

1
3 THE POTENTIAL ROLE OF REGRET
5 IN THE PHYSICIAN–PATIENT
7 RELATIONSHIP: INSIGHTS FROM
9 NEUROECONOMICS
11

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15

17 **ABSTRACT**

19 Purpose – *The aim of the chapter is to show how two important facts of*
21 *physicians’ behavior, (i) their tendency to “create” the demand for medical*
23 *practices, and (ii) their delay and reluctance in using new treatments and*
therapies, can be explained with the lens of the neuroeconomics research on
the neural and behavioral basis of regret.

25 Methodology – *This chapter adopts a neuroeconomics perspective on*
27 *decision-making, asking how the brain represents values and generates*
29 *emotional states, which consequently influence choices. In the line of recent*
31 *work on emotion-based decision-making, we expect to be able to*
characterize the brain areas underlying the studied processes and to
specify the functional relationship between rational decision-making and
the emotional influences that modulate these decisional processes.

33 Originality – *Neurobiological approaches can contribute significantly to a*
better understanding of the cognitive and emotional underpinnings of

35

Neuroeconomics

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1 *medical decision-making, from how physicians might evaluate and*
2 *anticipate the effect of alternative therapies, to how patients might*
3 *anticipate future consequences of their health choice. This can explain*
4 *some features of the doctor–patient relationship which are not consistent*
5 *with simple maximization models.*

7 *Findings – Our findings suggest that physicians’ behavior can be often*
8 *explained by regret avoidance. Likewise, they suggest that physicians play*
9 *as actual agents when they make medical decisions that will affect the*
10 *future well-being of their patients.*

11 *Research limitations – We limited our analysis to the potential role of*
12 *anticipated regret; therefore, this chapter neglects many important*
13 *factors of the health sector.*

15

1. INTRODUCTION

17

18 The introduction of neuroscience tools, coupled with increasing evidence on
19 the importance of emotional and social states in economic decision-making,
20 is opening new perspectives in the field of neuroeconomics (Camerer, 2003;
21 McCabe, 2003; Glimcher & Rustichini, 2004; Rustichini, 2005). In this
22 chapter we adopt a neuroeconomics approach on decision-making in the
23 health sector. We propose new hypotheses based on the relationship between
24 cognitive and emotional component during medical decision-making.

25 Our analysis relies on the study of the behavioral and the neural basis of
26 the emotion of regret and its role in complex decision-making processes,
27 such as those involved in health care decisions.

28 Two important questions regarding physician–patient interaction can be
29 better understood using the lens of neuroeconomics. Specifically, why do
30 physicians tend to induce the demand for medical practices, and why are they
31 reluctant to introduce new treatments and new therapies? We propose that a
32 possible explanation of these contradictory facts can be found in the role of
33 anticipated regret in the decisions made by the patients and the physicians.
34 We present here a formal model of regret-averse physician behavior and
35 (analogical) evidence from recent neuroeconomics studies that support this
36 possible explanation.

37 The chapter is organized as follows: the second and third sections briefly
38 describe the psychological and economic theories of regret. The final sections
39 present the theoretical model and the neuroeconomics evidence related to the
40 doctor–patient interaction.

1

2. THE PSYCHOLOGY OF PERSONAL RESPONSIBILITY

3

The feeling of responsibility for the consequence of our choices has an important role in decision-making (Zeelenberg et al., 1997). This is particularly true when our choice might affect the well-being of others. On one hand, we tend to compare factual or imaginative alternatives, engaging in a mental process called counterfactual (Lewis, 1973; Roese & Olson, 1995; Byrne, 2002). On the other hand, we often “prefer not to know” the outcome of the option that we have rejected, if only for the fact that it might be better than the outcome of our choice (Kahneman & Tversky, 1982). Counterfactuals amplify (Kahneman & Miller, 1986) and in some cases even generate emotional responses (Mellers, Ritov, & Schwartz, 1999; Zeelenberg & van Dijk, 2004).

