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Kuhnian theory-choice and virtue convergence: facing the base rate fallacy

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Abstract

Perhaps the strongest argument for scientific realism, the no-miracles-argument, has been said to commit the so-called base rate fallacy. The apparent elusiveness of the base rate of true theories has even been said to undermine the rationality of the entire realism debate. In this paper, I confront this challenge by arguing, on the basis of the Kuhnian picture of theory choice, that a theory is likely to be true if it possesses multiple theoretical virtues and is embraced by numerous scientists, even when the base rate converges to zero.

Key words: scientific realism; no miracle argument; base rate fallacy; theoretical virtues; T.S. Kuhn; theory choice; convergence; witness testimony.

1 Introduction

The perhaps strongest argument for scientific realism, the No-Miracles-Argument (NMA), has it that it would be a miracle if our theories were as successful as they are, and not be true. As Howson (2000) pointed out, however, as normally stated, the NMA commits the so-called *base rate fallacy:* it ignores the base rate of true theories. Expressed in Bayesian terms, it ignores the dependence of the posterior probability of a successful theory being true on the prior probability of a theory being true. But setting the base rates seems elusive. If probabilities are construed objectively, then it looks as though we have no way of finding out about them. If, on the other hand, probabilities are construed subjectively, then both the realist and antirealist can set the priors as they please. A rational debate about realism is therefore impossible (Magnus and Callender 2004).

In spite of the fact that the severity of Magnus and Callender's challenge is widely appreciated, head-on confrontations of their claims have been few and far

between.¹ Whilst the current paper does little to undermine Magnus and Callender's fundamental point, it will nevertheless, in the face of it, try to tilt the balance to the realist's favour on the basis of the Kuhnian picture of theory-choice. In particular, it will be argued on the basis of the Kuhnian picture of theory choice that a theory is likely to be true, even when the base rate converges to zero, if it possesses multiple theoretical virtues and if it is embraced by numerous scientists on the basis of its virtues.

Although the paper will assume large parts of the Kuhnian picture of theorychoice, the purpose of this paper is not exegetical. That is, the purpose of this paper is not to reconstruct Kuhn's view of theory-choice in a way that makes best sense of his view in the context of his other works. Rather, the paper will seek to explore some interesting implications *given* (some parts of) the Kuhnian framework of theory choice.² The view defended here may thus very well be detrimental to some of the views held by Kuhn.³

The paper proceeds as follows. Section 2 specifies Magnus and Callender's challenge. Section 3 outlines how the Kuhnian picture of theory choice provides the resources for generating an argument for realism via the convergence of scientists' truth judgements about theories on the basis of those theories' virtues. I refer to this argument as NO-VIRTUE-COINCIDENCE-ARGUMENT (NVC). Section 4 develops a formal apparatus for the NVC with the help of Earman's Bayesian rendering of the convergence of witness reports. Section 5 spells out this apparatus for the NVC in detail. Section 6 proposes a way to estimate the error rates regarding scientists' truth judgements. Section 7 addresses some possible objections to my argument and provides further clarification. Section 8 concludes the paper.

2 Magnus and Callender's challenge

Magnus and Callender distinguish between 'wholesale' and 'retail' arguments for realism, i.e., arguments about "all or most of the entities posited in our best scientific theories" and arguments about "specific kinds of things, such as neutrinos",

¹ See for example (Psillos 2009) and a reply by (Howson 2013). For another recent attempt see (Menke 2013).

² In this sense, this paper is inspired by a recent paper by Okasha (2011).

³ In particular, much of Kuhn's work is hardly reconcilable with realism, which will be defended here. In Section 3 I will outline in detail which parts of Kuhn's account I intend to use in this paper. Should any reader with a stake in the scholarship on Kuhn object to my interpretation, I invite them to consider my assumptions in abstract terms and to ignore any reference to Kuhn.

respectively (321). While they think that there may be good grounds for defending retail arguments, they urge that "the wholesale realism debate should be dissolved", for wholesale arguments amount to no more than "adamant, futile table thumping" (322).⁴ Their skepticism is grounded in their claim that realists and antirealists alike commit the base rate fallacy.

