Quantum Formalism Outside of Physics

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III Advanced School on Quantum Foundation and Quantum Computation

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Weird quantum

- Quantum mechanics is strange:
 - No clear interpretation
 - Apparently contradictory statements (inconsistent histories)
- But is well described mathematically (Hilbert spaces or rigged Hilbert spaces)
 - Quantum probabilities



Cognitive models

• Cognitive science tries to understand how the brain processes information and how it computes complex tasks.



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Cognitive models

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- Typical problems are perception, decision making, and learning.



Cognitive models

- Cognitive science tries to understand how the brain processes information and how it computes complex tasks.
- Typical problems are perception, decision making, and learning.
- Cognitive models are mathematical models of the above problems using constraints from behavioral and cognitive sciences.
- Such models provide a more refined way to talk about features of certain cognitive processes.



Irrational behavior Behavior violates Kolmogorov's axioms.

- Most cognitive models use standard probabilities satisfying Kolmogorov's axioms:
 - (i) $P(A) \ge 0$, $A \in \mathscr{F}$,
 - (ii) $P(\Omega) = 1$,
 - (iii) $P(A \cup B) = P(A) + P(B)$ for $A \cap B = \emptyset$.
- This is the case with Markov chain or Bayesian models, for example.



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,

- (iii) $P(A \cup B) = P(A) + P(B)$ for $A \cap B = \emptyset$.
- This is the case with Markov chain or Bayesian models, for example.
- However, people do not behave according to Kolmogorov's axioms (we'll see examples later, as well as what this means).



Quantum models

- Since classical probability theory seems to be violated by human behavior, cognitive scientists looked for alternatives to it.
 - Extended probabilities
 - upper and lower probabilities
 - negative probabilities
 - quantum probabilities.
- Can we use of the mathematical apparatus of quantum mechanics to model human behavior?
 - This comes from the well-known fact that quantum mechanics violate Kolmogorov's axioms.





- Cognitive modeling, mainly probabilistic ones, helps us understand quantitatively the brain.
- However, brain processes, or at least behavior, seem to violate classical probability theory.
- Can a quantum mechanical mathematical formalism help us model such processes?





- Cognitive modeling, mainly probabilistic ones, helps us understand quantitatively the brain.
- However, brain processes, or at least behavior, seem to violate classical probability theory.
- Can a quantum mechanical mathematical formalism help us model such processes?
- To emphasize: we are not talking about quanta and mind here!





- Day 1: Basic issues on quantum mechanics (with emphases aspects relevant for cognition)
- Day 2: Quantum in psychology
- Day 3: Quantum in psychology, economics, and (perhaps) political sciences



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Why should we care?

- Pushing quanta to outside of physics may help clarify what makes quanta different.
 - Perhaps even figure out what defines quantum theory.



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"Religion without science is blind; science without religion is lame" - Albert Einstein



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 - Perhaps even figure out what defines quantum theory.
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"Religion without science is blind; science without religion is lame" - Albert Einstein

Metaphysics without physics is blind; physics without metaphysics is lame.



Outline



1 What is non-classical about guantum mechanics?

- Non-determinism
- Nonlocality

2 Contextuality, quantum, and probabilities

Quantum Cognition

- Order Effect
- The conjunction paradox and the two-slit
- The prisoner's dilemma
- A neurophysiological model for quantum cognition.
- Beyond quantum cognition.



Non-determinism Nonlocality

What makes QM different from CM?

- Non-determinism.
- Contextuality.
- Non-locality.



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Non-determinism

Outline



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Non-determinism Nonlocality

They are both deterministic

 Classical particle physics relies on Newton's equations of motion:

$$m rac{\mathrm{d}^2 \mathbf{r}(t)}{\mathrm{d}t^2} = \mathbf{F}\left(\mathbf{r}, rac{\mathrm{d}\mathbf{r}}{\mathrm{d}t}, t
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Non-determinism Nonlocality

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$$m\frac{\mathrm{d}^{2}\mathbf{r}(t)}{\mathrm{d}t^{2}}=\mathbf{F}\left(\mathbf{r},\frac{\mathrm{d}\mathbf{r}}{\mathrm{d}t},t\right).$$

• Quantum mechanics relies on Schroedinger's equation, e.g.

$$i\hbar \frac{\partial \psi(\mathbf{r},t)}{\partial t} = -\frac{\hbar^2}{2m} \nabla^2 \psi(\mathbf{r},t) + V(\mathbf{r},t) \psi(\mathbf{r},t).$$



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Non-determinism Nonlocality

Both are deterministic, but quantum is not At least quantum measurement seems not to be

• But $\psi(\mathbf{r},t)$ in $i\hbar \frac{\partial \psi(\mathbf{r},t)}{\partial t} = -\frac{\hbar^2}{2m} \nabla^2 \psi(\mathbf{r},t) + V(\mathbf{r},t) \psi(\mathbf{r},t).$

only tells us the probability density, $p(\mathbf{r}, t) = |\psi(\mathbf{r}, t)|^2$, if we measure its position.

• For a general vector $|\psi
angle$ and a projector P, the outcome is $c\hat{P}|\psi
angle$

with probability $p = \left| \hat{P} | \psi \rangle \right|^2$.

• A quantum measurement is apparently probabilistic (nondeterministic).



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• A quantum measurement is apparently probabilistic (nondeterministic).

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• Quantum non-determinism was recognized early on by

Quantum Formalism Outside of Physics



Non-determinism Nonlocality

But do we care about determinism?