Humans use strategies to avoid intense negative emotions, and can anticipate the effects of future thinking about “how I would have been better if I had chosen differently.” This thinking determines the feeling of regret. Regret is a cognitive-based emotion characterized by the feeling of responsibility for the negative outcome of our choice (Gilovich & Melvec, 1994). Disappointment is the emotion related to an unexpected negative outcome independent of the responsibility component (Bell, 1985; Loomes & Sugden, 1986). Anticipation of regret induces changes in behavioral strategies (Ritov, 1996) and characterizes the learning process in decision-making (Zeelenberg, Beattie, van der Pligt, & de Vries, 1996). Regret results from a decision made and the possibility to compare the obtained outcome with better outcomes of rejected alternatives.

Norm theory by Kahneman and Miller (1986) suggests that the norms used in outcome evaluation are evaluated after the outcome occurs. Kahneman and Miller suggest that the norm is an appropriate context point of reference, used in the evaluation processes. This theoretical concept postulates that an outcome automatically evokes alternatives for comparison, in terms of what could/might have been. The recruited alternative plays as a point of reference for the comparison. The norms of “what might have happened if I had chosen differently” evoke a strong affective reaction, namely regret.

35

37

3. ECONOMIC MODELS OF REGRET

39

Classical economic models of regret suggest (Bell, 1982; Loomes & Sugden, 1982) that incorporating regret into the utility function might reconcile the

1 utility theory with observed behavior (Allais paradox types of behavior) in
 3 decision-making under uncertainty. The main point is that many violations
 5 of the axioms of Von Neumann and Morgenstern (1944) expected utility theory might be explained by the anticipated regret; thus, a decision-maker
 7 might incur in a suboptimal choice in order to avoid future regrettable
 9 situations. Monetary assets and a measure of regret are incorporated in a
 11 multiattribute utility function. Bell emphasizes the decision aspect of regret.
 Thus, regret arises from a decision and “is measured as the difference in
 value between the received assets and the highest level of assets produced by
 other alternatives (cf. Bell, 1982).” Bell gives this formal definition of the
 multiattribute utility function:

$$13 \quad U(x, y) = v(x) + f(v(x) - v(y))$$

15 where x indicates the final asset x and y is the foregone asset. The utility is a
 17 function of the asset value ($v(x)$) and of the regret ($v(x) - v(y)$). These two
 terms are additive. f is decreasingly concave in the case of regret aversion.

19 Loomes and Sugden (1982) considered anticipated regret as rational, and
 21 regret theory as an “alternative theory of rational choice under uncer-
 23 tainty.” They introduced the concept of choiceless utility. Choiceless utility
 25 is the utility derived from a certain consequence (outcome) without having
 27 chosen. Loomes and Sugden focused on two main points of regret theory:
 29 first, the fact that regret is commonly experienced; and, second, that people
 try to anticipate and avoid the experience of future regret.

31 Anticipated regret is based on considering choosing an alternative and
 33 simultaneously rejecting other alternatives. The type of feedback information
 is indeed crucial to determining the emotional response, and the decisional
 process is influenced by the knowledge about the future feedback available.

31 **4. THE ROLE OF REGRET IN THE** 33 **PHYSICIAN–PATIENT INTERACTION**

35 Feedback information about the success or the failure of different therapies
 37 and medical practices is increasingly accessible (there are thousands of web
 39 pages dedicated to medical information,¹ informative brochures offered by
 national and international health care organizations, medical information
 offered by the media in terms of news, health product updates, and chat
 forums) to both physicians and patients. Thus, the choice of a therapy and

1 the simultaneous rejection of other practices represent a scenario where the
likelihood of future regret might arise.

3 Here, we show how two important facts of physicians' behavior can be
explained with the lens of the neuroeconomics research on the neural and
5 behavioral basis of regret. First (Fact 1), physicians tend to "create" the
demand for medical practices; and, second (Fact 2), they are often slow and
7 sometimes reluctant in using new treatments and therapies.

There are several possible explanations for the first fact (Newhouse, 1970;
9 Feldstein, 1970; Evans, 1974). For instance, Evans (1974) modeled the
physician–patient interaction as a game of asymmetric information, in which
11 physicians would prescribe excessive (over the optimal level from the
patients' perspective) medical treatments with the only purpose of maximiz-
13 ing their own income. Models of this type underestimate the uncertainty
effect and the moral (Arrow, 1963) and reputational considerations that
15 characterize physicians' choice behavior.

