

# Brain Rhythms and Mathematics

Christoph Börgers

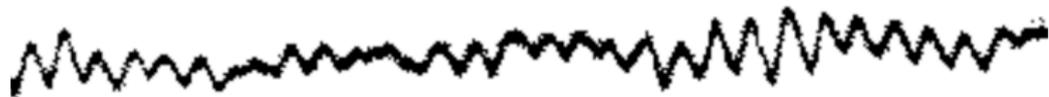
Mathematics Department  
Tufts University

April 21, 2010

## Oscillations in the human brain

In an EEG, voltages are recorded on a person's scalp.

One gets traces such as this one:



(This is one of the earliest EEG recordings ever made, by Hans Berger in the 1920s.)

**EEGs oscillate.** Since the 1920s, people have wondered exactly what oscillates in our heads, and why, and what that tells us about how our brains work.

## Oscillations have *something* to do with brain function (and also with brain disease)

- ▶ When you pay **attention**, you have strong 40 Hz oscillations in certain parts of your brain.
- ▶ As you plan a movement, you have strong 20 Hz oscillations in a certain part of your brain; they decrease in amplitude just before movement onset.
- ▶ Quiet wakefulness goes together with 10 Hz oscillations.
- ▶ **Buddhist meditation** can induce pronounced 40 Hz oscillations in the brain! (Reported in the *Proceedings of the National Academy of Sciences*, 2004.)
- ▶ Patients suffering from **Parkinson's disease** have abnormally strong 20 Hz oscillations.
- ▶ Patients suffering from **schizophrenia** have abnormally weak 40 Hz oscillations in the auditory cortex.
- ▶ **Epileptic seizures** are often preceded by abnormal very high frequency oscillations.
- ▶ ...

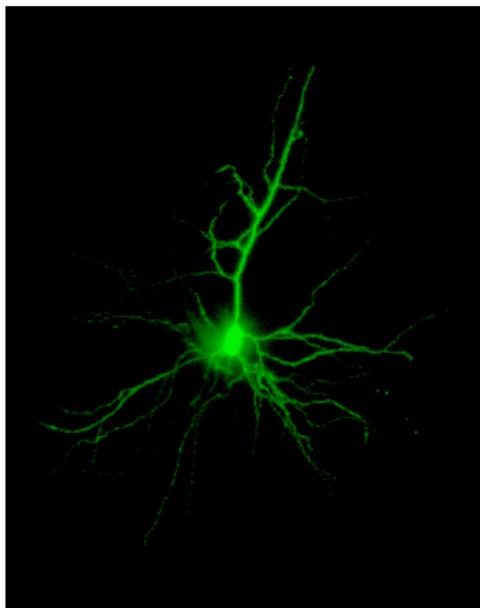
## What is a brain?

A human brain consists about a hundred billion nerve cells (“neurons”), together with a probably comparable number of support cells (“glial cells”).

To first approximation, one can assume that the neurons do all the information processing, thinking, feeling, etc.

## A brief look at individual neurons in the brain

Each of the 100,000,000,000 neurons is, by itself, an object of spectacular complexity and subtlety.



- ▶ Inside a neuron, there is a **voltage,  $V$** , that is typically negative in comparison with the water surrounding the cell. Most of the time,  $V \approx -70$  mV or so.
- ▶ Neurons can transiently open up channels in their cell membranes to let ions (charged particles) pass through. This can transiently alter  $V$ .
- ▶ Sometimes  $V$  shoots up (to values as high as +20 mV or so), then plummets back down (to the usual  $-70$  mV or so), all in the span of 1 or 2 milliseconds. We say then that the neuron has “fired”. (Alan Hodgkin and Andrew Huxley got a Nobel Prize in 1963 for a series of four papers, published in 1952, uncovering the biophysical mechanisms causing firing.)

## Neuronal communication

- ▶ Two kinds of neuronal communication: **chemical** and **electrical**. We will focus on chemical communication here.
- ▶ When a neuron fires, it releases a **neurotransmitter** that attaches to neighboring neurons, causing ion channels in their cell membranes to open up.
- ▶ About 80% of neurons in the brain are “**excitatory**” — neurotransmitters that they release tend to *raise* the voltages in neighboring neurons, promoting firing.
- ▶ The remaining 20% of neurons are “**inhibitory**” — the neurotransmitters that they release tend to *lower* voltages in neighboring neurons, counteracting firing.

## What oscillates in the brain?

Sometimes massive numbers of neurons in the brain transiently **synchronize**. For a brief period, they fire rhythmically and in synchrony.

When there are enough of them, the voltage fluctuations are so large that they can be measured on the scalp.

So the **oscillations in the EEG** reflect rhythmic, synchronized firing of huge, transient coalitions of neurons.

## What causes neurons to fire in rhythmic synchrony?

In the 1940's, [Norbert Wiener](#), one of the greatest mathematicians of the 20th century, recognized that this question is fundamentally mathematical in nature.

Norbert Wiener was an [alumnus of Tufts College](#). He is probably the most distinguished intellectual among our alumni. He graduated in 1909, at age 14, and spent most of his adult life as a Professor of Mathematics at MIT.