- Let us look at some classical (and therefore deterministic) examples:
 - Three-body problem.
 - Sinai billiard.



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Non-determinism Nonlocality

Three bodies under gravity.



Non-determinism Nonlocality

Three bodies under gravity.



A symbolic trajectory for *m* is a set of measurements of its position every time interval Δt: S = (+, +, -, -, -, +, ...).



Non-determinism Nonlocality

Three bodies under gravity.



- A symbolic trajectory for m is a set of measurements of its position every time interval Δt: S = (+,+,-,-,-,+,...).
- Alekseev: If m ≪ M, and if ∆t is large enough, then S is isomorphic to a coin toss.



Non-determinism Nonlocality

Billiard.





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Non-determinism Nonlocality

Billiard.





• Periodic trajectories.

Non-determinism Nonlocality

Sinai's Billiard.





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Non-determinism Nonlocality

Sinai's Billiard.







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Non-determinism Nonlocality

Ornstein's partition.





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Non-determinism Nonlocality

Ornstein's partition.



• Deterministic and probabilistic systems are ε -congruent.



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Non-determinism Nonlocality



- Determinism does not imply predictability.
- Deterministic complex systems behave in ways that are observationally equivalent to probabilistic systems.



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Non-determinism Nonlocality

Summarizing.

- Determinism does not imply predictability.
- Deterministic complex systems behave in ways that are observationally equivalent to probabilistic systems.
- When observing a system that seems non-deterministic, it is possible we're observing a deterministic system with complex dynamics.



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Non-determinism Nonlocality

Summarizing.

- Determinism does not imply predictability.
- Deterministic complex systems behave in ways that are observationally equivalent to probabilistic systems.
- When observing a system that seems non-deterministic, it is possible we're observing a deterministic system with complex dynamics.
- Distinction between determinism and predictability was not known to founders of QM.



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Non-determinism Nonlocality

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Non-determinism Nonlocality

Bell-EPR experiment



• Only sixteen possibilities:

•
$$A = 1, A' = 1, B = 1, B' = 1$$

• $A = 1, A' = 1, B = 1, B' = -1$
• $A = 1, A' = 1, B = -1, B' = 1$
• $A = 1, A' = 1, B = -1, B' = -1$
• $A = 1, A' = -1, B = 1, B' = 1$
• \vdots
• $A = -1, A' = -1, B = -1, B' = -1$



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Non-determinism Nonlocality

Bell-EPR experiment



• Define S = AB + AB' + A'B - A'B':

• $A = 1, A' = 1, B = 1, B' = 1 \longrightarrow S = AB + AB' + A'B - A'B' = 2$ • $A = 1, A' = 1, B = 1, B' = -1 \longrightarrow S = 2$ • $A = 1, A' = 1, B = -1, B' = 1 \longrightarrow S = -2$ • $A = 1, A' = 1, B = -1, B' = -1 \longrightarrow S = -2$ • $A = 1, A' = -1, B = 1, B' = 1 \longrightarrow S = 2$ • \vdots • $A = -1, A' = -1, B = -1, B' = -1 \longrightarrow S = -2$



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Non-determinism Nonlocality

Bell-EPR experiment



- Only sixteen possibilities.
- Define S = AB + AB' + A'B A'B'
- Since for each possibility, $-2 \le S \le 2$, it follows that $-2 \le \langle S \rangle \le 2$.
- Quantum mechanics violates this inequality.
 - This is equivalent to the non-existence of a common cause that explains the correlations (non-locality)



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Non-determinism Nonlocality

Homodyne detection





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Non-determinism Nonlocality

Interference effects



$$ho(V_1, V_2) = rac{Cov(V_1, V_2)}{\sqrt{Var(V_1)Var(V_2)}}$$

$$\rho(V_1,V_2) = -\sin(\alpha_1-\alpha_2).$$

- This correlation violates Bell's inequalities.
- However, proper violation has a thermodynamical cost.

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Quantum and Classical Dynamics

• Classical:

$$\frac{dp}{dt} = \{p, H\},$$
(1)
$$\frac{dq}{dt} = \{q, H\},$$
(2)

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Quantum and Classical Dynamics

• Classical:

$$\frac{dp}{dt} = \{p, H\},$$

$$(1)$$

$$\frac{dq}{dt} = \{q, H\},$$

$$(2)$$

• Quantum:

$$\frac{d\hat{P}}{dt} = i\hbar \left[\hat{P}, \hat{H}\right],$$

$$\frac{d\hat{Q}}{dt} = i\hbar \left[\hat{Q}, \hat{H}\right].$$

• To preserve the algebra, we impose $[\hat{Q}, \hat{P}] = i\hbar$.



So what if \hat{P} and \hat{Q} don't commute?

- We saw that $[\hat{Q},\hat{P}]|\psi
 angle = \left(\hat{Q}\hat{P} \hat{P}\hat{Q}\right)|\psi
 angle = i\hbar|\psi
 angle.$
- Suppose $|\psi
 angle$ is simultaneously an eigenstate of \hat{P} and $\hat{Q}.$

•
$$(\hat{Q}\hat{P} - \hat{P}\hat{Q})|\psi\rangle = (\hat{Q}p_0 - \hat{P}q_0)|\psi\rangle = (q_0p_0 - p_0q_0)|\psi\rangle = 0.$$

But this contradicts above!



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But this contradicts above!

- If two observables do not commute, they are not simultaneously measurable.
- Complimentary observables are not simultaneously measurable.



