### Joint probabilities and quantum cognition

### J. Acacio de Barros

Quantum Interactions Conference

June 14, 2012

J. Acacio de Barros (SFSU)

June 14, 2012 1 / 32

3

- Many authors discuss quantum-like effects in the social sciences<sup>1</sup>, but where do those effects come from?
- We'll try to approach this question by focusing on the brain.

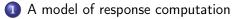
(日) (周) (王) (王)

<sup>&</sup>lt;sup>1</sup>E.g. Haven, E. December 2004 *Physica A: Statistical Mechanics and its Applications* 344(1–2),

<sup>142-145,</sup> Khrennikov, A. and Haven, E. October 2009 Journal of Mathematical Psychology 53(5),

<sup>378-388,</sup> Khrennikov, A. (2009) Biosystems 95(3), 179-187, Khrennikov, A. (2011) Biosystems 105(3),

<sup>250-262.</sup> 

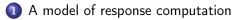




3 Joint probabilities and oscillators



### Outline



#### 2 Quantum-like behavior

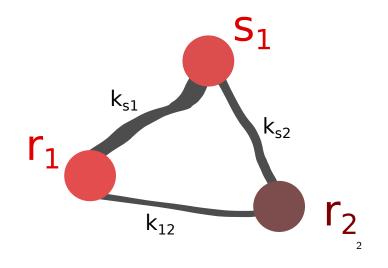
3 Joint probabilities and oscillators

### 4 Conclusions

### Size matters!

- What scale should we use?
  - Down to the synapse level?
  - Neurons?
  - Collective behavior of neurons?
- For language processing, robustness and measurable macroscopic effects suggest a *large* number of neurons.
- Even for a large collection of neurons, we still have several options with respect to modeling.
  - Do we need detailed interactions between neurons? Are the shapes of the action potential relevant? Timing?
- Our goal is to reduce the number of features, yet retain a physical meaning.

### Stimulus and response neurons



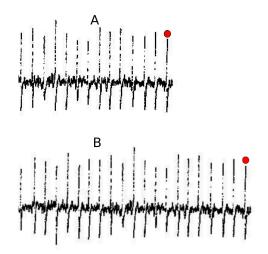
 $^2$ Suppes, P., deBarros, J. A., and Oas, G. April 2012 Journal of Mathematical Psychology 56(2),

J. Acacio de Barros (SFSU)

- B

▶ < Ξ >

### The intuition



J. Acacio de Barros (SFSU)

June 14, 2012 7 / 32

### Kuramoto Equations

• If no interaction,

$$O_{i}(t) = A_{i} \cos \varphi_{i}(t) = A_{s} \cos (\omega t),$$
$$\varphi_{i} = \omega_{i} t + \delta_{i},$$

and

$$\dot{\varphi}_i = \omega_i.$$

### How to represent responses with few oscillators?

• Each neural oscillator's dynamics can be described by the phase,  $\varphi$ .

$$\begin{split} s\left(t\right) &= A_{s}\cos\varphi_{s}\left(t\right) = A_{s}\cos\left(\omega t\right),\\ r_{1}\left(t\right) &= A_{1}\cos\varphi_{r_{1}}\left(t\right) = A\cos\left(\omega t + \delta\varphi\right),\\ r_{2}\left(t\right) &= A_{2}\cos\varphi_{r_{2}}\left(t\right) = A\cos\left(\omega t + \delta\varphi - \pi\right).\\ l_{1} &\equiv \left\langle \left(s\left(t\right) + r_{1}\left(t\right)\right)^{2}\right\rangle_{t} = A^{2}\left(1 + \cos\left(\delta\varphi\right)\right).\\ l_{2} &\equiv \left\langle \left(s\left(t\right) + r_{2}\left(t\right)\right)^{2}\right\rangle_{t} = A^{2}\left(1 - \cos\left(\delta\varphi\right)\right). \end{split}$$

• A response is the balance between the strengths  $I_1$  and  $I_2$ ,

$$b = \frac{l_1 - l_2}{l_1 + l_2} = \cos(\delta \varphi)$$

### Encoding responses

• To encode responses, we need to modify

$$\dot{\varphi}_i = \omega_i - \sum_{j \neq i} A_{ij} \sin (\varphi_i - \varphi_j)$$

to include angles, i.e.,

$$\dot{\phi}_i = \omega_i + \sum A_{ij} \sin (\phi_j - \phi_i + \delta \varphi_{ij}).$$

 $\dot{\phi}_i = \omega_i + \sum \left[ A_{ij} \sin \left( \phi_j - \phi_i 
ight) + B_{ij} \cos \left( \phi_j - \phi_i 
ight) 
ight].$ 