Norbert Wiener (right) and William Ransom (left)

(William Ransom was a Professor of Mathematics at Tufts.)

## From the brain to Calculus

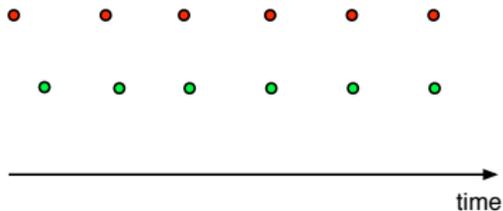
Mathematicians like to **simplify**, abstracting from complications to a point where clear understanding becomes possible, while capturing essential aspects of reality.

This is a lot like abstract painting!

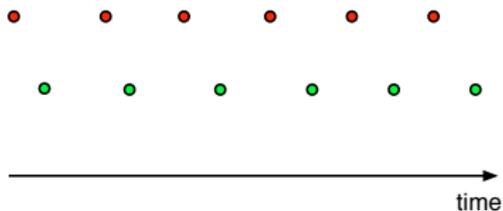
- ▶ Don't consider 100,000,000,000 neurons right away...  
**Start with just 2 neurons**, call them A and B.
- ▶ Assume that A and B, if they don't get input, **want to fire periodically** (just as the heart beats periodically), **with period = 1 time unit**. In fact, many neurons in the brain fire periodically in the absence of input from other neurons.
- ▶ Assume that the interaction between A and B is excitatory: **A's firing will cause B to fire earlier, and vice versa.**

## What exactly does synchronization of two neurons mean?

synchronization:



anti-synchronization:



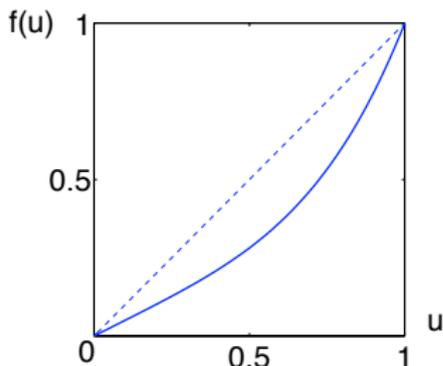
red dots: neuron A fires  
green dots: neuron B fires

## Mathematical notation

- ▶ Suppose neuron B would, in the absence of input from the other neuron, fire  $u$  time units from now ( $0 \leq u \leq 1$ ).
- ▶ Suppose neuron A fires now. This accelerates the next firing of neuron B. It will now happen  $f(u)$  time units from now, where

$$0 \leq f(u) \leq u.$$

We call  $f$  the “interaction function”. It might look like this:



- ▶ B acts on A the same way: We could reverse the letters “A” and “B” above.

## The strobe light idea

Charles S. Peskin, 1975

The key idea that turns our synchronization problem into a Calculus problem:

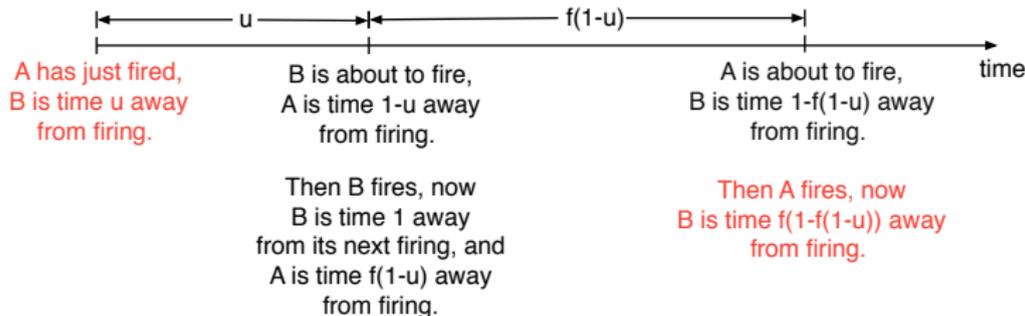
Focus only on the times when A has just fired.  
At those times, ask: How far is B from firing?

Don't watch the two neurons all the time. Just turn on a "strobe light" at certain times to check what is happening.

## From the first firing of A to the second

If A has just fired, and B is time  $u$  away from firing, then just after the next firing of A, B will be time  $g(u)$  away from firing.

$$g(u) = f(1 - f(1 - u))$$



## Iteration

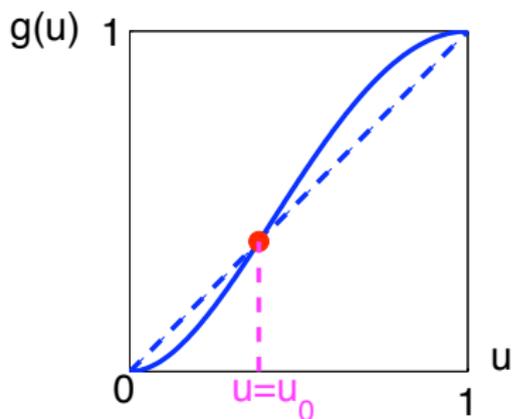
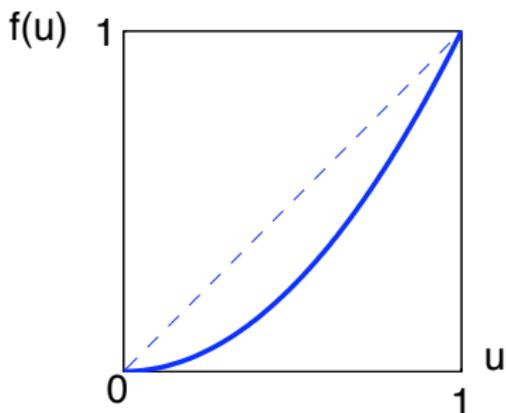
If we watch how far B is from firing every time A has just fired, we see this sequence:

$$u, \quad g(u), \quad g(g(u)), \quad g(g(g(u))), \quad g(g(g(g(u))))), \quad \text{etc.}$$

A and B synchronize if this sequence converges

- to 0 (when A fires, B is about to fire), or
- to 1 (when A fires, B has just fired).

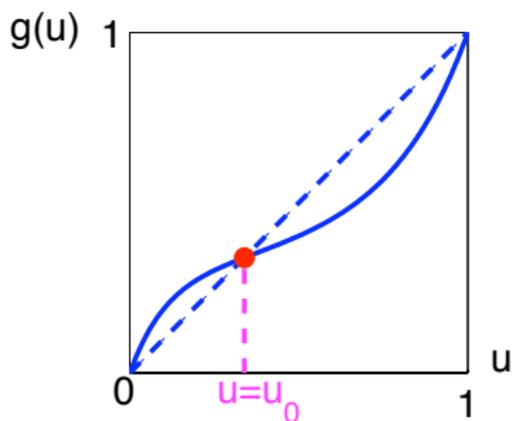
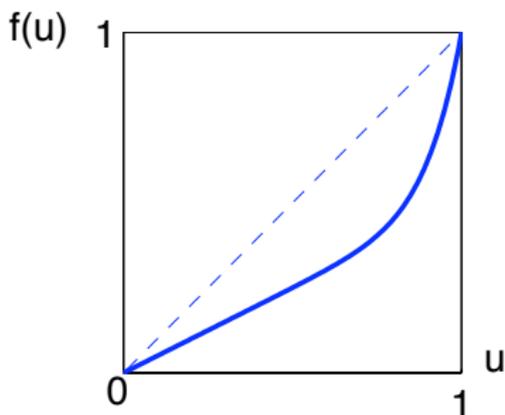
The simplest example:  $f(u) = u^2$



If  $u < u_0$ :  $g(u)$  is smaller than  $u$ ,  $g(g(u))$  is even smaller, etc. ...  
 $\rightarrow 0$ , so **synchrony**.

If  $u > u_0$ :  $g(u)$  is larger than  $u$ ,  $g(g(u))$  is even larger, etc. ...  
 $\rightarrow 1$ , so **synchrony**.

A second example:  $f(u) = (u + u^{10})/2$



If  $u < u_0$ :  $g(u)$  is larger than  $u$ ,  $g(g(u))$  is even larger, etc. ...  
→  $u_0$ , so **no synchrony**.

If  $u > u_0$ :  $g(u)$  is smaller than  $u$ ,  $g(g(u))$  is even smaller, etc. ...  
→  $u_0$ , so again **no synchrony**.

## What we learn from these two examples

Fairly subtle changes in  $f$  can make the difference between synchrony and no synchrony!

Put differently: We can't understand synchronization without understanding the biological details.

## More to think about

1. Exactly which interaction functions  $f$  yield synchrony?  
[I don't fully know.]
2. What if A and B don't have exactly identical properties?
3. What if signals take some time to travel between neurons?  
[A very partial result: For  $f(u) = u^2$ , short delays prevent synchronization, long delays don't.]
4. What if A *inhibits* B, and vice versa?
5. What happens with more than 2 neurons?

## From Calculus back to the brain

- ▶ Rhythmic synchrony can *emerge* in the absence of external rhythmic input.

Norbert Wiener, Tufts' famous alumnus, gave the first mathematical explanation of this point.

- ▶ Oscillations in the EEG may arise from synchronization mechanisms similar to the one we have demonstrated, of course operating on a massive scale, with millions of neurons synchronizing.

- ▶ Subtle details of the interaction law between two neurons matter for synchrony.

The plots of  $f(u) = u^2$  and  $f(u) = (u + u^{10})/2$  don't look all that different, yet one yields synchrony, the other does not.

- ▶ The brain can modulate the details of neuronal interaction, for instance using chemicals called neuromodulators.

The brain might therefore be able to toggle between synchrony and asynchrony using neuromodulators.

## Recommended reading (easy and fun!)

Steven Strogatz, *Sync: The Emerging Science of Spontaneous Order*, Hyperion Books, 2003

## Advertisement

I do research on problems of this sort. I frequently teach two closely related undergraduate classes:

- Mathematical Neuroscience
- Nonlinear Dynamics and Chaos

The prerequisite for both is Calculus.

Undergraduate students also participate in my research.

Thanks for listening!