## Article

# A Compositional model of Consciousness based on subjectivity as a fundamental feature of nature

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- Abstract: The scientific studies of consciousness are mainly based on objective neural mechanism,
- <sup>2</sup> relying on objects whose existence is independent of any consciousness, but generating epistemic and
- ontological problems. Alternatively, in this paper consciousness is assumed as fundamental, and the
- 4 main feature of consciousness characterized as the other-dependent. This approach is mainly inspired has the Part debian active ac
- by the Buddhism philosophy of the Yogacara school. Therefore, we set up a framework of compact
  closed category whose morphisms are composed of a set of generators being specified by relations
- closed category whose morphisms are composed of a set of generators being specified by relations
   with other generators. The framework naturally subsumes the other-dependent feature. Moreover, it
- is general enough, i.e. parameters in the morphisms take values in arbitrary commutative semirings,
- from which any finitely dimensional system can be dealt with, fitting well into a compositional model

of consciousness. Finally, as a preliminary application of our framework, we explore a solution to a

toy model of the feature biding problem.

12 Keywords: Consciousness; Conscious Agents; Compositionality; Binding problem; Mathematics of

<sup>13</sup> Conciousness; Monoidal Categories.

## 14 1. Introduction

The science of consciousness have gained considerable understanding of objective neural 15 mechanisms of consciousness, however, this strategy has also failed in recovering subjective features 16 such as the unity of consciousness from these objective and measurable mechanisms. Thus, we present 17 an alternative approach (Section 2), which takes inspiration from the Yogacara school [1,2], but also 18 to some extent in line with the hypothesis of conscious agents [3], phenomenology [4], as well as 19 other elements from the unified field hypothesis [5]. Following this approach, subjective aspects of 20 reality, rather than physical objects, are here postulated as primitive and fundamental (Section 2.1), 21 without falling into idealism nor dualism (Section 2.2). Meanwhile, the key feature of consciousness is 22 characterised by other-dependent. This allows us to propose a compositional model for consciousness 23 based on process theory, in other words, symmetric monoidal categories (Section 3 and 3.1). Process 24 theory has proved successful at the moment to understand principles and mathematical structures of 25 physical theories [6], such as quantum theory [7,8], causal models [9,10], relativity [11] and interestingly 26 also natural language [12] and cognition [13,14]. At the core of process theory, there lies the principle of 27 compositionality, which describes unity as the composition of basic elements [15,16]. Moreover, process 28 theory is mathematically abstract thus ontologically neutral. All these make process theory suitable to 29 search for structural properties of consciousness [17]. Specifically, in our model, we use generators in 30 terms of diagrams as basic processes which are defined by interdependent relations between them 31 (Section 3.2, 3.2.1 and 3.2.2). This clearly shows the consciousness feature of other-dependent. Our 32 framework comes with a standard interpretation for each diagram (Section 3.2.3 and 3.2.4), making our 33 theory sound, i.e. without contradictions inside. One goal of our framework is giving a mathematical 34 formalism to target important questions about consciousness. For instance, unity of consciousness 35 may naturally arise as result of composition, so here a toy model for the binding problem is described 36 as an application of our framework (Section 4). Eventually, the ultimate goal is recovering objective 37

- <sup>38</sup> physical theories (e.g. standard quantum mechanics) from primitive notions of subjectivity that indeed
- <sup>39</sup> would correspond to each other, avoiding ontological claims and without the need of invoking any
- <sup>40</sup> physical realization but pure mathematical entities (Section 5).

## **2.** Philosophical considerations

## 42 2.1. Consciousness as Fundamental

The science of consciousness has proved elusive. On the one hand, biology and neuroscience have 43 acquired considerable comprehension of objective neural mechanisms of consciousness [18]. On the 44 other hand, the subjective aspects of conscious experience are mainly neglected by these approaches 45 [19,20] or at least postponed for further developments [21]. The basic assumption is that subjective aspects of experience would emerge from the objective physical properties of the brain. In other words, 47 the world, considered as both objective and subjective, might be entirely constructed by measurable 48 physical generators, and subjective features of reality are merely consequences of the objective and 49 measurable properties of the world. In this line, one would expect that taking a physical objective 50 and mathematical theory, the subjective aspects of the experience may naturally emerge from the interaction and combination of these physical and mathematical generators. Nevertheless, scientific 52 approaches to consciousness have failed in recovering subjectivity from the objective and measurable 53 reality [19,20,22]. 54 It is well recognised that objectivity is a basic assumption of science. Objectivity relates to a 55

perceived or unperceived object while subjectivity to a perceiving subject. The object is meant to exist 56 independently of any subject to perceive it, and as such, objectivity is commonly associated with 57 concepts like truth and reliability [23]. Contrary, subjectivity is always interdependent, it involves 58 both perceived and perceiving aspects, making subjective properties dependent of others interactions 59 and thereof not independent. The assumption of objectivity as primitive or fundamental is deeply 60 grounded in classical neuroscience, as well as other scientific fields [24–26]. Contemporary theories of 61 consciousness tend to focus on the physical parts from which, for example, the unity of experience 62 would emerge as a whole. The parts are considered cells, neurons, brain regions, and the whole being 63 the unified conscious experience. This is called building blocks models [5] or reductionist approaches 64 [25]. 65