Example: measuring the magnetic moment of an electron





Big problem?

• Classically, a measurement reveals the value of the quantity being measured.

Let $\boldsymbol{\mu}$ be the a random variable representing spin. The experiment is measuring $\mu_z = \boldsymbol{\mu} \cdot \hat{\boldsymbol{z}} = \pm 1$ (in units where $\hbar = h/2\pi = 1$).



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• Classically, a measurement reveals the value of the quantity being measured.

Let $\boldsymbol{\mu}$ be the a random variable representing spin. The experiment is measuring $\mu_z = \boldsymbol{\mu} \cdot \hat{z} = \pm 1$ (in units where $\hbar = h/2\pi = 1$).

- But our choice of direction is arbitrary for the experiment! So, it must also be true for any other directions that its spin component is either 1 or -1.
- Let us chose two new directions, \hat{x}_1 and \hat{x}_2 such that $\hat{x}_1 + \hat{x}_2 + \hat{z} = 0$. It follows that $\boldsymbol{\mu} \cdot (\hat{x}_1 + \hat{x}_2 + \hat{z}) = \pm 1 \pm 1 \pm 1 = 0$, a contradiction!



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What is going on?

- There are a assumptions for the contradiction:
 - **µ** represents spin before measurement;
 - measurements "reveal" what $\pmb{\mu}$ is.
- Spin cannot be independent of measurement.



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 - measurements "reveal" what $\pmb{\mu}$ is.
- Spin cannot be independent of measurement.
- To avoid the inconsistency, we need to assume that µ depends on the choice of measurement direction. The value of µ depends on the experiment, i.e. it changes with the "context".
- Contextuality is at the heart of Heisenberg's uncertainty principle: the measuring of a quantity affects the state of a system.





- Founders of QM were puzzled by the fundamental nature of non-commutativity.
- Bohr created (or borrowed) the concept of complementarity.
- We saw that this was the essence of contextuality: we cannot assign values to spin before measure, as measurement itself affects it.
- But contextuality can also be classical (we will see examples later).



Why probabilities?

- Let $\{P_i\}$ be a collection of propositions.
- How do we express a *rational* belief about such propositions if we are not sure about them?
 - Divisibility and comparability: the belief in a proposition is represented by a real number; this belief depends on what we know about this proposition
 - Logicality: beliefs should vary sensibly with the assessment of plausibilities, i.e. it should be consistent with logic (if P_1 is believed to be true, then $\neg P_1$ should be believed to be false).
 - Consistency: If a belief about a proposition can have different derivations, the outcomes must all be the same.



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Cox's theorem

• If the rationality assumptions are true, then belief can be measured with a "belief" function *p* (probability) with the following properties:

1 ≥
$$p(P_1) \ge 0$$

 $p(A \cup B) = p(A) + p(B)$, if $A \cap B = \emptyset$.



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Cox's theorem

• If the rationality assumptions are true, then belief can be measured with a "belief" function *p* (probability) with the following properties:

1
$$\geq p(P_1) \geq 0$$

p(A $\cup B$) $= p(A) + p(B)$, if $A \cap B = \emptyset$.

Cox's theorem is (finite) equivalent to Kolmogorov's axioms.
 (Ω, ℱ, p) with p: ℱ → [0,1] and

 $p(A \cup B) = p(A) + p(B)$, for $A, B \in \mathscr{F}$ and $A \cap B = \emptyset$



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Properties

- A very powerful tool in probability theory are random variables.
- A random variable R : Ω → O is a measurable function in (Ω, ℱ, p) from the sample space into a (measurable) set of outcomes.
- Simple examples:
 - $\Omega = \{h, t\}, \ p(h) = p(t) = 1/2; \ \mathbf{R} : \Omega \to \{0, 1\}$
 - $A = \{1, 2, 3, 4, 5, 6\}, \ \Omega = A \times A, \ \mathbf{R} : \Omega \to \{2, 3, 4, \dots, 12\}, \ \mathbf{R}((a_1, a_2)) = a_1 + a_2, \ \text{where} \ (a_1, a_2) \in \Omega.$
- Random variables can be used to describe properties or experimental outcomes.
 - Their stochastic properties should match the properties of the experiment.



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Contextuality comes from linguistics

- Consider *P* = "Aristotle knew very little philosophy."
 - Alice: *P* is true.
 - Bob: *P* is false.



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A different example

- P = "Aristotle knew very little philosophy."
- Alice: *P* is true.
 - Bob: P is false.







What is contextuality in physics?

- The most famous example of contextuality in physics was given by Kochen and Specker.
 - For a Hilbert space of dimension 3:
 - a set of projection operators, *P_i*, corresponding to true or false propositions about the physical system
 - sets of contexts where some of those P_i 's are compatible
 - no context-independent truth-values can be assigned to the outcomes of such measurements in all contexts
- In other words, we cannot assign a truth value to a P_i that is the same in one context as in another; the property P_i depends on the context.



A non-physical example of KS-type contextuality

- Let Alice, Carol, and Bob be three undergrads.
 - They are very competitive: whenever they are in the same room, they *always* disagree.
 - They are also very unpredictable: you never know whether they will repeat an answer to the same question.
- Let:
 - P₁ be the proposition "Alice answered yes to question Q."
 - P₂ be the proposition "Bob answered yes to question Q."
 - P₃ be the proposition "Carol answered yes to question Q."