We can reasonably assume that even fully opportunistic physicians
17 would not profit from the negative consequences of their choice in terms of
reduction of well-being of their patients (which would negatively affect
19 physicians' reputations, careers, and self esteem). We suggest that they
might offer more than the optimal level of medical practices in order to
21 avoid possible regret for "not having done enough." The action–inaction
effect is an important factor related to the psychology of regret. As shown
23 in Gilovich and Medvec (1994–1995), inaction generates more long-term
regret than action. In this specific case, the physician would prescribe more
25 practices than the ones presumably needed in order to avoid the regret of
not having done enough for the patient's health. Another important
27 consideration in this context is the fact that patients tend to negatively
evaluate (wrongly assuming that the quantity of the offered practices is
29 perfectly correlated with the effort and the skills of their physicians; see
Tversky & Kahneman, 1973) physicians that do not prescribe enough
31 medical products according to the patient's perspective. This is often more
than what patients really need. In this sense, over-offering is a strategy that
33 matches both the physician and the patient's regret avoidance behavior.

The second fact, the reluctance of physicians to prescribe innovative and
35 more risky medical practices, is highly related to the uncertainty on the
efficacy of novel products. Uncertainty on the efficacy of different treatments
37 is a main component of medical choices. Models that consider the uncertainty
in the productivity of medical practices better explain physicians' behavior
39 than models based merely on the asymmetric information between physicians
and patients and the resulting moral hazard from the physicians' side.

1 From a different perspective, we can actually consider the asymmetric
information, in terms of physicians' (compared to patients) better knowledge
3 of possible consequences of different medical products, as more important
for explaining the reluctance of offering new products (Fact 2) than the
5 tendency to create their own demand (Fact 1). In this sense, "knowing that
you know more" might induce a higher sense of responsibility. In this
7 chapter we argue that the uncertainty in the efficacy of novel medical
products and therapies affects the physician's behavior, inducing regret
9 avoidance choices, such as avoiding practices that might be extremely risky
for the patients' health.

11 Put in these terms, there is an analogy between the physicians' behavior
described by Facts 1 and 2, and the behavior of investors during the choice of
13 their pension plan. Both agents, the physicians and the investors, "hedge
away from the extremes" in order to minimize their future regret. The
15 "extremes" for the investors are to invest all in the risk-free assets (bonds) or
all in the risky assets (stocks). The investors that try to avoid regret would
17 choose a riskier portfolio if the equity premium is low, and a more moderate
portfolio if the equity premium is high, compared to the behavior of a risk-
19 averse investor. In other words, the regret-averse investor will hold a positive
amount of stocks even if the equity premium is close to zero, and will always
21 hold a positive amount of bonds even though the equity premium is quite
large. Similarly, following our interpretation, regret-averse physicians will
23 offer more than optimal levels of standard practices (Fact 1) and at the same
time they will be reluctant to offer innovative practices (Fact 2). However, a
25 purely risk-averse physician will offer less-standard practices to avoid the risk
of prescribing products that might be dangerous for the patients (e.g., allergy
27 reactions), and he/she will offer a higher level of innovative (low risk)
practices compared to a regret-averse physician.

29

31 *4.1. Formal Model of Regret-Averse Physician Behavior*

33 Formally, we can describe a physician's choice between combinations of
levels of standard and innovative therapies, following the model of
35 Muermann, Mitchell, and Volkman (2005) on portfolio selection. We call
 γ the proportion of standard therapies chosen by the physician. The objective
37 of the physician is to maximize the patient's health level h . The standard
therapies give a deterministic return (in terms of health level), while the
39 innovative therapies give a stochastic return. Ex ante, a regret-averse
physician would choose the level of γ that maximizes the following equation

1 (adapted from Maccheroni, Marinacci, & Rustichini, 2006):

$$3 \quad E[u(h_\gamma) - k\rho(u(\max H) - u(h_\gamma))]$$

5 where, $\rho(u(\max H) - u(h_\gamma))$ is the regret term, measured as the difference
 7 between the ex-post optimal level of health ($\max H$) and the final level given
 9 the choice of $\gamma(h_\gamma)$, with $\rho' > 0$ and $\rho'' > 0$ for regret aversion; k indicates the
 relative importance of anticipating regret with respect to the mere risk
 avoidance behavior (described by a $u' > 0$ and $u'' < 0$). Thus, if the physician
 does not anticipate regret, $k = 0$, he/she will behave as a risk-averse expected
 utility maximizer.

