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### Chapter X. Visual consciousness

4 There has been major progress in computer vision and machines are 5 becoming guite proficient at multiple visual tasks. Teenagers are not surprised by a phone that can recognize their face and having cameras in your house that can 6 7 look at you and detect your mood is probably not too far off. We have argued that 8 there have been major strides towards developing machines that can recognize objects using algorithms that are inspired by biological circuits. Now imagine a 9 world where we have machines that can visually interpret the world the way we 10 11 do. To be more precise, imagine a world where we have machines that can 12 flexibly answer a seemingly infinite number of questions on a given image and 13 that you cannot distinguish the answers from those a human would give. Would 14 we claim that such a machine can see? Would such a machine have visual 15 consciousness? Most people would still answer no to this question. They would 16 probably argue that such a machine is nothing more, and nothing less, than a 17 very sophisticated algorithm capable of extracting a relevant answer from a 18 collection of pixels. They would point out that humans are different, that humans 19 can have *feelings* about the image, that humans can laugh at the image, or be 20 scared by its contents, that humans have a sense of *qualia*. Qualia is an 21 intriguing term introduced by philosophers; the dictionary defines it as "... the 22 internal and subjective component of sense perceptions, arising from stimulation 23 of the senses by phenomena". The definition does not seem to be particularly 24 helpful to help us discern whether our extraordinary visual machine has 25 consciousness or not.

26

27 Maybe it is time to go back into the brain. We have accompanied and 28 witnessed the adventures of information processing along the ventral visual 29 stream, starting with photons impinging on the retina all the way to the 30 remarkable responses of neurons in inferior temporal cortex. Throughout this 31 cascade of processes, we found neurons with increasing degree of similarity to 32 our recognition capabilities. Along the way, we have perhaps forgotten about a 33 major aspect of our visual experience, namely, the subjective feeling of seeing 34 and experiencing the visual world. How does neuronal activity give rise to 35 conscious experience? What are the biological mechanisms responsible for 36 qualia?

37

The question of subjective awareness in the context of visual perception is part of the grander theme of consciousness. The age-old question of how a physical system can give rise to consciousness has been debated by philosophers, clinicians and scientists for millennia. Over the last decade, there has been increased interest in using modern Neuroscience techniques to further our understanding of the circuits and mechanisms by which neurons may represent and distinguish conscious content (Crick, 1994; Koch, 2005).

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#### 47 **10.1.** A non-exhaustive list of possible answers

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It makes sense to assume that individual atoms do not possess or give rise to qualia. Connecting Physical realism to the world of experience is perhaps one of the hardest questions of all time. Multiple answers have been proposed over the years in an attempt to explain how a physical system can give rise to consciousness. I will not have time to do justice or discuss them in detail here. Instead, I would like to group them and list some of the main answers that scholars have proposed.

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(1) "Religious" answers. These are non-scientific explanations that often invoke
the need for a soul, a homunculus, or some form of communication between
physical systems and other non-physical entities. Several variants of these
explanations abound including passages in the Bible, the writings of Plato,
Aristotle, Thomas Aquinas, Karl Popper, Sigmund Freud and even top-notch
scientists such as John Eccles.

63

(2) The "mysterian" approach. Proponents of this approach argue that science simply cannot understand consciousness. There are several variations of this idea including statements such as "a system cannot understand itself", or "the answer is just too complex for our simple brains to grasp". This defeatist approach does not seem to be particularly useful. In the absence of any compelling proof that science cannot solve the problem, it seems better to try and fail rather than not try at all.

71

72 (3) Consciousness as an illusion. Some philosophers have argued that there is 73 no real phenomenon such as consciousness. The feeling of consciousness is 74 just an illusion (Dennett, 1991). But what an extraordinary illusion it is! We have 75 made extraordinary progress understanding the neural basis for multiple illusions. 76 For example, when we perceive illusory contours, we know that there is no magic, 77 there are actual neurons that respond vigorously to those contours and explicitly 78 represent the lines that we see (von der Heydt et al., 1984). It would be 79 particularly exciting to be able to provide a similar mechanistic explanation for the 80 neural basis of conscious sensations.