A non-physical example of KS-type contextuality

- Let Alice, Carol, and Bob be three undergrads.
 - They are very competitive and unpredictable
- The corresponding r.v. for P_1 , P_2 , and P_3 are two-valued variables, either 1 (true) or 0 (false).
- Daniel goes to three classes, and observes $C_1 = (P_1, P_2)$, $C_2 = (P_1, P_3)$, and $C_3 = (P_2, P_3)$.
 - Let the following be true for each context:

$$\label{eq:P1+P2} \begin{split} {\bf P}_1 + {\bf P}_2 &= 1, \\ {\bf P}_1 + {\bf P}_3 &= 1, \\ {\bf P}_2 + {\bf P}_3 &= 1. \end{split}$$

• However, we can see that there is an inconsistency: even on the left, odd on the right.



Inconsistency comes from assuming non-contextuality

- Contradiction comes from assuming that truth-values are the same in each context.
 - Say $P_1 = 1$ and $P_2 = 0$ in the context C_1 , and $P_1 = 1$ and $P_3 = 0$ in context C_2 .
 - But we know that in C_3 either $P_2 = 0$ and $P_3 = 1$ or $P_2 = 1$ and $P_3 = 0$, i.e. one of them is not the same as in the other contexts.
- That is why we say that the random variables in this example are contextual: they cannot be the same.



Kochen-Specker

$$\begin{split} & \mathsf{V}_{0,0,0,1} + \mathsf{V}_{0,0,1,0} + \mathsf{V}_{1,1,0,0} + \mathsf{V}_{1,-1,0,0} = 1, \\ & \mathsf{V}_{0,0,0,1} + \mathsf{V}_{0,1,0,0} + \mathsf{V}_{1,0,1,0} + \mathsf{V}_{1,0,-1,0} = 1, \\ & \mathsf{V}_{1,-1,1,-1} + \mathsf{V}_{1,-1,-1,1} + \mathsf{V}_{1,1,0,0} + \mathsf{V}_{0,0,1,1} = 1, \\ & \mathsf{V}_{1,-1,1,-1} + \mathsf{V}_{1,1,1,1} + \mathsf{V}_{1,0,-1,0} + \mathsf{V}_{0,1,0,-1} = 1, \\ & \mathsf{V}_{0,0,1,0} + \mathsf{V}_{0,1,0,0} + \mathsf{V}_{1,0,0,1} + \mathsf{V}_{1,0,0,-1} = 1, \\ & \mathsf{V}_{1,-1,-1,1} + \mathsf{V}_{1,1,1,1} + \mathsf{V}_{1,0,0,-1} + \mathsf{V}_{0,1,-1,0} = 1, \\ & \mathsf{V}_{1,1,-1,1} + \mathsf{V}_{1,1,1,-1} + \mathsf{V}_{1,-1,0,0} + \mathsf{V}_{0,0,1,1} = 1, \\ & \mathsf{V}_{1,1,-1,1} + \mathsf{V}_{-1,1,1,1} + \mathsf{V}_{1,0,0,1} + \mathsf{V}_{0,1,0,-1} = 1, \\ & \mathsf{V}_{1,1,-1,1} + \mathsf{V}_{-1,1,1,1} + \mathsf{V}_{1,0,0,1} + \mathsf{V}_{0,1,0,-1} = 1. \end{split}$$



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Another example: GHZ





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Entangled three-particle state

$$|\psi\rangle = \frac{1}{\sqrt{2}}(|+++\rangle - |---\rangle)$$

This state is the eigenvector of many different operators. E.g.

$$\begin{aligned} \hat{\sigma}_{x,A}\hat{\sigma}_{y,B}\hat{\sigma}_{y,C}|\psi\rangle &= \frac{1}{\sqrt{2}}\hat{\sigma}_{x,A}\hat{\sigma}_{y,B}\hat{\sigma}_{y,C}|+++\rangle - \frac{1}{\sqrt{2}}\hat{\sigma}_{x,A}\hat{\sigma}_{y,B}\hat{\sigma}_{y,C}|---\rangle \\ &= \frac{1}{\sqrt{2}}\hat{\sigma}_{x,A}\hat{\sigma}_{y,B}(i)|++-\rangle - \frac{1}{\sqrt{2}}\hat{\sigma}_{x,A}\hat{\sigma}_{y,B}(-i)|--+\rangle \\ &= \frac{1}{\sqrt{2}}\hat{\sigma}_{x,A}(i)(i)|+--\rangle - \frac{1}{\sqrt{2}}\hat{\sigma}_{x,A}(-i)(-i)|-++\rangle \\ &= \frac{1}{\sqrt{2}}(i)(i)|---\rangle - \frac{1}{\sqrt{2}}(-i)(-i)|+++\rangle \\ &= -\frac{1}{\sqrt{2}}|---\rangle + \frac{1}{\sqrt{2}}|+++\rangle = |\psi\rangle \end{aligned}$$

J. Acacio de Barros Quan

Quantum Formalism Outside of Physics

Entangled three-particle state.