Nevertheless, there is an epistemic issue: "our knowledge is limited to the realm of our own 66 subjective impressions, allowing us no knowledge of objective reality as it is in itself" [23]. One 67 alternative to deal with that issue is to remove the assumption of objectivity and take consciousness as a primitive property of the world. One theoretical example is the conscious agent model [3,27], where 69 the world consists of conscious agents and their experiences. Once the emergence of subjectivity is 70 solved, now the inverse problem comes into play: how does objective phenomenon such as quantum 71 physics or relativity arise from? Thus, the aim of such models is recovering fundamental physics from 72 the agent's interactions, for example, quantum mechanics [27]. Ontologically, conscious agent model is 73 different than current scientific approaches to consciousness and cognition. Moreover, there is still 74 much work to satisfactorily reach that goal, and it is not so evident that the current versions of conscious 75 agent models are capable to recover the entire objective realm (see objections and replies section in 76 [27]). Through these pages, we propose some new concepts toward answering these questions, as well 77 as starting form the idea that consciousness and subjectivity are fundamental notion of reality. 78

## 79 2.2. Yogacara Philosophy and Phenomenology

Starting from subjective aspects of reality may sound new to modern science, but the discussion of

- epistemic restrictions have been part of millenary traditions such as Buddhism and its Yogacara school,
- long before phenomenology appears as the science of phenomena and experience. Yogacara (Sanskrit
   for *Yoga Practice*), also called Vijnanavada (*Doctrine of Consciousness*) or Vijnaptimatra (*Consciousness*)
- <sup>83</sup> for Yoga Practice), also called Vijnanavada (*Doctrine of Consciousness*) or Vijnaptimatra (*Consciousness* <sup>84</sup> Only), is one of the two main branches of Mahayana (*Great Vehicle*) Buddhism (the other being

Madhyamaka, *Middle way*). All the alternative names of Yogacara philosophy involve the key
 concept of consciousness, and specifically, consciousness-only. This concept is sometimes wrongly
 interpreted. Nevertheless, the meaning behind is closer to epistemic limitations mentioned in modern

<sup>88</sup> phenomenology than variants of philosophical idealism [1,28].

To understand consciousness-only, another concept from the Yogacara philosophy is needed: 89 Trisvabhāva or the three natures. Trisvabhāva is the premise that all the possible forms of existence are 90 divided into three types: i) Parikalpita-svabhāva, the *fully conceptualized* nature, ii) Paratantra-svabhāva, 91 the other dependent nature, and iii) Parinispanna-svabhāva, the perfect-accomplished-real nature. As explained by [2]: "The first nature is the nature of existence produced from attachment to imaginatively 93 constructed discrimination. The second nature is the nature of existence arising from causes and ٥л conditions. The third nature is the nature of existence being perfectly accomplished (real)". The third 95 nature of existence is "the ultimate reality, something that never changes". An important remark is 96 that this nature does not correspond to mind or the "ultimate mind" from which everything would originate. The ultimate reality is invariant and can not be directly depicted, it is neither objective nor 95 subjective. 99

Interestingly, these three natures are inseparable from the mind and its attributes (*Citta-Caittas*), 100 as mentioned in Cheng Weishi Lun [29] and translated to English by [30]: "The mind and its attributes 101 (Citta-Caittas), together with the manifestations produced by it (darsana and nimittabhaga), are 102 engendered through numerous conditioning factors, and are thus like the phenomena produced 103 by a magician's tricks, which, not really existing though they seem to exist, deceive the ignorant. 104 All this is called the *nature of dependence on others* (Paratantra). The ignorant thereupon perversely 105 believe in them as Atman and as dharmas, which exist or do not exist, are identical or different, are 106 inclusive or exclusive, etc. But, like *flowers in the sky*, etc., they are non-existent both in inner nature 107 and external aspect. All this is called the *nature of mere-imagination* (Parikalpita). These things, which 108 are thus dependent on others and are wrongly regarded as Atman and as dharmas, are in reality, all 109 void (sunya). The genuine nature of consciousness thus revealed by this voidness is called the nature 110 of ultimate reality (Parinispanna). Thus, these three natures are all inseparable from mind...". One 111 can observe from the above citation, that consciousness as process is actually of the second nature 112 of existence: the other dependent nature. Therefore, one main feature of consciousness processes 113 is this "other dependent", unlike fundamental physical particles, whose existences are considered independent of others. 115