81

(4) Consciousness as an epiphenomenon. A related version of consciousness as
an illusion is the notion that consciousness is an epiphenomenon. As soon as
multiple neurons and complex networks are connected, the feeling of
consciousness arises but it does not serve any purpose (in the same way that a
computer may heat up but this heat does not really serve any computational
purpose).

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(5) Consciousness and new laws of Physics. Others (e.g. Roger Penrose) argue
that we need new (as yet undiscovered) laws of Physics to explain
consciousness.

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93 In stark contrast with the above approaches, several neuroscientists have 94 become interested in the arguably simpler notion that consciousness arises from 95 the specific function of neuronal circuits. Which circuits, when and how remains 96 to be determined through scientific investigation without invoking new laws of 97 physics, and without invoking souls. We assume that consciousness can and 98 should be explained in neurobiological terms, and that there is no limit to our 99 capability towards arriving at the answer. We still do not understand many 100 aspects of brain function (e.g., we do not understand what changes in neural 101 circuits give rise to Autism), but that does not mean that we need to invoke the 102 explanations above for all the brain phenomenology that we still cannot grasp.

103

104 The neuroscientific approach to studying consciousness involves several 105 working assumptions:

106 (1) We are conscious. Consciousness is not an epiphenomenon. Therefore, 107 consciousness deserves an explanation like any other aspect of brain function.

- 108 (2) Other animals are also conscious. This assumption enables us to probe for 109 consciousness in animal models. It seems too early to draw the line and 110 unequivocally dictate which animals do show consciousness and which ones do 111 not.
- (3) We start with simple questions that we can try to study rigorously. We start
  with vision. Hopefully, we will be able to extrapolate some of what we learn from
  vision to other sensations (e.g. pain, smell, self-awareness)
- 115 (4) We need an explicit representation. Only parts of the brain will correlate with 116 the contents of consciousness. We search the *neuronal correlates* of 117 *consciousness* (NCC).
- 118

119 The strategic decision to start by investigating a rather reduced domain, 120 the neuronal correlates underlying visual awareness, clearly leaves many 121 fascinating topics out. Some of these topics include dreams, lucid dreaming, out 122 of body experiences, hallucinations, meditation, sleep walking, hypnosis, self 123 awareness, the so-called notion of qualia and feelings. This does not imply that 124 these are not interesting and relevant topics; it merely reflects a strategic 125 decision of how to approach a difficult scientific question.

126

### $127\$ 10.2. The search for the NCC, the neuronal correlates of consciousness

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129 The NCC (neuronal correlates of consciousness) is defined as a *minimal* 130 set of neuronal events and mechanisms that are jointly *sufficient* for a *specific* 131 *conscious percept* (Crick and Koch, 1990, 2003).

132

133 It is critical to define some of these terms. The NCC is defined as a 134 *minimal* set. A solution such as "the whole healthy human brain can experience 135 consciousness" is not very informative. The neural mechanism should be 136 "sufficient" (not just necessary) to represent a conscious percept. This clause 137 leaves out so-called "enabling" factors such as the heart or the cholinergic 138 systems arising in the brainstem. We are seeking for the correlates for "specific 139 conscious percepts" such as seeing a face (as opposed to generic aspects such 140 as being conscious/unconscious).

141

142 It is guite clear that not all brain activity is directly linked to conscious 143 perception at any given point. To clarify, this does not mean that those brain processes are not important or interesting. For example, significant resources 144 145 and neurons are devoted to controlling breathing, posture, walking, etc. With 146 some exceptions, most of the time we are not aware of such processes.