The base rate fallacy can be illustrated with a simple example from the medical context. Suppose we were to test the presence of some disease T in a population of subjects with a very effective test. That test, suppose, would have a very high probability of indicating to us the presence of a disease, when the disease is really present in a subject. Let us refer to a positive test result as e. Expressed formally, then, $P(e|T) \gg 0$. Suppose further that the test has a very low false positive rate. That is, the test is unlikely to indicate the presence of the disease when it is actually absent $(P(e|\neg T) \ll 1)$. For concreteness's sake, assume that P(e|T) = 1 and $P(e|\neg T) = .05$. Contrary to many people's intuitions, it would then be fallacious to infer that the probability of some subject having the disease, when the test indicates that the subject has it (P(T|e)), is high, for example .95. In fact, it can be rather low. If the disease is very rare in the population (i.e., $P(T) \ll 1$), for example 1/1000 then, given the effectiveness of our test, we would expect 51 subjects to test positive. Because, by assumption, only one of those actually has the disease, P(T|e) would be just .02, that is, much lower than the intuitive .95.

Magnus and Callender accuse the partakers in the realism debate of having made the same mistake. That is, they accuse realists and antirealists of having neglected the base rate of true theories in the pool of all theories / the prior probability of a(ny) theory being true.⁵ Instead the debate has focused on the probability of a theory being false if successful $P(\neg T|e)$, and the likelihood of e given $\neg T$ (i.e., the false positive rate $P(e|\neg T)$), where P(T) now is to be interpreted as the probability of a theory being true and P(e) as the probability of a theory being successful. Whereas antirealists have sought to increase $P(\neg T|e)$ with arguments like the Pessimistic Meta Induction, realists have tried to decrease $P(e|\neg T)$ by restricting

 $^{^4}$ Dicken (2013) has pointed out that retail arguments risk losing sight of the philosophical substance of the realism debate.

⁵ Magnus and Callender's contribution can be seen as a synthesis of earlier points made by Howson (2000) and Lewis (2001).

the notion of success to novel success (327).⁶ But without knowledge of the base rate, engaging in arguments about the posteriors appears meaningless.

Although Magnus and Callender believe that their challenge is equally futile to realists and antirealists, they pose the following dilemma to the realist:

Either there is a way of knowing the approximate base rate of truth among our current theories or there is not. If there is, then we must have some independent grounds for thinking that a theory is very likely true; yet if we had such grounds, the no-miracles argument would be superfluous. If there is not, then the no-miracles argument requires an assumption that some significant proportion of our current theories are [sic] true; yet that would beg the question against the anti-realist. (328)

Because they see no way out of the dilemma, Magnus and Callender conclude that the entire wholesale realism debate is an irrational debate, which better be dissolved:

Without independent methods for estimating crucial base rates, there is little to do but make arguments that beg the question. Wholesale realism debates persist not due to mere stubbornness, but because there is *no reason* for opponents to disagree (336; original emphasis).⁷

Although I think Magnus and Callender are correct in their diagnosis, the consequences of their insight can be alleviated and the second horn of their dilemma be rejected: for the no-miracles-argument to go through, the base rate of true theories need not be high.⁸ In fact, they may even approach zero. In order to present the argument to this effect, we will first of all have to set up the theoretical framework in which I intend to make the argument.