This remark might become clear when the mind is defined as possessed by sentient beings. The 116 second nature or the other dependent nature is what Yogacara refers to the mind and its attributes. On 117 that framework, the mind, as part of sentient beings, is divided into eight types of consciousnesses, 118 what in modern science one would call senses or ways of perceiving: the five sense-consciousnesses (eye or visual, ear or auditory, nose or olfactory, tongue or gustatory, body or tactile consciousnesses), 120 mental consciousness, manas consciousness (the seventh or thought-centre consciousness), and alaya 121 consciousness (the eighth or storehouse consciousness). Each type of consciousness manifests itself in 122 two forms: the perceived division (nimittabhaga in Sanskrit) and the perceiving division (darsanabhaga 123 in Sanskrit). Here, mental consciousness becomes relevant because it is closer to modern notions of 124 awareness. Finally, the mind is not related to an invariant nature, but indeed, it is the major mechanism 125 why illusions appear to us, sentient beings [1]. 126

Contrary to dualism, the notions above deny any conceptual duality (e.g. physical-non-physical, external-internal) regarding the *perfect-accomplished-real* nature. Different than idealism [28], the mind is not seen as cause effective of the rest of the world, by only of the illusion of distinctions on that world. Consciousness is essential because everything considered, affirmed or denied, even the idea of objectivity, occur to us only in consciousness. However, consciousness is not the ultimate reality. Therefore, the ontological query is suspended while an epistemic caution is reinforced: "all our efforts to get beyond ourselves are nothing but projections of our consciousness"[1]. In modern words, consciousness-only would be better understood as a claim of awareness-only, or perception-only, muchcloser to phenomenology.

### 136 3. Compositional Model of Consciousness

As presented in the previous section, inspired by the philosophy of the Yogacara school, the key 137 feature of consciousness is other-dependent. Following this idea, it is natural to model consciousness 138 in a categorical framework where morphisms are composed from a given set of generators and each generator is specified by relations with other generators. In this section, we introduce such a framework 140 based on the theory of ZX-calculus invented by Bob Coecke and Ross Duncan [31] as a graphical 141 language for qubit quantum theory. This diagrammatic language is mathematically rigorous [8] and 142 has proven useful to reconstruct different aspects of physical theories. However, our framework is 143 much more general: all finite dimensional ZX-calculus are unified in a single one, thus called qufinite  $ZX_{\Delta}$ -calculus, and the parameters take values in an arbitrary commutative semiring, rather than 145 complex number only. 146

In the sequel, we first give an introduction to the basic concepts in category theory and the concept of commutative semiring, then we present all generators and rewriting rules between them for the qufinite  $ZX_{\Delta}$ -calculus.

150 3.1. Preliminaries

#### 151 Category

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A category  $\mathfrak{C}$  consists of:

- a class of objects  $ob(\mathfrak{C})$ ;
  - for each pair of objects A, B, a set  $\mathfrak{C}(A, B)$  of morphisms from A to B;
    - for each triple of objects A, B, C, a composition map

$$\begin{array}{ccc} \mathfrak{C}(B,C) \times \mathfrak{C}(A,B) & \longrightarrow & \mathfrak{C}(A,C) \\ (g,f) & \mapsto & g \circ f; \end{array}$$

• for each object A, an identity morphism  $1_A \in \mathfrak{C}(A, A)$ ,

156 satisfying the following axioms:

• associativity: for any  $f \in \mathfrak{C}(A, B)$ ,  $g \in \mathfrak{C}(B, C)$ ,  $h \in \mathfrak{C}(C, D)$ , there holds  $(h \circ g) \circ f = h \circ (g \circ f)$ ;

• identity law: for any 
$$f \in \mathfrak{C}(A, B)$$
,  $1_B \circ f = f = f \circ 1_A$ .

A morphism  $f \in \mathfrak{C}(A, B)$  is an *isomorphism* if there exists a morphism  $g \in \mathfrak{C}(B, A)$  such that  $g \circ f = 1_A$ and  $f \circ g = 1_B$ . A *product category*  $\mathfrak{A} \times \mathfrak{B}$  can be defined componentwise by two categories  $\mathfrak{A}$  and  $\mathfrak{B}$ .