147

148 A particularly striking documentation of relatively sophisticated brain 149 processing that does not reach awareness is given by a patient studied by 150 Goodale and Miller (Goodale and Milner, 1992). This patient had severe damage 151 along the ventral visual stream and the dorsal stream was relatively unimpaired. 152 The patient could not recognize shapes but could still act on those shapes with 153 relatively sophisticated precision. For example, the patient could not report the 154 orientation of a slit but could place an envelope in the slit rather accurately. The 155 search for the NCC concerns investigating which neuronal processes and 156 mechanisms correlate with conscious content and which ones do not. 157

#### 158 10.3. In search of an explicit representation

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160 Upon seeing an object, neurons in the retinae are activated. In fact, 161 stimulating each of the photoreceptors in the same pattern and magnitude 162 evoked by a given object should elicit the object's percept. Does this imply that 163 the retinal photoreceptors constitute the desired NCC? Not guite. Those neurons 164 in the retina activate neurons in the LGN, which in turn activate primary visual 165 cortex, which in turn transmit the information to higher areas within ventral visual 166 cortex. Several lines of evidence suggest that the activity in early visual areas 167 from the retina to primary visual cortex cannot be the locus of the NCC (Crick 168 and Koch, 1995). One striking example is what happens when you are watching 169 TV. The TV has a certain refresh rate, that is, it shows a number of frames per 170 second, say 60 frames per second. Retinal ganglion cells and neurons in primary 171 visual cortex fire vigorously following those rapid changes in the visual input. Yet, 172 our perception is essentially oblivious to what is happening there. A critical 173 aspect of the NCC is that the representation of visual information must be 174 "explicit". If neurons are representing information that we are not aware of, then 175 those neurons cannot be quite part of the NCC, in the same way that there are 176 neurons that control how you walk, yet you are typically not aware of their activity.

177

178 But what exactly is an *explicit representation* and how would we ever 179 know if we have one? After all, information from the retinal ganglion cells is 180 obviously required for vision. What makes their representation implicit and not 181 explicit? One way to define an explicit representation is that it should be possible 182 to decode the information via a simple linear classifier. If our perception indicates 183 that we are seeing a chair, the chair is represented by the activity of retinal 184 ganglion cells, but we cannot linearly read out the presence or absence of a chair Biological and Computer Vision *Chapter 10* 

from the retina. Similarly, a computer may hold a representation of the information for the chair in a digital photograph. However, as we have discussed in the previous chapters, decoding such information requires a cascade of multiple computations. Information about objects is not explicitly represented in a digital photograph. Similarly, the retina does not hold an explicit representation of objects.

191

192 Several visual illusions acutely point out the need for explicit 193 representations. Consider the Kanizsa triangle illustrated in Chapter 1. We 194 perceive strong edges defining the triangle even in parts of the image where 195 there is no visual information (i.e. there is no real edge). Such a perception of an 196 edge implies that there should be neurons that represent that subjective edge. 197 Neurons in the retina do not respond to such illusory contours.

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#### 199 10.4. An experimental approach to study visual consciousness

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201 The discussion of visual illusions suggests a promising path to investigate the 202 neuronal correlates of visual consciousness by investigating which neuronal 203 processes coincide with subjective perception. A particular type of visual illusion 204 that has been quite fruitful in this regard involves the use of bistable percepts. A 205 famous example of a bistable percept is the Necker cube. The same visual input 206 can be seen in two different configurations. In the case of the Necker cube, it is 207 possible to voluntarily switch between the two possible interpretations of the 208 same input.

209

210 Such volitional control is not possible in the case of binocular rivalry. Under 211 normal circumstances, the information that the right and left eyes convey is highly correlated<sup>1</sup>. What would happen if you show two completely different 212 213 stimuli to the right and left eyes? Under these conditions, we perceive either one 214 or the other stimulus in a seemingly random fashion, a phenomenon called 215 binocular rivalry (Blake and Logothetis, 2002). Extensive psychophysical 216 investigation has provided a wealth of information about the conditions that lead 217 to perceptual dominance of visual stimuli, what can or cannot be done with the 218 information that is being suppressed and the dynamics underlying perceptual 219 alterations (Blake, 1989; Blake and Logothetis, 2002). What is particularly 220 interesting about this phenomenon is that, to a reasonably good first 221 approximation, the visual input is constant and yet subjective perception 222 alternates between two possible interpretations of the visual world. Investigators 223 then ask: what are the neuronal changes that correlate with these subjective 224 transitions? Several studies have shown that only a small fraction of neurons in 225 early visual areas follow the subjective changes whereas most neurons in higher 226 visual areas are strongly modulated by the immediate contents of visual 227 awareness (Leopold and Logothetis, 1999).