3 Kuhnian theory choice and the idea of virtue convergence

In his *The Structure of Scientific Revolutions* (1962/1996), T.S. Kuhn claimed that paradigm change, such as the change from Newtonian to relativistic mechanics, or from the phlogiston to the oxygen theory of combustion, "cannot be … forced by logic [or] neutral experience" (149). Rather each paradigm comes with its own set of evaluation criteria. Whenever scientists have to choose between paradigms, "each paradigm will be shown to satisfy more or less the criteria that it dictates for itself

⁶ $P(\neg T|e)$ and $P(e|\neg T)$ are related by Bayes' theorem: $P(\neg T|e) = \frac{P(e|\neg T) \times P(\neg T)}{P(e)}$.

⁷ Similarly, when the probabilities are interpreted as subjective probabilities, Magnus and Callender also "can't imagine how one could find a reasonable set of priors" (329).

⁸ See the first quotation above: "a *significant proportion* of our current theories [must be] true". See also Magnus and Callender's p. 325 (end of the second last paragraph).

and to fall short of a few of those dictated by its opponent" (109). In other words, paradigm change is circular in the sense that changing a paradigm must rely on the evaluation criteria that the new paradigm identifies as important (and which will be different from the criteria identified as important by the old paradigm). About ten years after *Structure* Kuhn tried to answer those who (rightly) accused him of putting the case for relativism in a seminal paper on theory choice (Kuhn 1977). Departing from *Structure* to a degree that he probably did not quite realize, Kuhn in this paper advanced the view that there is a standard set of theoretical virtues on the basis of which theories have been assessed by scientists. Kuhn, without claiming either originality or completeness, mentions five prominent virtues: empirical accuracy, (internal and external) consistency, scope, simplicity, and fertility.⁹

Kuhn—slightly reluctantly—distinguished between an objective and subjective element of theory choice (359). The former concerns the set of virtues involved in theory choice. Kuhn writes: "the criteria or values deployed in theory choice [i.e., the virtues] are fixed once and for all, unaffected by their participation in transitions from one theory to another" (Kuhn 1977, 364). Although Kuhn assigned universality to the five standard theoretical virtues, he believed that there was a lot of room for *legitimate* disagreement among practitioners in deciding which theory to adopt. This constitutes the subjective element of theory choice. Each scientist, Kuhn claims, has different weighting preferences concerning the standard theory choice criteria. Whereas some prefer simpler theories, for instance, others prefer more unified theories, and so on.¹⁰ It is this subjective element that led Kuhn to the conclusion that there is 'no neutral algorithm' for theory choice to which all practitioners would be bound (Kuhn 1977, 199). Thus, "two men fully committed to the same list of criteria for choice may nevertheless reach different conclusions" (Kuhn 1977, 358). The subjective element of theory choice, however, does not imply that theory choice would be arbitrary. The standard criteria of theory choice are not projections; they map onto actual theory properties. Theories really are accurate, consistent, fertile, and so on, or they are not.

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⁹ Theoretical virtues are also sometimes denoted as 'values'. In fact Kuhn himself suggested that label. I prefer 'virtues' because 'values' have ethical connotations. Recently there has been a debate about the virtues of the *scientists* making theory-choice (Stump 2007, Ivanova 2010). My discussion instead focuses on the virtues of *theories*.

¹⁰ Although Kuhn thought the five standard virtues are relevant to theory choice throughout the history of science, he thought that 'application of these values' and the 'relative weights attached to them' changed (364-5).

Another remark by Kuhn seems to undermine the objective element in theory choice: theoretical virtues are 'imprecise' or 'ambiguous'. By that he meant that different practitioners might refer to different properties of a theory with the same term. For example, one practitioner might refer to quantitative parsimony and another to qualitative parsimony when calling the theory 'simple'. For example, one practitioner might judge the Copernican system of the planets simpler because it represents the retrogressive motion in simple terms, and another practitioner might judge the Ptolemaic system as simple as the Copernican system, because the Copernican system, too, made use of a large amount of epicycles (Kuhn 1957).¹¹ Yet this problem should constitute no major obstacle for theory choice: barring the much criticized Kuhnian communication failures, practitioners should be able to specify to their peers what properties they are referring to. Practitioners might then still disagree about how these two kinds of simplicity ought to be weighted, of course. The ambiguity problem thus arguably reduces to the weighting problem (Okasha $2011).^{12}$

A similar point can be made with regards to empirical accuracy. In a theorychoice situation, one theory might be empirically accurate with regards to one set of evidence, and another theory might be empirically accurate with regards to another set of evidence. In such a case, we would of course have to fine-grain the virtue of empirical accuracy. Scientists may then disagree as to whether one or the other data set is to be given preference when it comes to the choice between the two theories.