#### 161 Functor

Given categories  $\mathfrak{C}$  and  $\mathfrak{D}$ , a functor  $F : \mathfrak{C} \longrightarrow \mathfrak{D}$  consists of:

• a mapping

• for each pair of objects *A*, *B* of *C*, a map

$$\begin{array}{rcl} \mathfrak{C}(A,B) & \longrightarrow & \mathfrak{D}(F(A),F(B)) \\ f & \mapsto & F(f), \end{array}$$

163 satisfying the following axioms:

• preserving composition: for any morphisms  $f \in \mathfrak{C}(A, B), g \in \mathfrak{C}(B, C)$ , there holds  $F(g \circ f) = F(g) \circ F(f)$ ;

• preserving identity: for any object A of  $\mathfrak{C}$ ,  $F(1_A) = 1_{F(A)}$ .

A functor  $F : \mathfrak{C} \longrightarrow \mathfrak{D}$  is *faithful (full)* if for each pair of objects *A*, *B* of  $\mathfrak{C}$ , the map

$$\begin{array}{ccc} \mathfrak{C}(A,B) & \longrightarrow & \mathfrak{D}(F(A),F(B)) \\ f & \mapsto & F(f) \end{array}$$

167 is injective (surjective).

#### 168 Natural transformation

Let  $F, G : \mathfrak{C} \longrightarrow \mathfrak{D}$  be two functors. A natural transformation  $\tau : F \to G$  is a family  $(\tau_A : F(A) \longrightarrow G(A))_{A \in \mathfrak{C}}$  of morphisms in  $\mathfrak{D}$  such that the following square commutes:

$$F(A) \xrightarrow{\tau_A} G(A)$$

$$F(f) \downarrow \qquad \qquad \downarrow G(f)$$

$$F(B) \xrightarrow{\tau_B} G(B)$$

171

for all morphisms  $f \in \mathfrak{C}(A, B)$ . A natural isomorphism is a natural transformation where each of the  $\tau_A$  is an isomorphism.

### 174 Strict monoidal category

- A strict monoidal category consists of:
- a category C;
- a unit object  $I \in ob(\mathfrak{C})$ ;
- a bifunctor  $-\otimes -: \mathfrak{C} \times \mathfrak{C} \longrightarrow \mathfrak{C}$ ,

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179 satisfying
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- associativity: for each triple of objects A, B, C of  $\mathfrak{C}, A \otimes (B \otimes C) = (A \otimes B) \otimes C$ ; for each triple of morphisms f, g, h of  $\mathfrak{C}, f \otimes (g \otimes h) = (f \otimes g) \otimes h$ ;
- unit law: for each object A of  $\mathfrak{C}$ ,  $A \otimes I = A = I \otimes A$ ; for each morphism f of  $\mathfrak{C}$ ,  $f \otimes 1_I = f = 1_I \otimes f$ .

#### 184 Strict symmetric monoidal category

A strict monoidal category  $\mathfrak{C}$  is symmetric if it is equipped with a natural isomorphism

$$\sigma_{A,B}: A \otimes B \to B \otimes A$$

for all objects *A*, *B*, *C* of  $\mathfrak{C}$  satisfying:

$$\sigma_{B,A} \circ \sigma_{A,B} = 1_{A \otimes B}, \ \sigma_{A,I} = 1_A, \ (1_B \otimes \sigma_{A,C}) \circ (\sigma_{A,B} \otimes 1_C) = \sigma_{A,B \otimes C}$$

#### 187 Self-dual strict compact closed category

A self-dual strict compact closed category is a strict symmetric monoidal category  $\mathfrak{C}$  such that for each object A of  $\mathfrak{C}$ , there exists two morphisms

$$\epsilon_A: A \otimes A \to I, \ \eta_A: I \to A \otimes A$$

188 satisfying:

$$(\epsilon_A \otimes 1_A) \circ (1_A \otimes \eta_A) = 1_A, \ (1_A \otimes \epsilon_A) \circ (\eta_A \otimes 1_A) = 1_A.$$

#### **189** Commutative Semiring

A commutative semiring is a set S equipped with addition + and multiplication  $\cdot$ , such that:

• (S, +) is a commutative monoid with identity element 0:

$$(a+b) + c = a + (b+c), \quad 0+a = a+0 = a, \quad a+b = b+a$$

•  $(S, \cdot)$  is a commutative monoid with identity element 1:

$$(a \cdot b) \cdot c = a \cdot (b \cdot c), \quad a \cdot b = b \cdot a, \quad 1 \cdot a = a \cdot 1 = a$$