11 This model predicts different patterns of behavior according to the level
 13 of k . If $k > 0$, thus the physician tries to avoid future regret, he/she will
 choose to prescribe respectively a larger level of standard practices and less
 innovative therapies, compared with a risk-averse physician (see Proposition
 15 2 in Muermann et al., 2005).

17 Behavioral data from Mellers et al. (1999), Camille et al. (2004), and
 Coricelli et al. (2005) show that anticipated regret is the main determinant of
 19 subjects' choice behavior in situations where the subjects know, prior to
 making a decision, that they will get information about the outcomes of the
 rejected alternatives (complete feedback). Risk aversion prevails, however, in
 21 situations where the feedback on the foregone alternative is not provided
 (partial feedback). These findings suggest the empirical plausibility of a $k >$
 23 0, and of its theoretical predictions (i.e., excessive standard practices and
 reduced level of innovative therapies).

25

27 *4.2. What Might Happen in the Brain of a Regret-Averse Physician?*

29 As we mentioned above, the explanation of the Facts 1 and 2 in terms of
 physicians' regret avoidance behavior is analogous to the interpretation of
 31 the investors' behavior of "hedging away from the extremes" in a pension
 plan. Given this interpretation, we can conclude that the physicians play as
 33 actual agents when they take a medical decision that will affect the future
 well-being of their patients. The results from a brain imaging study (Coricelli
 35 et al., 2005²) showed that physiological responses (heart rate) and brain
 activity are modulated as a function of whether the subject is involved in an
 37 actual choice (that is, whether the subject is agent) or is following a computer
 program choice (where choice is computer-selected, meaning the subject had
 39 no agency). Brain structures (many portions of the prefrontal cortex) usually
 involved in decision-making, and specifically involved in regret processing

1 (orbitofrontal cortex,³ anterior cingulate cortex and hippocampus)
activated only when the subjects were agents. The influence of personal
3 responsibility on the processing of the outcomes was evident in contrasting
outcome-related activity for choose trials (where the subject selected which
5 gamble to “play”) with follow trials (where “choice,” i.e., follow, was
computer-selected) (Fig. 1 The effect of agency). Thus, outcome evaluation is
7 influenced by the level of responsibility in the process of choice (agency) and
by the available information regarding alternative outcomes (complete or
9 partial feedback).

The explanation of Facts 1 and 2 in terms of anticipated regret supports
11 the hypothesis that physicians might play as “perfect agents” during choices
that might affect the future health of the patients. Thus, we could expect the
13 physicians’ brain activity during medical decision-making to look like the
neuronal activity related to agency (i.e., when a subject is taking a decision
15 that will affect his future well-being). We expect a “transfer” between patient
and physician in terms of actual emotional and cognitive processes. Indeed,
17 just “following” patients’ directions would not induce the feeling and the
anticipation of regret (see Fig. 1), and therefore would not explain the
19 coexistence of Facts 1 and 2.

21

5. SUMMARY AND CONCLUSIONS

23

This chapter uses recent findings from neuroeconomics on the neural and
25 theoretical basis of the emotion of regret to explain behavioral facts
observed in physician–patients interactions. Regret is an emotion associated
27 with a decision that turns out badly. It is usually elicited by a comparison
(counterfactual) between the outcome of choice and the better outcome of
29 rejected alternatives. In the context of medical decision-making, the
feedback on the efficacy of different medical practices is almost unavoi-
31 dable; thus, the prospect of future regret is always present. The behavioral
impact of regret is expressed by the fact that people often try to avoid the
33 likelihood of future regret even when this conflicts with the prescription of
decision based upon rational choice.

35 Here we suggest, with the support of neuroeconomics findings, that regret
aversion is a good predictor of physicians’ behavior. The studies on the
37 neural basis of regret show the involvement of a brain circuitry (orbitofrontal
cortex, anterior cingulate, and temporal areas) in the experience and in the
39 anticipation of this cognitive-based emotion. The orbitofrontal cortex is
found to play an important role during the entire process of decision-making

