

# Meaning updating of density matrices

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*This is a three-page abstract of a paper with the same title, currently under review as an invited submission for a SEMSPACE special issue of the Journal of Applied Logics. The full version is [arXiv:1904.03478](https://arxiv.org/abs/1904.03478).*

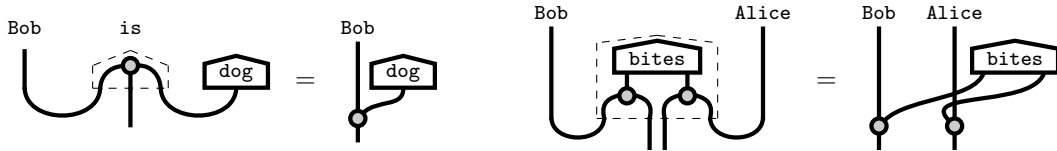
## Abstract

The DisCoCat model of natural language meaning assigns meaning to a sentence given: (i) the meanings of its words, and, (ii) its grammatical structure. The recently introduced DisCoCirc model extends this to text consisting of multiple sentences. While in DisCoCat all meanings are fixed, in DisCoCirc each sentence updates meanings of words. In this paper we explore different update mechanisms for DisCoCirc, in the case where meaning is encoded in density matrices—which come with several advantages as compared to vectors.

Our starting point are two non-commutative update mechanisms, borrowing one from quantum foundations research [5, 6], and the other one from [3, 7]. Unfortunately, neither of these satisfies any desirable algebraic properties, nor are internal to the meaning category. By passing to double density matrices [1, 10] we do get an elegant internal diagrammatic update mechanism.

We also show that (commutative) spiders can be cast as an instance of the update mechanism of [5, 6]. This result is of interest to quantum foundations, as it bridges the work in Categorical Quantum Mechanics (CQM) with that on conditional quantum states. Our work also underpins implementation of text-level Natural Language Processing (NLP) on quantum hardware, for which exponential space-gain and quadratic speed-up have previously been identified.

First we recast DisCoCirc as a theory of updating e.g.:



In this form, agents Alice and/or Bob are updated with (being a) dog and (being in a) biting relationship respectively. This idea applies to essentially all diagrammatic constructs, so:

*What is the grey dot?*

We consider this question for the specific case that of meanings as density matrices.

Following [9, 8] it is natural to think of propositions for natural language meaning like (being a) dog as a projector, just as in Birkhoff-von Neumann quantum logic [2]. Imposing a proposition on a density matrix is then realised as follows:

$$P \circ \rho \circ P \tag{1}$$

How does this generalise to imposing a density matrix? Two options have already been proposed:

$$\rho \begin{array}{c} \text{⌂} \\ \text{⬮} \end{array} \sigma := \sum_i x_i \left( P_i \circ \rho \circ P_i \right) \quad \text{with} \quad \sigma := \sum_i x_i P_i \tag{2}$$

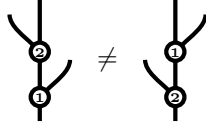
$$\rho \begin{array}{c} \text{⌂} \\ \text{⬮} \end{array} \sigma := \left( \sum_i x_i P_i \right) \circ \rho \circ \left( \sum_j x_j P_j \right) \quad \text{with} \quad \sigma := \sum_i x_i^2 P_i \tag{3}$$

The first of these, which we call *fuzz*, was proposed in [3, 7] specifically for NLP. The second one, which we call *phaser*, was proposed in the form  $\sqrt{\sigma} \rho \sqrt{\sigma}$  within the context of a quantum theory of Bayesian inference [5, 6, 4]. A first result concerns the relationship of the phaser to the spiders of CQM:

**Theorem.** The phaser, when the 1st argument is pure, takes the form of a spider where the ONB in which the spider is expressed arises from diagonalisation of the 2nd argument. Explicitly, setting  $|x\rangle = (x_1 \dots x_{n-1})^T$ , we have:

$$\left(|\psi\rangle\langle\psi|\right) \text{ (spider with dot) } \left(\sum_i x_i^2 |i\rangle\langle i|\right) = |\phi\rangle\langle\phi| \quad \text{where} \quad |\phi\rangle := \text{ (spider with inputs } \psi \text{ and } x \text{)}$$

Importantly, these spiders may be expressed in different ONBs which they inherit from the 2nd argument  $\sigma$ , and if we update with nouns which diagonalise in different bases, then the corresponding spiders typically won't commute:



Hence, for the phaser, it is the properties with which the nouns are updated that control commutativity.

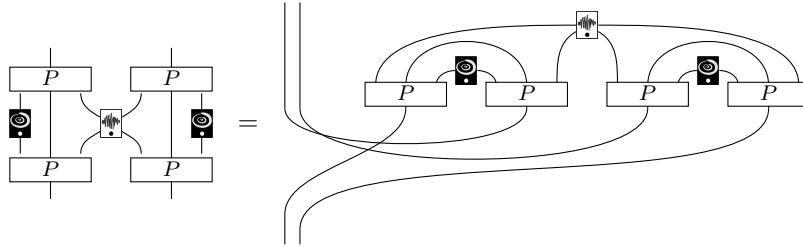
The existence of two candidates for meaning updating seems to indicate that there is no unique grey dot. Also, neither the fuzz nor the phaser is a CP-map on the input  $\rho \otimes \sigma$ . In other words, these update mechanisms are not *internal* to the meaning category. Both of these problems can be overcome by considering the *double density matrices* (DDMs) of [1, 10], which take the form:

$$\sum_{ijk} |\omega_{ik}\rangle |\bar{\omega}_{ik}\rangle |\omega_{jk}\rangle |\bar{\omega}_{jk}\rangle \quad \text{i.e. diagrammatically} \quad \text{(diagram with four boxes labeled } \omega, \bar{\omega}, \omega, \bar{\omega} \text{ and a central dot)}$$

Using spectral decomposition of  $\sum_i |\omega_{ik}\rangle \langle \omega_{ik}|$  and map-state-duality this can be rewritten as:

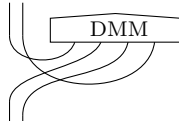
$$\sum_k y_k \left( \sum_i x_{ik} P_{ik} \circ P_{ik} \right) \circ - \circ \left( \sum_j x_{jk} P_{jk} \circ P_{jk} \right) \quad \text{i.e. diagrammatically} \quad \text{(diagram with four boxes labeled } P \text{ and two spiders with dots)}$$

where we indicated indicate the roles of fuzz and phaser. Our general update mechanism including a grey dot merely consisting of wires now is:

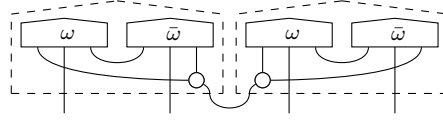


so we can conclude:

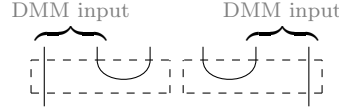
**Theorem.** DMMs enable one to unify fuzz and phaser in a combined update mechanism, where fuzz and phaser correspond to the two modes of mixedness of DDMs. In order to do so, meanings of propositions are generalised to being DMMs, and the update dot is then entirely made up of wires only:



We can still take as meaning category density matrices with CP-maps as processes, since we can indeed think of a DMM as a density matrix of the form:



The update dot is a CP-map of the form:



In this way we obtain a meaning category for which updating is entirely internal.

**The remainder of the full version [arXiv:1904.03478](#) provides some examples of this formalism in action, for example, the changing colours of things after over-painting, and how the two modes of mixing, fuzz and phaser, are both needed, for example for describing the meaning of black metal fan.**

## References

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