• Multiplication left and right distributes over addition:

$$a \cdot (b+c) = (a \cdot b) + (a \cdot c), \quad (a+b) \cdot c = (a \cdot c) + (b \cdot c)$$

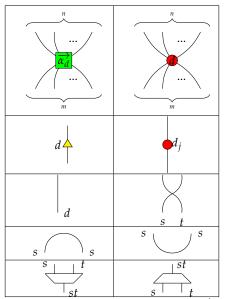
• Multiplication by 0 annihilates elements in S:

$$0 \cdot a = a \cdot 0 = 0$$

**191** 3.2. *Qufinite*  $ZX_{\Delta}$ -calculus as a Compositional Model of Consciousness

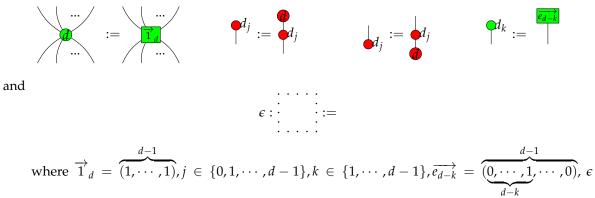
In this section, we give a graphical calculus for processes which we call qufinite  $ZX_{\Delta}$ -calculus which has a presentation in terms of diagrammatic generators and rewriting rules. Throughout this section,  $\mathbb{N} = \{0, 1, 2, \dots\}$  is the set of natural numbers,  $2 \le d \in \mathbb{N}$ ,  $\oplus$  is the modulo *d* addition, *S* is an arbitrary commutative semiring. All the diagrams are read from top to bottom.

- **3.2.1.** Generators of Qufinite  $ZX_{\Delta}$ -calculus
- First we give all the generators for the qufinite  $ZX_{\Delta}$  calculus.



**Table 1.** Generators of qufinite  $ZX_{\Delta}$ -calculus, where  $m, n \in \mathbb{N}, \overrightarrow{a_d} = (a_1, \dots, a_{d-1}), a_i \in S, i \in \{1, \dots, d-1\}, j \in \{0, 1, \dots, d-1\}, s, t \in \mathbb{N} \setminus \{0\}.$ 

For simplicity, we make the following conventions:

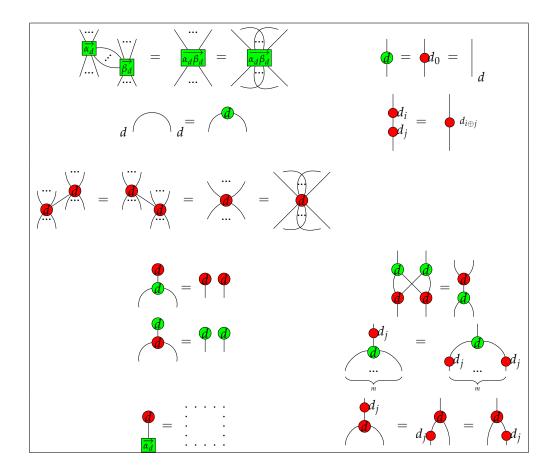


<sup>199</sup> represents an empty diagram.

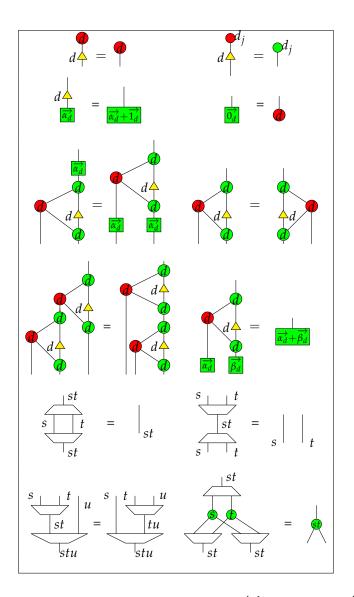
198

<sup>200</sup> 3.2.2. Rules of Qufinite  $ZX_{\Delta}$ -calculus

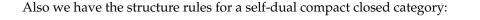
Now we give some rewriting rules for qufinite  $ZX_{\Delta}$ -calculus which specify the generators.