The weighting problem is contingent on another part of the Kuhnian picture of theory choice. According to Kuhn, as a matter of empirical fact, the virtues "repeatedly prove to conflict with one other" (357). In other words, as a matter of empirical fact, theories repeatedly do better than others with regard to some criteria, but worse with regard to others. For convenience let us refer to this claim as 'CONFLICT'. When there is CONFLICT, and when scientists have different weighting preferences, there will be diverging theory choices.

¹¹ The precise number of epicycles used depends on which version of the Ptolemaic system one compares to Copernican system to. For an informative discussion see Palter (1970).

¹² Some readers suggested to me that Kuhn believed that the virtues were *intrinsically* and *inextricably* vague, with no disambiguation being possible. I have found no evidence in Kuhn's text for this suggestion. Regardless, disambiguation of theoretical virtues may not always be unequivocal, of course. There may be boundary cases. But boundary cases do not necessarily imply that we cannot reach agreement. In our everyday life, for example, we pretty successfully manage to agree on what we consider to be a bald person, in spite of baldness being a standard example for a vague predicate.

CONFLICT can also occur within the category of one particular virtue. Take for example empirical accuracy. One theory may perform better with regard to one set of data, and another theory better with regard to another set of data. Scientists with different preferences will end up choosing different theories. This is another reason for why Kuhn thinks theory choice is often indeterminate (357). Again, the 'subjective' element of theory choice, i.e., the interests and preferences of the investigator, will influence which data set an individual will assign greater weight, and accordingly, which theory she will end up choosing.

Interestingly, and somewhat counterintuitively, CONFLICT, can explain theory choice convergence. Again, CONFLICT is an empirical thesis. That is, at least prima facie, there is nothing intrinsic in the virtues or their relationships that would cause CONFLICT. There therefore should be situations in which there are theories that do better with regard to *any* virtue. In that case, the subjective element of theory choice, which Kuhn was so keen to stress, simply cancels out: If I prefer simple theories and you prefer unified theories, then we will adopt different theories when there is no theory that has both of these properties. But when there is a theory that is *both* simple and unified and its competitors are not, then we will end up choosing the same theory *despite* our diverging preferences.¹³

Perhaps even more interestingly, CONFLICT offers a new argument for realism. Roughly, it goes like this: if CONFLICT is true and there are only sometimes theories that exhibit several or even all of the standard virtues, then it would be a strange coincidence if a theory had all the five virtues, be embraced by all scientists, but not be true. It is easy to see: just like the standard NMA for realism, this is a nocoincidence (NC) argument. I will therefore refer to it as the no-virtue-coincidence (NVC) argument. And yet, as I will argue, it is more powerful than the NMA: it offers an answer to Magnus and Callender's challenge.

Before proceeding, however, let us note that CONFLICT does seem to possess a good deal of prior plausibility. If it was easy to construct theories that possessed all of the standard virtues, and most of the theories we come up with possessed all of the standard virtues, then a theory possessing all of the virtues wouldn't warrant it being singled out as a hopeful truth-candidate. At the same time, scientists would have a hard time making their theory-choices when faced with a range of theories

¹³ Kuhn, in his seminal article on theory-choice, firmly focussed his attention on disagreement. All he did write about agreement was that "much work, both theoretical and experimental, is ordinarily required before the new theory can display sufficient accuracy and scope to generate widespread conviction" (363).

that would all score highly on all dimensions of theory choice. But very often, scientists do come to an agreement as to what theory to embrace. Although CONFLICT thus does seem plausible, it is of course an open question *how* frequent it is that only few theories or only one theory at a time possesses all the standard virtues. This question is an *empirical* one and beyond the scope of this article. For the purposes of this paper we shall see, however, the answer to this question will not matter.