In addition to

$$\hat{\sigma}_{x,A}\hat{\sigma}_{y,B}\hat{\sigma}_{y,C}|\psi\rangle = |\psi\rangle,$$

above, we have

$$\hat{\sigma}_{y,A}\hat{\sigma}_{x,B}\hat{\sigma}_{y,C}|\psi\rangle = |\psi\rangle,$$

$$\hat{\sigma}_{y,A}\hat{\sigma}_{y,B}\hat{\sigma}_{x,C}|\psi\rangle = |\psi\rangle.$$

But also

$$\begin{split} \hat{\sigma}_{x,A}\hat{\sigma}_{x,B}\hat{\sigma}_{x,C}|\psi\rangle &= \frac{1}{\sqrt{2}}\hat{\sigma}_{x,A}\hat{\sigma}_{x,B}\hat{\sigma}_{x,C}\left(|+++\rangle-|---\rangle\right)\\ &= -\frac{1}{\sqrt{2}}|+++\rangle+\frac{1}{\sqrt{2}}|---\rangle = -|\psi\rangle. \end{split}$$



What does it mean?

$$\hat{\sigma}_{x,A}\hat{\sigma}_{y,B}\hat{\sigma}_{y,C}|\psi\rangle = |\psi\rangle.$$

$\mathbf{X}_{A}(\omega)\mathbf{Y}_{B}(\omega)\mathbf{Y}_{C}(\omega) = 1$



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For the examples shown.

$$\hat{\sigma}_{x,A}\hat{\sigma}_{y,B}\hat{\sigma}_{y,C}|\psi\rangle = |\psi\rangle,$$

$$\hat{\sigma}_{y,A}\hat{\sigma}_{x,B}\hat{\sigma}_{y,C}|\psi\rangle = |\psi\rangle,$$

$$\mathbf{X}_{A}(\omega)\mathbf{Y}_{B}(\omega)\mathbf{Y}_{C}(\omega) = 1$$

$$\mathbf{Y}_{A}(\omega)\mathbf{X}_{B}(\omega)\mathbf{Y}_{C}(\omega) = 1$$

$$\hat{\sigma}_{y,A}\hat{\sigma}_{y,B}\hat{\sigma}_{x,C}|\psi
angle=|\psi
angle,$$

$$\mathbf{Y}_{A}(\boldsymbol{\omega})\mathbf{Y}_{B}(\boldsymbol{\omega})\mathbf{X}_{C}(\boldsymbol{\omega})=1,$$

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 $\hat{\sigma}_{x,A}\hat{\sigma}_{x,B}\hat{\sigma}_{x,C}|\psi\rangle = -|\psi\rangle, \qquad \mathsf{X}_{A}(\omega)\mathsf{X}_{B}(\omega)\mathsf{X}_{C}(\omega) = -1.$



Again, big problem!

$$\mathbf{X}_{A}\mathbf{Y}_{B}\mathbf{Y}_{C} = 1$$
$$\mathbf{Y}_{A}\mathbf{X}_{B}\mathbf{Y}_{C} = 1$$
$$\mathbf{Y}_{A}\mathbf{Y}_{B}\mathbf{X}_{C} = 1$$

$$\begin{aligned} (\mathbf{X}_{A}\mathbf{Y}_{B}\mathbf{Y}_{C})(\mathbf{Y}_{A}\mathbf{X}_{B}\mathbf{Y}_{C})(\mathbf{Y}_{A}\mathbf{Y}_{B}\mathbf{X}_{C}) &= 1. \\ (\mathbf{X}_{A}\mathbf{X}_{B}\mathbf{X}_{C})(\mathbf{Y}_{A}^{2}\mathbf{Y}_{B}^{2}\mathbf{Y}_{C}^{2}) &= 1. \\ \mathbf{X}_{A}\mathbf{X}_{B}\mathbf{X}_{C} &= 1. \end{aligned}$$



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Again, big problem!

 $\mathbf{X}_{A}\mathbf{Y}_{B}\mathbf{Y}_{C} = 1$ $\mathbf{Y}_{A}\mathbf{X}_{B}\mathbf{Y}_{C} = 1$ $\mathbf{Y}_{A}\mathbf{Y}_{B}\mathbf{X}_{C} = 1$

$$\begin{aligned} (\mathsf{X}_{A}\mathsf{Y}_{B}\mathsf{Y}_{C})(\mathsf{Y}_{A}\mathsf{X}_{B}\mathsf{Y}_{C})(\mathsf{Y}_{A}\mathsf{Y}_{B}\mathsf{X}_{C}) &= 1. \\ (\mathsf{X}_{A}\mathsf{X}_{B}\mathsf{X}_{C})(\mathsf{Y}_{A}^{2}\mathsf{Y}_{B}^{2}\mathsf{Y}_{C}^{2}) &= 1. \\ \mathsf{X}_{A}\mathsf{X}_{B}\mathsf{X}_{C} &= 1. \end{aligned}$$

But before

$$\mathbf{X}_{A}\mathbf{X}_{B}\mathbf{X}_{C} = -1!$$



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How is it possible?

- The assumption that $\mathbf{Y}_{A}^{2} = 1$ is based on the idea that the random variable is the same in both experiments (i.e., there is a joint probability space for both experimental conditions).
- But **Y**_A, the outcome of a spin measurement by Alice, must depend on the choice of experimental setup, i.e., whether Bob and Carlos decide to measure $\hat{\mathbf{x}}$ -spin or $\hat{\mathbf{y}}$ -spin.
- But all experimenters, Alice, Bob, or Carlos, may decide at the last second whether they want to measure \hat{x} -spin or \hat{y} -spin.



Extension to non-perfect correlation

- Cases above were for perfect correlations: not a realistic assumption.
- For imperfect correlations, we need to use probabilities.
- But for non-contextual variables, logical entailments lead to probabilities satisfying certain inequalities.