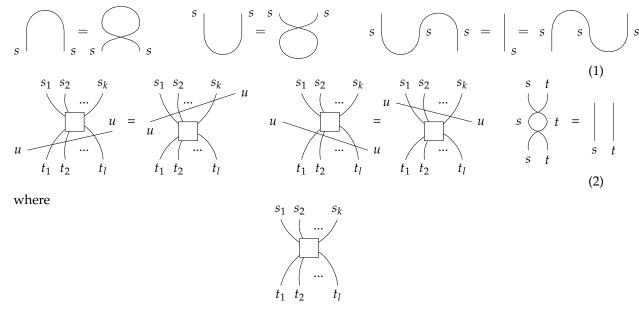


**Figure 1.** Qufinite  $ZX_{\Delta}$ -calculus rules I, where  $\overrightarrow{a_d} = (a_1, \dots, a_{d-1}), \overrightarrow{\beta_d} = (b_1, \dots, b_{d-1}), \overrightarrow{a_d\beta_d} = (a_1b_1, \dots, a_{d-1}b_{d-1}), a_k, b_k \in S, k \in \{1, \dots, d-1\}, j \in \{0, 1, \dots, d-1\}, m \in \mathbb{N}.$ 



**Figure 2.** Qufinite  $ZX_{\Delta}$ -calculus rules II, where  $\overrightarrow{1}_d = \overbrace{(1, \dots, 1)}^{d-1}, \overrightarrow{0}_d = \overbrace{(0, \dots, 0)}^{d-1}, \overrightarrow{\alpha}_d = (a_1, \dots, a_{d-1}), \overrightarrow{\beta}_d = (b_1, \dots, b_{d-1}), a_k, b_k \in S, k \in \{1, \dots, d-1\}, j \in \{1, \dots, d-1\}, s, t, u \in \mathbb{N} \setminus \{0\}.$ 





<sup>202</sup> is an arbitrary diagram in the qufinite  $ZX_{\Delta}$ -calculus.

From that, the strict compact closed category  $\mathfrak C$  is defined. The objects of  $\mathfrak C$  are all the positive 203 integers, and the monoidal product on objects are multiplication of integer numbers. Denote the 204 set of generators listed in Table 1 as G. Let C[G] be a free monoidal category generated by G in the 205 following way: any two diagrams  $D_1$  and  $D_2$  are placed side-by-side with  $D_1$  on the left of  $D_2$  to form 206 the monoidal product on morphisms  $D_1 \otimes D_2$ , or the outputs of  $D_1$  connect with the inputs of  $D_2$ 207 when their types all match to each other to form the sequential composition of morphisms  $D_2 \circ D_1$ . 208 The empty diagram is a unint of parallel composition and the diagram of a straight line is a unit of 209 the sequential composition. Denote the set of rules listed in Figure 1, Figure 2, (1) and (2) by R. One 210 can check that rewriting one diagram to another diagram according to the rules of R is an equivalence 211 relation on diagrams in  $\mathcal{C}[G]$ . We also call this equivalence as R, then the quotient category  $\mathfrak{C} = \mathcal{C}[G]/R$ 212 is a strict compact closed category. The qufinite ZX-calculus is seen as a graphical calculus based on 213 the category C. 214

**3.2.3**. Standard interpretation of qufinite  $ZX_{\Delta}$ -calculus

Let  $\operatorname{Mat}_{S}$  be the category whose objects are non-zero natural numbers and whose morphisms  $M: m \to n$  are  $n \times m$  matrices taking values in a given commutative semiring S. The composition is matrix multiplication, the monoidal product on objects and morphisms are multiplication of natural numbers and the Kronecker product of matrices respectively. We give a standard interpretation  $\llbracket \cdot \rrbracket$  for the qufinite  $ZX_{\Delta}$ -calculus diagrams in  $\operatorname{Mat}_{S}$ :

$$\begin{bmatrix} & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & &$$

<sup>217</sup> the integer part of a real number *r*.

216

One can verify that the qufinite  $ZX_{\Delta}$ -calculus is sound in the sense that for any two diagrams  $D_1, D_2 \in \mathfrak{C}, D_1 = D_2$  must imply that  $[D_1] = [D_2]$ .

i+1

## 220 3.2.4. Interpretation in terms of Consciousness model

i+1

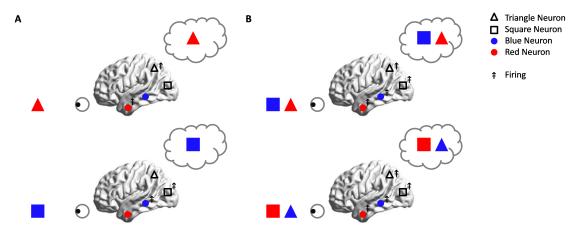
The qufinite  $ZX_{\Delta}$ -calculus, as a compositional theory for processes, actually has the "other 221 dependent" feature which is one of the key feature of consciousness described above: the generators of 222 qufinite  $ZX_{\Delta}$ -calculus are not specified by themselves. In contrast, each of them are specified by the 223 others, as it is possible to observe in the rewriting rules. The non-generator diagrams (as processes) 224 are produced by thus being dependent on the generators. Furthermore, each diagram with output but without input will represent a consciousness state, and a general diagram represents some sort 226 of consciousness process. Compositionally, sequential composition of two diagrams represents two 227 successive consciousness processes happened one after another, while parallel composition of two 228 diagrams represents two successive consciousness processes happened simultaneously. This justifies 229 our use of the framework of qufinite  $ZX_{\Delta}$ -calculus as a compositional model for consciousness under 230 the approach/assumption of "consciousness as fundamental". 231