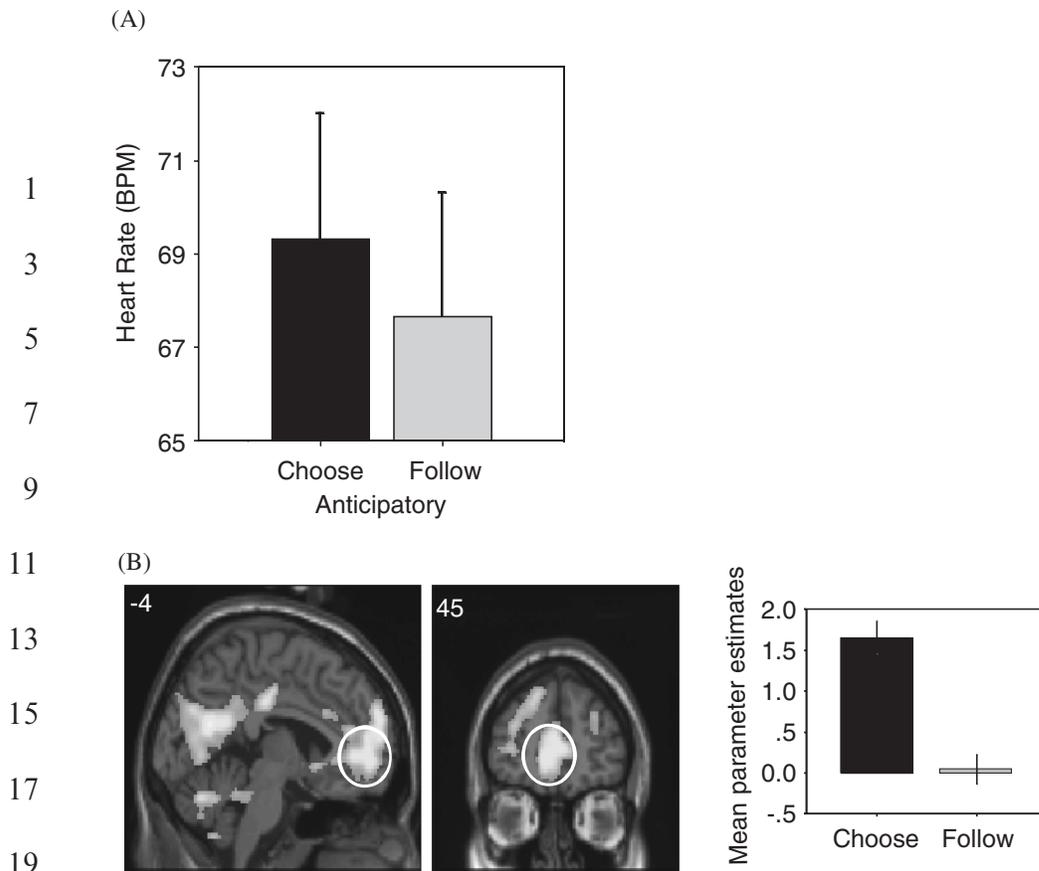


Fig. 1. The Responsibility (Agency) Effect. In Coricelli et al. (2005) Subjects Participated in the Regret Gambling Task. Regret Was Induced by Providing Information Regarding the Outcome of the Unchosen Gamble (Complete Feedback Condition). Half of the Trials Were “Choose” Trials, Where the Subject Had a Choice; the Other Half Were “Follow” Trials, Where the Subjects Were Informed That the Computer Would Randomly Choose One of the Two Gambles. The Follow Trials Were Introduced in Order to Remove Any Feeling of Responsibility. (A) During Task Performance, Subjects’ Physiological Responses (Heart Rate) Were Significantly Higher in “Choose” Trials Than in “Follow” Trials ($P = .001$). (B) Irrespective of Whether the Subject Experienced Financial Gain or Loss on a Particular Trial, Responsibility for Selecting the Initial Gamble Influenced the Pattern of Outcome-Related Brain Activity. Notably, Initial Selection between the Gambles (in Contrast to “Following” the Computer-Selected Gamble) Was Associated with Enhancement of Activity in Themedial Prefrontal Cortex (Including Genual Cingulate, Paracingulate, and Mediodorsal Prefrontal Cortices) and the Primary Visual and Anterior Superior Temporal (STG) Cortices. In Contrast, Following Computer-Selected Choices Was Associated with Relative Enhancement of Activity in Thalamus, Supplementary Motor (SMA) and Bilateral Superior Parietal Cortices. This Pattern is Similar to That Observed During Passive Anticipation (Nagai, Critchley, Featherstone, Trimble, & Dolan, 2004). The Agency Effect Was Significant Only for Choose Trials Where the Subject Was Responsible for the Choice, i.e., When the Subject (Rather Than the Computer) Selected between Two Gambles. Group Data (Thresholded at $P < 0.001$, Uncorrected) Is Plotted on Sagittal and Coronal Sections of a Normalized Canonical Template Brain. In the Right Panel We Plot the Average Parameter Estimates (\pm s.e.m.) for Relative Difference in BOLD Activity at Outcome in Choose and Follow Trials.

