

109

110 The result is spike and wave discharges for many combinations of connectivity values  $w_i$  when  
 111 simulating this model with periodic boundary conditions for one dimension. In figure 2 below the  
 112 simulation of the model is shown for the following values for the parameters;  $h_1 = 5, h_2 = -0.9,$   
 113  $h_3 = -1.6, w_4 = 4, w_5 = 3, T_1 = 0.66$  and  $T_2 = 200$ . Where  $w_i, i = 1..3$  are built up by mexican  
 114 hat functions. [14]

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116

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118

119

Figure 2. Spike and wave discharges

120 **3 The method**

121

122 The goal is to analyse if the connection between sleep spindles and epilepsy that is described in  
123 section 1.3 can be shown in this cortical model.

124

125 **3.1 Injecting an external sleep spindle current**

126 A model of sleep spindles can be done by the following function in time [15]:

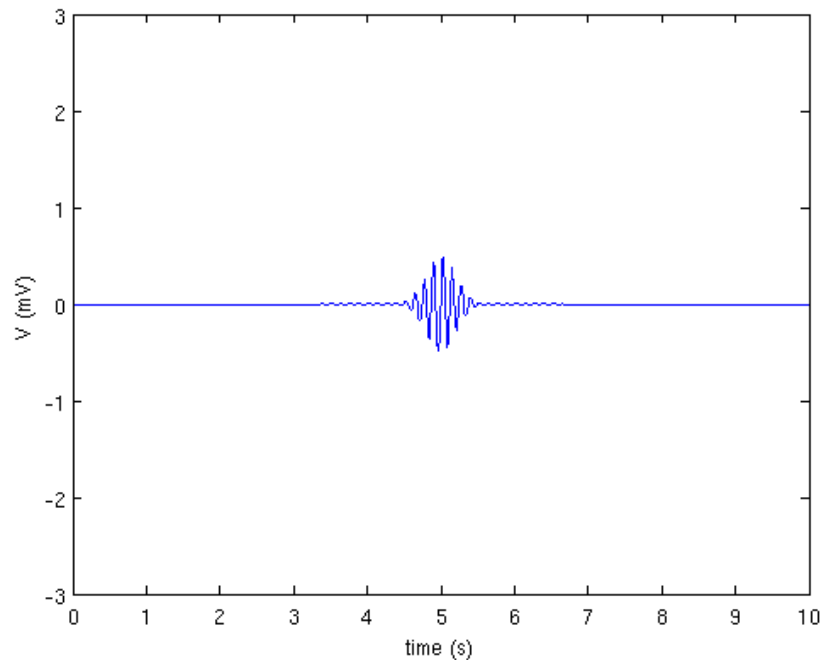
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128 
$$g(t) = \frac{c}{\sqrt{s}} g\left(\frac{t-u}{s}\right) e^{iwt} \tag{2}$$

129

130 where  $s > 0$ ,  $g(x) = e^{-x^2/2\sigma^2}$  is a gaussian function and  $\sigma$ ,  $c$ ,  $u$  and  $w$  are constants.

131 If the parameters are chosen as follows;  $s = 2$ ,  $\sigma^2 = 100$ ,  $u = 5$ ,  $w = 50$  and  $c = 1$ , the  
132 following sleep spindle model can be produced in Matlab, se figure 3 below.



133

134 Figure 3. Model of sleep spindle with frequency 8 Hz and a duration of 1.4 sec

135

136 An external current is made of the sleep spindle formation in figure 3 above reoccurring every 5-15  
137 seconds during 100 seconds. The effect of this external current, when being put into both the  
138 excitatory population and both of the inhibitory populations in system (1) in section 2.2 above, is  
139 then analysed while changing the parameters of the system. In addition, two other formations of  
140 the sleep spindle are used to generate the external current. These are of frequency 10 and 14 Hz  
141 and exist for 2.1 and 3 seconds, respectively.

142

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144

145 **3.2 Generating sleep spindle formation with the model**

146 An external current with random spiking behavior (noise) is first inserted into the excitatory  
147 population and then to the two inhibitory populations respectively in the system (1) in section 2.2  
148 above. The behavior of the system is analyzed while the parameters are changed in order to find a  
149 behavior of the system similar to that of a sleep spindle formation.

150

151 **4 Results**

152 In part 3.1 the system is showing spike and wave discharges while the parameters are set to values  
153 that are already showing this pattern without the external sleep spindle formatted current.  
154 Otherwise the external current is not turning in to seizure like behavior. In part 3.2 no parameters  
155 are found for which the system is generating a pattern similar to that of a sleep spindle.

156

157 **5 Conclusions**

158 Even though spike wave discharges, which is a phenomenon that is concerning the thalamus as  
159 well, can be shown in this cortical model the model is not sufficient enough to show the  
160 connection between sleep spindles and seizures. The model for sleep spindles that is used (2) is  
161 not taking into account the feedback the sleep spindle oscillations are given by the thalamus. What  
162 would be done in the future is expanding this model to include the thalamus and generate the sleep  
163 spindle oscillations from the thalamic neurons, injecting their output signal into the cortical model.  
164 This would be a feedback system which might would be sufficient enough to show the connection  
165 between sleep spindles and epilepsy.

166

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