#### 232 4. The Feature Binding

#### 233 4.1. Unbinding the Binding Problem

<sup>234</sup> Unity of consciousness is commonly associated with, but not reduced to, the binding properties <sup>235</sup> of perception, neurons and brain regions. The so-called binding problem [32,33]. In a materialistic <sup>236</sup> and reductionist formulation, the problem is stated as the need of a neural mechanism from which <sup>237</sup> unified experiences emerge by a combination of separated elements, e.g. how to bind different features <sup>238</sup> of a perceived object, such as colour and shape (Figure 3A). This corresponds to a low level of the <sup>239</sup> **combination aspect** of the binding problem [33]. A high level would be another instance where these

combined objects are thought to be bound with other background features, as well as emotional 240 feelings to create one single unified phenomenal subjective experience [34]. This is the phenomenal 241 unity of the combination problem [32,34], the intuition that regardless of the distinct neural paths, our 242 experiences are integrate-wholes. This is the subjective or **phenomenal binding problem**. According 243 to this construction, the subjective unified experience seems inconsistent with the many separate brain 244 activities from which the whole experience is thought to emerge, there is not a single module or region 245 where that integration may take place [33,35]. Furthermore, there is a segregation aspect of binding, i.e. 246 having a blue square and a red triangle how one can recognize that the blue belongs to the square and the red to the triangle and not vice versa [33,35,36]. In other words, how sensory inputs are allocated 248 to recognize "discrete objects" and not just a collection of separated colours and shapes (Figure 3B). 249 Mechanistically, the question is how cells and neurons recognize that they are being activated either 250 by different objects or by only one complex object. This is a discrimination issue, the **feature binding** 251 problem, associated with distinctive properties of experience. Both, the combination and segregation, 252 are considered part of one and the same binding problem. Hence, the question becomes to understand 253 how properties of objects are first combined, then segregated to later being recombined or unified in 254 one whole experience together with all the extra features of the experienced context. 255



**Figure 3.** The Feature Binding Problem. A) The combining aspect of binding is about how cells and neurons integrate different features, for instance, shape and colour. Based on the assumption of independent neurons or modular brain regions processing different features, the integration may take place if neurons corresponding to each feature are simultaneously activated. In the upper figure, a red triangle activates the triangle shape neuron and the colour red neuron, in lower figure an example for blue square. B) The problem arises when the triangle and the square are presented simultaneously, first with one combination of colours (top) and then inverting them (bottom). In both cases, all the neurons or regions are activated at the same time. Therefore, the question becomes how the brain can segregate each colour to the corresponding shape. One alternative is a combination coding, such as new layers of neurons would bind the previous ones. Another is binding by synchrony, i.e. neurons with correlated firing would bind features together. Unfortunately, for these and other possible solutions, there are theoretical and empirical concerns. The main objection is indeed the original assumption of independent processing features or modular paths.

Unfortunately, these two aspects and versions of the problem are not always differentiated, making the discussion sometimes ambiguous [37]. In this line, Revonsuo and others clearly stated different related binding problems, some associated with consciousness and others not. At least three levels are distinguished: phenomenal, neural and cognitive [32]. In turns that Feldman describes four binding problems [33]: Coordination, Subjective, Feature and Variable binding, all of them regarded to different tasks, time scales and brain circuits. According to these definitions, different models are trying to solve the questions about combination and segregation, mainly regarding feature binding. Some of them are combination coding, population coding, binding by synchrony [38], and feature integration model [39]. However, none of them is theoretically and empirically satisfactory, they seem
acting at different hierarchical levels and stages of perception [35,36], leaving important open questions
that need to be reconsidered in light of new compositional and diagrammatic concepts presented in
previous and next section (Section 4.2). To avoid any confusion, our focus will be the feature binding
regarding the combination and segregation aspects, while the subjective/phenomenal problem is
leaved for a future discussion.

