

Toward a Quantum Theory of Cognition: History, Development and Perspectives

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Example: Modeling Concept Conjunction and Negation

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$$\mu(AB) \leq \mu(A), \quad \mu(AB) \leq \mu(B), \quad (1)$$

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- ▶ Ex. $\mu(A) = 0.7$, $\mu(B) = 0.42$, and $\mu(AB) = 0.1$ is not a possible experience.

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 6. **ETC.**
- ▶ However, there is a body of experimental evidence that challenges the validity of the conditions of possible experience in cognition

Example: Overextension of Conjunction

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- ▶ However, psychological findings show strong 'overextensions' (inversions of (3)) in experimental data (Osherson & Smith, 1981; Hampton, 1988).

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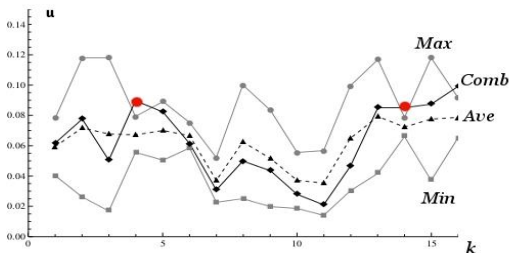
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- ▶ We would expect $\mu(AB) \leq \mu(X)$, $X = A, B$. However, all objects are overextended (red points are *doubly* overextended)

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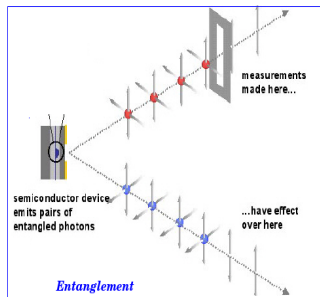
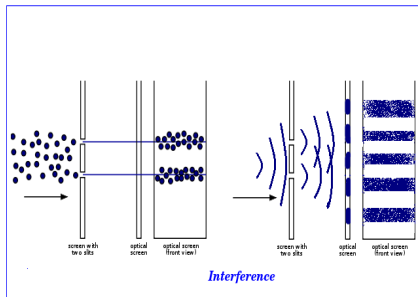
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- ▶ These three features have been largely discussed in cognitive science, but no formal tools have proven to be satisfactory

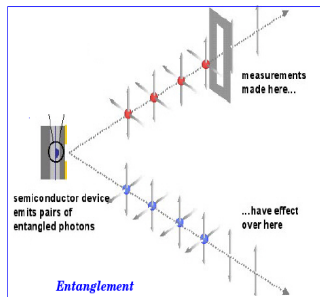
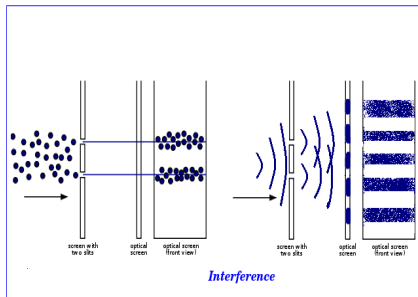
Violations of Possible Experience and Quantum Probability

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- ▶ Vagueness → State Superposition
- ▶ Context → Measurement-Induced Collapse
- ▶ Non-compositionality → Interference, Entanglement

Analogy: Quantum Particles and Concepts

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 - etc. (QI Proceedings, 2007-2015).
- ▶ Quantum Cognition **does not** follow or take a position w.r.t. *Quantum brain* hypothesis

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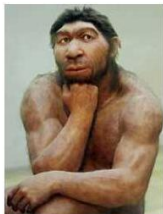
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- ▶ In the second case, two instances of 'banana' are taken into consideration, one for with respect to the meaning of '*Fruit*,' and the other with respect to '*Vegetable*.'

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- ▶ In the second case, two instances of 'banana' are taken into consideration, one for with respect to the meaning of '*Fruit*,' and the other with respect to '*Vegetable*.'

Modes of Thought

Emergent Mode of Thought (Hilbert Space)



YES

Logical Mode of Thought (Tensor Product)



No

Quantum Modeling of the two Modes of Thought

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- ▶ The conjunction concept is described by the superposition of modes of thought

$$|AB\rangle = ne^{i\phi}|AB_1\rangle + \sqrt{1-n^2}e^{i\theta}|AB_2\rangle$$

- ▶ $n = 1$ implies first mode and $n = 0$ implies second mode of thought

A Simple Model Illustrating the General Scheme

- ▶ The membership operator is $\mathbf{M}^F = \mathbf{M} \oplus (\mathbf{M} \otimes \mathbf{M})$. Then

$$\begin{aligned}\mu(AB) &= \langle AB | \mathbf{M}^F | AB \rangle \\ &= n^2 \left(\frac{\mu(A) + \mu(B)}{2} + \Re(\langle A | M | B \rangle) \right) + (1 - n^2)\mu(A)\mu(B).\end{aligned}\tag{4}$$

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- ▶ Concrete representations assuming $\mathcal{H} = \mathbb{C}^3$ (Veloz, 2015)
- ▶ Can we assume that *conditions of possible experience* of this type apply in cognition?

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- ▶ We tested 4 pairs of concepts, 24 exemplars for each pair.

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Λ_A	(-0.074, -0.032)	(-0.064, -0.037)	(-0.034, -0.014)	(-0.036, 0.000)
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95% CI	$j = 1$	$j = 2$	$j = 3$	$j = 4$
I_A	(-0.469, -0.406)	(-0.476, -0.390)	(-0.426, -0.349)	(-0.463, -0.398)
I_B	(-0.482, -0.427)	(-0.443, -0.376)	(-0.429, -0.368)	(-0.495, -0.446)
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- ▶ What about trying the quantum model developed for conjunctions in this case?

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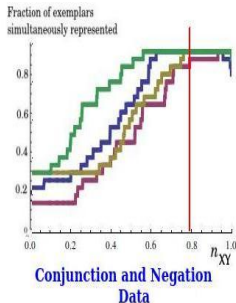
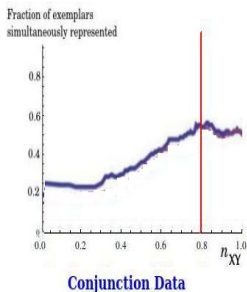
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- ▶ Non classical data can be modeled in this scheme!

Comparing different datasets

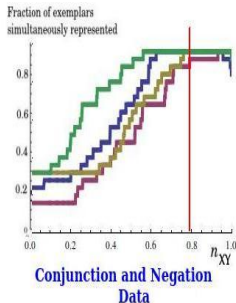
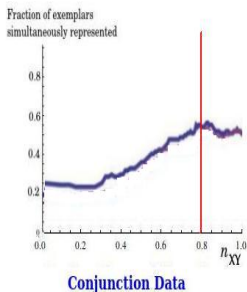
Comparing the model's performance w.r.t data set on conjunction (Hampton), and on conjunction and negation (Aerts, Sozzo, Veloz)



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 Emergent mode of thought is dominant in these two distinct datasets!

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- ▶ Data reveals emergent mode of thought is dominant
- ▶ Shall we think of new (quantum?) conditions of possible experience in cognition?

Thank you!...questions?



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Proceedings of the n-th Quantum Interaction Symposium-Qi-n, n=2007,...,2015.



These and the other references can be requested to me, space problems to put them all!