J. Acacio de Barros (SFSU)

A - A - A

### Encoding responses

• To encode responses, we need to modify

$$\dot{\varphi}_i = \omega_i - \sum_{j \neq i} A_{ij} \sin (\varphi_i - \varphi_j)$$

to include angles, i.e.,

$$\dot{\phi}_i = \omega_i + \sum A_{ij} \sin (\phi_j - \phi_i + \delta \varphi_{ij}).$$

$$\dot{\phi}_i = \omega_i + \sum \left[ A_{ij} \sin \left( \phi_j - \phi_i \right) + B_{ij} \cos \left( \phi_j - \phi_i \right) 
ight].$$

J. Acacio de Barros (SFSU)

## Reinforcing oscillators

• During reinforcement:

$$\dot{\phi}_i = \omega_i + \sum \left[ A_{ij} \sin (\phi_j - \phi_i) + B_{ij} \cos (\phi_j - \phi_i) \right] + K_0 \sin (\varphi_E - \varphi_i + \delta_{Ei}) .$$

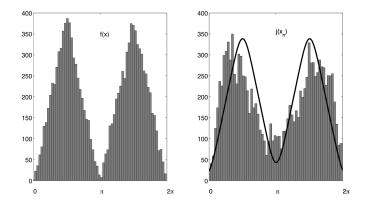
$$\frac{dk_{ij}^E}{dt} = \epsilon \left( K_0 \right) \left[ \alpha \cos (\varphi_i - \varphi_j) - k_{ij} \right],$$

$$\frac{dk_{ij}^{\prime}}{dt} = \epsilon \left( K_0 \right) \left[ \alpha \sin \left( \varphi_i - \varphi_j \right) - k_{ij}^{\prime} \right].$$

J. Acacio de Barros (SFSU)

3

### Response selection



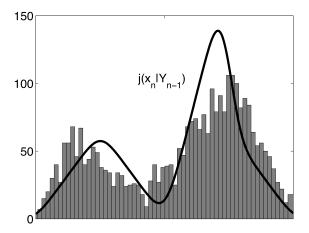
June 14, 2012

포 > 표

< □ > < 同 > <

12 / 32

## Conditional probabilities

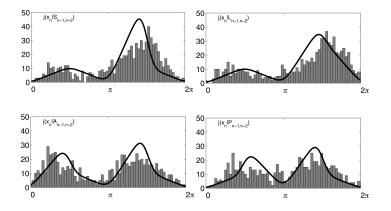


J. Acacio de Barros (SFSU)

13 / 32 June 14, 2012

< 47 ▶

### Conditional probabilities



## Recapping Part 1

- We represent a collection of neurons by the phase of their coherent oscillations.
- The dynamics comes from inhibitory as well as excitatory neuronal connections.
- The phase difference between stimulus and response oscillators encode a continuum of responses.

## Outline



### Quantum-like behavior

3 Joint probabilities and oscillators

### 4 Conclusions

## What is quantum?

- Nondeterministic.
- Nonlocal.
- Contextual.

### Determinism and predictability

- Classical systems can be completely unpredictable (e.g., three-body system, Sinai billiards).
- We cannot distinguish a deterministic from a stochastic dynamics.
- Should we care anyway?

## Contextuallity

- Example:  $[\hat{P}, \hat{Q}] \neq 0$ .
- Not a big deal in social sciences.

## Contextuallity

- Example:  $[\hat{P}, \hat{Q}] \neq 0$ .
- Not a big deal in social sciences.

Example:

• Is a cheap date good or bad?

- Example:  $[\hat{P}, \hat{Q}] \neq 0$ .
- Not a big deal in social sciences.

Example:

- Is a cheap date good or bad?
- Rephrasing for this conference: do you think your female friends like cheap dates?

- Example:  $[\hat{P}, \hat{Q}] \neq 0$ .
- Not a big deal in social sciences.

Example:

- Is a cheap date good or bad?
- Rephrasing for this conference: do you think your female friends like cheap dates?
- Did you know dates are on sale at the supermarket?

- Imagine two parallel sections: Alice and Bob.
- Alice asks supermarket question first.
- Because of Alice's choice, students at Bob's classroom answered yes to the cheap date question.
- Spooky?! Should we care?

#### Quantum-like behavior

## What about the brain?

- Stochastic.
- Contextual.
- Nonlocal?