#### 270 4.2. A Toy model for Feature Binding

The original version of feature binding problem comes from the apparent modular codification 271 observed in neurons of the primary visual cortex, which seemed to respond selectively to single 272 features, such as colour or shape. It creates the paradox that any original combination or relationships 273 between stimuli features are lost when decomposed into independent modules, and the need of recombination somewhere later [37]. Nevertheless, this modular independence is misleading and 275 disconfirmed by modern experiments [40–42]. The same neuron is activated by multiple stimuli and 276 features, and indeed it is also concurrently selective to combinations of features [37]. The brain works 277 in parallel where different circuits and tasks are performed simultaneously. Therefore, the unbinding, 278 the separations of the causes of an input, seems more relevant than binding itself [33]. 279

Unity of consciousness may be naturally described as a result of composition. In this sense, an 280 application of our framework is given as a tentative solution for a toy model of the feature binding 281 problem, which additionally is seen as a part of that unity. Assume there are two choices for colour: 282 green and red; and two choices for shape: square and triangle. The scenario of the feature binding 283 is as follows: given a shape and a colour at the same time, say, square and red, one can perceive a 284 combined object- red square; given two combined objects, say green square and red triangle, one can 285 perceive the two objects simultaneously. Then the binding problem is simply restated as: what is the 286 mechanism/transformation for realising the above scenario? 287

One alternative to solve this question borrows an idea from quantum theory. Firstly, the two shapes are encoded into a two-state system  $A_2$ : square  $\mapsto |0\rangle$ , triangle  $\mapsto |1\rangle$ . Secondly, the two colours into another two-state system  $B_2$ : green  $\mapsto |0\rangle$ , red  $\mapsto |1\rangle$ . Thirdly, the combined objects are described as a four-state system  $C_4$ : green square  $\mapsto |0\rangle$ , red square  $\mapsto |1\rangle$ , green triangle  $\mapsto |2\rangle$ , red triangle  $\mapsto |3\rangle$ . Then the binding mechanism is realised by the following linear map:

$L: A_2 \otimes B_2$	$\longrightarrow$	$C_4$
00 angle	$\mapsto$	0 angle
01 angle	$\mapsto$	$ 1\rangle$
$ 10\rangle$	$\mapsto$	$ 2\rangle$
11 angle	$\mapsto$	$ 3\rangle$

Here two combined objects presented at the same time are modelled by the superposition of the two states representing the two objects. For example, a green square and red triangle shown simultaneously are represented as  $|00\rangle + |11\rangle$ . Then one can check that the linear map *L* is the mechanism that realises the binding: given green square and red triangle simultaneously, a green square and a red triangle is obtained simultaneously via *L*; the other cases are similar. As one can see clearly from section 3.2.3, the linear map *L* is just the standard interpretation of the following generator in the  $ZX_{\Delta}$ -calculus:

$$2 \downarrow 2 \downarrow 2 \downarrow 4$$

This toy model is generalised to a generic situation:

$$\begin{array}{cccc} L: A_s \otimes B_t & \longrightarrow & C_{st} \\ |ij\rangle & \mapsto & |it+j\rangle \end{array}$$

diagrammatically represented by the generator:

where  $0 \le i \le s - 1, 0 \le j \le t - 1$ .

#### <sup>290</sup> 5. Conclusions

Across these pages, the framework of qufinite  $ZX_{\Delta}$ -calculus was introduced and a preliminary 201 application is presented by providing a solution to a toy model of the feature biding problem. The 292 framework is based on arbitrary commutative semirings as a compositional model of consciousness, 293 making the emphasis on its potential use for mathematical and structural studies of consciousness. 294 The philosophy behind our framework is taken from the Yogacara school of Buddhism, assuming 29! consciousness as fundamental and characterizing the main feature of consciousness as other-dependent. 296 Therefore, generators and processes become abstract mathematical structures, independent of their 297 realizations. Moreover, our approach is related, almost tautologically, to quantum theory, since 298 the qufinite  $ZX_{\Lambda}$ -calculus is a unification of all dimensional qudit ZX-calculus, which are graphical 299 languages for quantum theory when interpreted in Hilbert spaces. Thus, part of the reconstruction goal 300 pursued by conscious agent model is reached here for free, only invoking phenomenal aspects. In other 301 words, our approach to consciousness processes and quantum theory share a similar mathematical 302 structure. Because of its other-dependent feature and sufficient generality, our framework may pave a 303 good way for further research on scientific study of consciousness. One obvious further step would be 304 to tackle the phenomenal binding problem, as well as developing a comparison with the conscious 305 agent model [3,27]. Furthermore, it is worth trying to generalise the qufinite  $ZX_{\Lambda}$ -calculus to infinite dimensional case, from which standard quantum mechanics might be recovered. These conclusions 307 and interpretations may also inspire great debate and we are willing to motivate that discussions. 305

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