1 in contexts where regret might arise. This particular portion of the prefrontal
 2 cortex integrates cognitive and emotional components of decision-making.
 3 Results from a recent neuroimaging study (Coricelli et al., 2005) demonstrate
 4 how the activity of the regret circuitry is found only when the experimental
 5 subject is actually an agent, meaning that he/she is actually taking a decision.
 6 It is not activated when the subject is merely following the choice of another
 7 agent (the patient). We use this result to suggest that physicians actually play
 8 as agent when they are taking decisions that might primarily have
 9 consequences for the future of their patients. With this interpretation, we
 10 can reconcile apparently contradictory facts of the physicians' behavior, such
 11 as their tendency to offer more than the optimal level of standard practices
 12 and less than the optimal level of innovative therapies. Thus, we suggest that
 13 these less-than-rational medical choices are made in order to avoid the
 14 prospect of future regret.

15 Many important factors of the health sector, such as the effect of different
 16 institutions and the health insurance system (Arrow, 1963; Cutler et al.,
 17 1998), have been neglected in this chapter. We limited our analysis to a single
 18 and specific factor (anticipated regret) that we suggest (see also Thaler, 1980)
 19 might explain some features of the doctor–patient relationship which are not
 20 consistent with simple maximization models.

21

23

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 26 (2006); Elliott, Friston, & Raymond (2000); Zeelenberg & Beattie (1997).

27

29

NOTES

31 1. For instance, these are the top ten most useful websites listed (in alphabetical
 32 order) by the Medical Library Association: Cancer.gov, Centers for Disease Control
 33 and Prevention (CDC), familydoctor.org, healthfinder, HIV InSite, Kidshealth,
 34 Mayo Clinic, MEDEM: an information partnership of medical societies, MEDLI-
 35 NEplus, and NOAH: New York Online Access to Health.

36 2. Coricelli et al. (2005) measured brain activity using functional magnetic
 37 resonance imaging (fMRI) while subjects selected between two gambles wherein
 38 regret was induced by providing information about the outcome of the unchosen
 39 gamble. Increasing regret enhanced activity in the medial orbitofrontal region, the
 dorsal anterior cingulate cortex, and hippocampus. Both, the dorsal portion of the
 cingulate cortex and the hippocampal activities reveal an underlying cognitive-based
 declarative process of regret. The portion of the anterior cingulate which was

1 activated in our task during regret has been identified (meta-analysis) to be a purely
2 cognitive area. And the observed hippocampus activity suggests the presence of a
3 declarative memory activity (the lesson to remember is: “in the future pay more
attention at the consequences of your choice”).

4 3. The orbitofrontal cortex represents the relative values of different rewards (Rolls,
5 1999; Rolls, 2000; Breiter, Ahron, Kahneman, Dale, & Shizgal, 2001; O’Doherty,
6 Krigelbach, Rolls, Hornak, & Andrews, 2001; Dreher et al., 2005), and the subjective
7 pleasantness of reinforcers (primary reinforcers, such as food, sex; and secondary,
8 abstract reinforcers, such as money). Neurons in this region of the brain encode the
9 relative values of different choice alternatives (Padoa-Schioppa & Assad, 2006).
10 Tremblay and Schultz (1999) demonstrated how OFC neurons fire when the relatively
11 preferred available reward, between pairs of rewards, is delivered, thus “revealing” the
12 monkey preferences. Corroborating results come from a more recent study (Padoa-
13 Schioppa & Assad, 2006), where monkey is asked to choose between combinations of
14 amounts of different rewards. Also in this case, the OFC neurons fire according to the
15 monkey’s preference structure and actual choices. This activity of the OFC
corresponds to a high-level representational function of the values of external stimuli.

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