## What is quantum in SS? An example

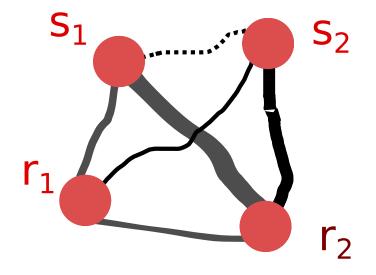
- Should I buy a plot of land given the uncertainties due to the presidential elections?
- If Republican, I decide it is better to buy.
- If Democrat, I also decide it is better to buy.
- Therefore, I should prefer buying over not buying, even if I don't know who will win (Savage's Sure-thing Principle)
- Tversky and Shafir showed that people violate the Sure-thing Principle.

## What is quantum in SS? An example

- Should I buy a plot of land given the uncertainties due to the presidential elections?
- If Republican, I decide it is better to buy.
- If Democrat, I also decide it is better to buy.
- Therefore, I should prefer buying over not buying, even if I don't know who will win (Savage's Sure-thing Principle)
- Tversky and Shafir showed that people violate the Sure-thing Principle.

Quantum-like behavior

### Oscillator interference



J. Acacio de Barros (SFSU)

Probability and quantum cognition

June 14, 2012 23 / 32

æ

∃ ► < ∃ ►</p>

< 17 > <

- For two stimulus oscillators,  $s_1$  and  $s_2$ , and two response oscillators,  $r_1$  and  $r_2$ .
- We select couplings between oscillators such that X is selected 60% of the time if  $s_1$  is active, and 50% of the time if  $s_2$  is active.
- By selecting the couplings between  $s_1$  and  $s_2$ , we can control the degree of synchronicity between then.
- If  $s_1$  and  $s_2$  are activated, we can have interference between  $s_1$  and  $s_2$ .
- In such cases, X is selected less than 40% of the time.

# What the $\#\$ \*! do we know!?

- Propagation of oscillations on the cortex behave like a wave.
- Neural oscillator interference may be sensitive to context.
- Could quantum effects be simply contextual?

### Outline



2 Quantum-like behavior



#### 4 Conclusions

### The simplest example

• Let X, Y, and Z be  $\pm 1$  random variables with zero expectation. • Let

$$E(\mathbf{XY}) = E(\mathbf{YZ}) = E(\mathbf{XZ}) = \epsilon.$$

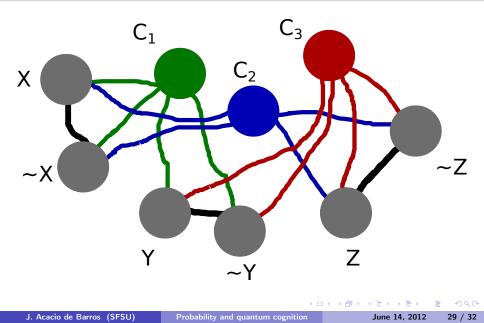
- X, Y, and Z have a joint probability distribution if and only if  $\epsilon > -1/3$ .
- This is the simplest example of a set of random variables without a joint probability.

### Can it make sense?

- It is possible to give a (albeit contrived)example where X, Y, and Z could not have a joint.
- Let each of the correlations, E(XY), E(YZ), and E(XZ) correspond to different expert opinions which are inconsistent.
- Since the opinions are inconsistent, we don't have a joint.

#### Joint probabilities and oscillators

### A not-so-simple oscillator model



### But it is not quantum!

- In their quantum version, we would have observables in a Hilbert space corresponding to each random variable X, Y, and Z. Call them X, Y, and Z.
- To say that the correlations E(XY), E(YZ), and E(XZ) have a certain value means that we can observe any pair of X, Y, and Z, i.e.  $[\hat{X}, \hat{Y}] = [\hat{X}, \hat{Z}] = [\hat{Z}, \hat{Y}] = 0.$
- But the fact that they commute means we can find a basis where all operators  $\hat{X}$ ,  $\hat{Y}$ , and  $\hat{Z}$  are diagonal.
- Therefore, it is possible to measure simultaneously  $\hat{X}$ ,  $\hat{Y}$ , and  $\hat{Z}$ , which means that there exists a joint probability distribution for X, Y, and Z.

30 / 32

## Outline

1) A model of response computation

2 Quantum-like behavior

3 Joint probabilities and oscillators



- A small number of phase oscillators may be used to model a continuum of responses (with results similar to SR theory).
- The model is simple enough such that we can easily understand physically how responses are selected via inhibitory and excitatory couplings.
- Interference may help us understand how complex neural networks have "quantum-like" dynamics.
- Such quantum-like dynamics comes from the contextuallity of oscillators, and are not necessarily compatible with the structure of observables imposed by a quantum Hilbert space.