An example with imperfect correlation

• Suppes-Zanotti inequality

 $-1 \leq \langle \textbf{A}\textbf{B} \rangle + \langle \textbf{A}\textbf{C} \rangle + \langle \textbf{B}\textbf{C} \rangle \leq 1 + 2\min\{\langle \textbf{A}\textbf{B} \rangle, \langle \textbf{A}\textbf{C} \rangle, \langle \textbf{B}\textbf{C} \rangle\},$

where A, B, and C are ± 1 -valued random variables.

• To see that this must be the case, we can examine all logical possibilities for each product:

$$(AB = 1\&AC = 1) \rightarrow BC = 1$$

 $(AB = 1\&AC = -1) \rightarrow BC = -1$
 $(AB = -1\&AC = 1) \rightarrow BC = -1$
 $(AB = -1\&AC = -1) \rightarrow BC = 1.$

• Since each line above add to numbers that are either -1 or 3, their convex combination must be greater than -1.



Imperfect correlation for GHZ

- For the GHZ example above, we have A, B, C, and D = ABC as our simplified set of random variables.
- Let us examine the following logical possibilities:

$$(A = 1\&B = 1\&C = 1) \rightarrow D = 1$$

 $(A = 1\&B = 1\&C = -1) \rightarrow D = -1$
 \vdots
 $(A = -1\&B = -1\&C = -1) \rightarrow D = -1.$

- $(A \equiv -1\&B \equiv -1\&C \equiv -1) \rightarrow D \equiv -1$
- A convex sum of all those possibilities imply that

$$-2 \le E(A) + E(B) + E(C) - E(D) \le 2$$

(and permutations of the - sign).

Those are necessary and sufficient conditions for existence of a joint.



Contextuallity in social sciences

• Common:

- semantics and pragmatics
- order effect in psychology
- perception



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Contextuallity in social sciences

• Common:

- semantics and pragmatics
- order effect in psychology
- perception
- Does quantum bring something new?



Order Effect

The conjunction paradox and the two-slit The prisoner's dilemma A neurophysiological model for quantum cognition. Beyond quantum cognition.

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Outline

- What is non-classical about quantum mechanics?
 - Non-determinism
 - Nonlocality

2 Contextuality, quantum, and probabilities

Quantum Cognition

- Order Effect
- The conjunction paradox and the two-slit
- The prisoner's dilemma
- A neurophysiological model for quantum cognition.
- Beyond quantum cognition.



Order Effect

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What is order effect?

- It is well known in social sciences that order matter:
 - Two questions, A and B, cannot be asked simultaneously
 - We need to choose order: AB or BA?
 - Order matters



Order Effect

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A (a) > (b)

Example of order effect: Clinton/Gore

- Consider the two questions:
 - A: Do you think Clinton is honest and trustworthy?
 - B: Do you think Gore is honest and trustworthy?
- Context 1: A first, then B in the context of A (Gore is in the comparative context)
 - A: 53% yes; B: 65% yes.
- Context 2: B first, then A in the context of B (Clinton is in the comparative context)
 - A: 59% yes; B: 76% yes



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A quantum model for order effect

- From Busemeyer and Wang:
- Postulate 1: A person's belief about an object in question is represented by a state vector in a multidimensional feature space (a vector space)
- Postulate 2: A potential response to a question is represented by a subspace of the multidimensional feature space.
- Postulate 3: The probability of responding to an opinion question equals the squared length of the projection of the state vector onto the response subspace.
- Postulate 4: The updated belief state after deciding an answer to a question equals the normalized projection on the subspace representing the answer.



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Quantum model for Clinton/Gore

Feature space of 2-dim S is the mental state C_y and C_n are basis for Clinton G_y and G_n are basis for Gore



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Quantum model for Clinton/Gore

 C_y and C_n are basis for Clinton G_y and G_n are basis for Gore To satisfy the empirical data, we can have S (the respondent's belief concerning "whether Clinton is honest and trustworthy") as (.8367, .5477) in the Clinton Basis. S in the Gore basis (respondent's belief about "whether Gore is

honest and trustworthy'') is (.9789, .2043).



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Quantum model for Clinton/Gore

 C_y and C_n are basis for Clinton G_y and G_n are basis for Gore S = (.8367, .5477) in the Clinton Basis.

If we first ask Clinton, $p(C_y) = .7$ If we first ask Gore, $p(G_y) = .96$. In the comparative context, $p(C_y) = p(G_y) = .5$



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The QQ equality

- The example above showed order effect
- But what does this mean quantum formalism is a good description of this?
- QQ (quantum question order model) equality is an interesting result.
- p(AyBn) + p(AnBy) = p(ByAn) + p(BnAy)
 - Not satisfied by most order effect models, but predicted by quantum
 - Can be tested experimentally.



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Test of QQ equality

For the Clinton Gore discussed before:

	Clinton–Gore	
	Gy	Gn
Су	0.4899	0.0447
Cn	0.1767	0.2886
	Gore-Clinton	
	Gy	Gn
Су	0.5625	0.0255
Cn	0.1991	0.2130
	Context effects	
	Gy	Gn
Су	-0.0726	0.0192
Cn	-0.0224	0.0756

 χ^2 (3) = 10.14, p < 0.05

$$q = -0.003$$
, χ^2 (1) = 0.01, $p = 0.91$

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Comprehensive study of QQ equality

70 national representative surveys, most containing more than 1,000 participants per survey (similar to Clinton-Gore), and 2 laboratory studies that manipulated question order.



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Analysis of data

- Distributions of χ^2 statistics were analyzed for order effects and q values
- χ^2 distribution test for order effects produced a significant deviation from the null hypothesis (p = 0.0004)
- χ^2 distribution test for the *q* values indicates no significant deviation from the null hypothesis (p = 0.4625)
- Across all 66 datasets, there are significant question order effects, and the QQ equality holds



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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)



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More formally.