<sup>&</sup>lt;sup>1</sup> It is not identical, though. The small differences between the input from the right eye and left eye provide strong cues to obtain 3D information. 3D movies specifically

# Biological and Computer Vision *Chapter 10*

228 This type of experiments may pave the road to an initial understanding of 229 certain circuits and neuronal activity changes that correlate with subjective 230 perception. What would constitute evidence of understanding the NCC? We 231 argue that four conditions should be met. (1) We should be able to model and 232 predict neuronal responses given a perceptual state. (2) Conversely, we should 233 be able to predict perceptual states from neuronal responses. (3) We should be 234 able to elicit a percept by activating the corresponding neuronal patterns (e.g. via 235 electrical stimulation). (4) We should be able to inactivate or repress a perceptual 236 state by modifying the neuronal activity patterns. There still seems to be a long 237 way to understand the neuronal correlates of visual consciousness by meeting 238 these four conditions. Yet, nowadays, these questions and themes have become 239 a major area of research and we may be surprised to observe major progress in 240 the field in the years to come.

241

### 242 10.5. Integrated information theory

243

244 The last decade has seen the development of an elegant theoretical 245 framework that deserves discussion, the integrated information theory (IIT), by 246 Giulio Tononi. In an oversimplified form, the basic intuition behind IIT is that 247 conscious experience represents information and that this representation is 248 unique. According to IIT, a dynamical system of interconnected parts is characterized by a metric, connoted by  $\Phi$ , which has a lower value when the 249 250 system can be described by smaller relatively independent subsystems. The 251 larger  $\Phi$ , the more integrated information the system has. The theory postulates 252 that conscious experience is proportional to  $\Phi$  (Tononi, 2005; Seth et al., 2011; 253 Tegmark, 2014; Tononi and Koch, 2015; Tononi et al., 2016). The definition of  $\Phi$ 254 comprises two steps: (i) perform an imaginary partition of the system and 255 compute  $\phi$ , a measure of how much the two parts affect each other (i.e., how well 256 we can predict the evolution of the system based on the conditional transition 257 probabilities); and (ii) define  $\Phi$  as the "cruelest" such partition that minimizes  $\phi$ . 258 Elegantly, the theory provides specific mathematical definitions to calculate these 259 quantities (Tegmark, 2015; Tegmark, 2016; Tononi et al., 2016). The definitions of  $\Phi$  by Tononi's group (Tononi et al., 2016) and variations by others such as 260 261 Barrett and Seth (Seth et al., 2011) can all be incorporated in this general 262 formalism.

263

A major challenge in testing the IIT framework has been that, for real systems, the above equations are prohibitively challenging to compute. For a given partition, the computational time grows exponentially with the size of the system. However, Tegmark recently developed an approximation to calculate  $\Phi$  using graph theory (Tegmark, 2016), bringing the calculations to a polynomial dependency on the system size, and making this algorithm readily applicable to the large scale of physiological recordings in this proposal.

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The theory is notably elegant, starting from axioms and proposing concrete quantitative definitions, which sets it apart from other discussions about

## Biological and Computer Vision *Chapter 10*

consciousness, which are merely qualitative. At the same time, the theory suggests many counterintuitive predictions. Any object, even your cellular phone, has a certain  $\Phi$  value. One may expect that inanimate objects or plants should have  $\Phi$ =0, but this is not what the theory states. Those objects may have low values of  $\Phi$ , but not zero. Additionally, it is in principle possible to create artificial systems with high  $\Phi$  values, yet it seems unlikely that such systems would show consciousness. Ultimately, it will be quite interesting to test the theory empirically.

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