- Consider the following to be true:
 - If A, then X is preferred over Y.
 - If $\neg A$, then X is preferred over Y.



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- Consider the following to be true:
 - If A, then X is preferred over Y.
 - If $\neg A$, then X is preferred over Y.
- Savage's Sure Thing Principle: X should be preferred over Y if we don't know whether A or ¬A.



Order Effect **The conjunction paradox and the two-slit** The prisoner's dilemma A neurophysiological model for quantum cognition. Beyond quantum cognition.

Tversky and Shaffir. Choice under risk. Won/Lost version.

- Imagine that you have just played a game of chance that gave you a 50% chance to win \$200 and a 50% chance to lose \$100. The coin was tossed and you have [won \$200/lost \$100]. You are now offered a second identical gamble
 - 50% chance to win \$200 and
 - 50% chance to lose \$100.
- Would you?
 - X: accept the second gamble? (69% if won (A), 59% if lost (¬A)).
 - Y: reject the second gamble? (31% if won (A), 41% if lost $(\neg A)$).
- Clearly, X is preferred over Y regardless of condition A (won/lost).



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Tversky and Shaffir. Choice under risk. Disjunctive version.

- Imagine that you have just played a game of chance that gave you a 50% chance to win \$200 and a 50% chance to lose \$100.
 Imagine that the coin has already been tossed but that you will not know whether you have won \$200 or lost \$100 until you make your decision concerning a second, identical gamble
 - 50% chance to win \$200 and
 - 50% chance to lose \$100.
- Would you?
 - X: accept the second gamble? (36%).
 - Y: reject the second gamble? (64%).



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How to model with quantum?

Measurement of D_A or D_B affects D_1 and D_2 .



3.5



 $p(D_1|D_A) p(D_A) + p(D_1|D_B) p(D_B) < p(D_1)$



Order Effect The conjunction paradox and the two-slit The prisoner's dilemma A neurophysiological model for quantum cognition. Beyond quantum cognition.

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A possible model

Consider the state

$$|\psi
angle=c_{G}| ext{gamble}
angle+c_{NG}| ext{no gamble}
angle$$

as representing the

$$\psi_+ \approx 0.28 + e^{2.06i} 0.12; \quad \psi_- \approx 0.65 + e^{1.89i} 0.7.$$

- This fits the data.
- Problem: it only gives correct outcomes for "gamble" no "gamble" because it adds new parameters.



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Outline

What is non-classical about quantum mechanics?

- Non-determinism
- Nonlocality

2 Contextuality, quantum, and probabilities

Quantum Cognition

- Order Effect
- The conjunction paradox and the two-slit
- The prisoner's dilemma
- A neurophysiological model for quantum cognition.
- Beyond quantum cognition.



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Pay-off matrix for PD

You defect	You cooperate	
other defects		
other: 10	other: 25	
you:10	you: 5	
other cooperate		
other: 5	other: 20	
you: 25	you: 20	



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Empirical observation

Shafir-Tversky (1992): 97 (know to defect); 84 (known cooperate); 63 (unknown) Croson (1999): 67 (defect); 32 (cooperate); 30 (unknown) Li & Taplan (2002): 83(defect); 66(cooperate); 60 (unknown); Busemeyer et al. (2006): 91(defect); 84(cooperate); 66 (unknown); Average: 84(defect); 66(cooperate); 55 (unknown)



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Beliefs and actions

• $\Omega = \{B_D A_D, B_D A_C, B_C A_D, B_C A_C\}$, where A refers to your action and B to your belief of what the other person will do, and D and C are defect and cooperate.

$$|\psi\rangle = \begin{bmatrix} \psi_{DD} \\ \psi_{DC} \\ \psi_{CD} \\ \psi_{CC} \end{bmatrix}$$



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Beliefs and actions

$$|\psi
angle = \left[egin{array}{c} \psi_{DD} \ \psi_{DC} \ \psi_{CD} \ \psi_{CC} \ \psi_{CC} \end{array}
ight].$$

• The terms for the Hamiltonian are (μ_D is a parameter for defection and μ_C for collaboration)

$$H_D = \frac{1}{\sqrt{1 + \mu_D^2}} \begin{bmatrix} 1 & 0 \\ 0 & 0 \end{bmatrix} \otimes \begin{bmatrix} \mu_D & 1 \\ 1 & -\mu_D \end{bmatrix}$$
$$H_C = \frac{1}{\sqrt{1 + \mu_C^2}} \begin{bmatrix} 0 & 0 \\ 0 & 1 \end{bmatrix} \otimes \begin{bmatrix} \mu_C & 1 \\ 1 & -\mu_C \end{bmatrix}$$



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Meaning of parameters

- $H_D + H_C$ rotates the state to favor either defection or cooperation, depending on the parameters μ_D or μ_C , corresponding to gain if defect
- $\mu_D = u(x_{DD}x_{DC})$ and $\mu_C = u(x_{CD}x_{CC})$, where x_{ij} is the payoff you receive if your opponent takes action *i* and you take action *j*
- *u* is a monotonic utility function



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First term for the Hamiltonian

• The Hamiltonian is given by

$$H_{0} = H_{C} + H_{D} = \begin{bmatrix} \frac{\mu_{D}}{\sqrt{1+\mu_{D}^{2}}} & \frac{1}{\sqrt{1+\mu_{D}^{2}}} & 0 & 0\\ \frac{1}{\sqrt{1+\mu_{D}^{2}}} & -\frac{\mu_{D}}{\sqrt{1+\mu_{D}^{2}}} & 0 & 0\\ 0 & 0 & \frac{\mu_{C}}{\sqrt{1+\mu_{C}^{2}}} & \frac{1}{\sqrt{1+\mu_{C}^{2}}}\\ 0 & 0 & \frac{1}{\sqrt{1+\mu_{C}^{2}}} & -\frac{\mu_{C}}{\sqrt{1+\mu_{C}^{2}}} \end{bmatrix}$$



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Dissonance

- H_0 is monotonic, and therefore does not violate STP
 - It is the "rational" part of the model
- Sometimes participants get new information that disagrees with their belief (when participants had to decide). So, *H* gets a correction

$$H_{NI} = \begin{bmatrix} -\frac{\gamma}{\sqrt{2}} & 0 & -\frac{\gamma}{\sqrt{2}} & 0\\ 0 & \frac{\gamma}{\sqrt{2}} & 0 & -\frac{\gamma}{\sqrt{2}}\\ -\frac{\gamma}{\sqrt{2}} & 0 & \frac{\gamma}{\sqrt{2}} & 0\\ 0 & -\frac{\gamma}{\sqrt{2}} & 0 & -\frac{\gamma}{\sqrt{2}} \end{bmatrix}$$



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Final Hamiltonian

The final Hamiltonian is then





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Evolution

• Evolution is given by

$$U(t)=e^{-iHt},$$

and t is chosen to be $\pi/2$ (roughly the average time participants make a decision).

Initial state is

$$|\psi_0
angle = rac{1}{2} \left[egin{array}{c} 1 \\ 1 \\ 1 \\ 1 \end{array}
ight].$$

- Choosing parameters $\mu_D = \mu_C = 0.59$, $\gamma = 1.74$ produces (.68, .58, .37) whereas Tversky and Shaffir observed (.69, .59, .36), a good fit.
- Other parameter values match well the other experiments.



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Neurons all the way down?

- 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.



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Stimulus and response neurons


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Kuramoto Equations

• If no interaction,

$$O_i(t) = A_i \cos \varphi_i(t) = A_s \cos(\omega t),$$

$$\varphi_i=\omega_it+\delta_i,$$

and

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



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Kuramoto Equations

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$$O_i(t) = A_i \cos \varphi_i(t) = A_s \cos(\omega t),$$

$$\varphi_i=\omega_it+\delta_i,$$

and

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

• If we have a weak interaction, then

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



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The intuition



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How to represent responses with few oscillators?

• Each neural oscillator's dynamics can be described by the phase, φ .

$$s(t) = A_s \cos \varphi_s(t) = A_s \cos(\omega t),$$

$$r_1(t) = A_1 \cos \varphi_{r_1}(t) = A \cos(\omega t + \delta \varphi),$$

$$r_2(t) = A_2 \cos \varphi_{r_2}(t) = A \cos(\omega t + \delta \varphi - \pi).$$

$$l_1 \equiv \left\langle (s(t) + r_1(t))^2 \right\rangle_t = A^2 (1 + \cos(\delta \varphi)).$$

$$l_2 \equiv \left\langle (s(t) + r_2(t))^2 \right\rangle_t = A^2 (1 - \cos(\delta \varphi)).$$

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

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



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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.,

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



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Reinforcing oscillators

• During reinforcement:

$$egin{aligned} \dot{\phi}_i &= & \omega_i + \sum \left[A_{ij} \sin \left(\phi_j - \phi_i
ight) + B_{ij} \cos \left(\phi_j - \phi_i
ight)
ight] \ &+ \mathcal{K}_0 \sin \left(\varphi_E - \varphi_i + \delta_{Ei}
ight). \ &rac{dk_{ij}^E}{dt} = arepsilon \left(\mathcal{K}_0
ight) \left[lpha \cos \left(\varphi_i - \varphi_j
ight) - k_{ij}
ight], \ &rac{dk_{ij}^l}{dt} = arepsilon \left(\mathcal{K}_0
ight) \left[lpha \sin \left(\varphi_i - \varphi_j
ight) - k_{ij}
ight]. \end{aligned}$$



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



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Response selection





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Conditional probabilities





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STAT

Conditional probabilities



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Oscillator interference



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Some data

- 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 s₁ and s₂ are activated, we can have interference between s₁ and s₂.
- In such cases, X is selected less than 40% of the time.



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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?



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Outline

1) What is non-classical about quantum mechanics?

- Non-determinism
- Nonlocality

2 Contextuality, quantum, and probabilities

Quantum Cognition

- Order Effect
- The conjunction paradox and the two-slit
- The prisoner's dilemma
- A neurophysiological model for quantum cognition.
- Beyond quantum cognition.



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The simplest example

- Let X, Y, and Z be ± 1 random variables with zero expectation.
- Let

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

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



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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.



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A not-so-simple oscillator model



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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 X̂, Ŷ, and Ẑ.
- 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.



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Overall Summary.

- People behave in ways that are not rational, violating Kolmogorov's axioms of probability.
- The quantum mechanical formalism has been proposed as a tool in cognitive modeling (quantum cognition).
- Such formalism brings with it lots of baggage not present in brain processes (most notably non-locality as well as no signaling).
- If we relax the formalism, and allow simpler quantum-like interference (without the Hilbert space) with oscillators, we obtain systems that are not quantum.