4 Earman convergence

Although clearly related, the NVC differs from the NMA in that it appeals to the persuasive power of the convergence of several independent information sources. Whereas the NMA exploits the fact that there are so many ways in which a theory could have been wrong, the class of arguments of which the NVC is a member banks on the fact there are so many ways in which each information source could have produced a result inconsistent with the other sources. Several philosophers have used related 'convergence' arguments. Arguing against the thesis of theoryladenness of observation, for instance, Hacking (1983) pointed out that it would be a strange coincidence if several of our instruments (e.g. the light and the electron microscope), presupposing different background theories, were to produce the same data, if the data were not correct. Likewise, Salmon (1984) pointed out that it would be an inexplicable coincidence if J.-B. Perrin's half-dozen experiments in 1911 all had produced the same value of Avogadro's number and that number had not been correct (see also Cartwright 1983, van Fraassen 2009, Chalmers 2011, Psillos 2011).¹⁴ These 'convergence' arguments are in fact analogous to arguments for the trustworthiness of witness reports in the case of several independent witnesses reporting the same murderer: we'd be compelled to believe that several witnesses tell the truth if they independently of each other report the same murderer (i.e., without coordinating their beliefs)—even when the individual reliability of the witnesses is poor. C.I. Lewis (1946) concludes that "this agreement [between witness reports] is highly unlikely; the story any one false witness might tell being one out of so very large a number of equally possible choices" (246). In other words, the probability that there is convergence in the witness reports makes it unlikely that the witness reports are unreliable. I will argue below that a theory possessing all of the

¹⁴ For a more general discussion about robustness arguments in science see (Hudson 2013). Some antirealists have taken the view that coincidences need not be explained (cf. van Fraassen 1980). In the face of there being a plausible explanation being available, I personally would regard such a move irrational. Yet the issue would lead us too far astray to take this up in any more depth on this occasion.

Kuhnian virtues, and being judged true on the basis of its virtues by the scientific community accordingly, is analogous to independent witnesses all reporting the same murderer.

The intuitive persuasive power of convergent witness reports can be made precise by employing Bayes's theorem (Earman 2000). Let $P(V_i|T)$ represent the probability that a witness i gives a report V that a crime T happened when that crime actually happened, $P(V_i|\neg T)$ the probability that a witness reports a crime when the crime did not happen, and P(T) the prior probability of the crime itself. Assuming that the witnesses are equally reliable and independent, the following equalities hold

$$P(V_{1} \cap ... \cap V_{n}) = P(V_{1}) \cdot P(V_{2}) \cdot ... \cdot P(V_{n}) = P(V)^{n}$$

$$P(V_{1} \cap ... \cap V_{n}|T) = P(V_{1}|T) \cdot P(V_{2}|T) \cdot ... \cdot P(V_{n}|T) = P(V|T)^{n}$$

$$P(V_{1} \cap ... \cap V_{n}|\neg T) = P(V_{1}|\neg T) \cdot P(V_{2}|\neg T) \cdot ... \cdot P(V_{n}|\neg T) = P(V|\neg T)^{n}.$$

The posterior probability of the truth of a report given *n* witnesses making the same observations, by Bayes's theorem, is

$$P(T|V^n) = \frac{1}{1 + \left\lceil \frac{1 - P(T)}{P(T)} \right\rceil \cdot \left\lceil \frac{P(V_1|\neg T) \cdot P(V_2|\neg T) \cdot \dots \cdot P(V_n|\neg T)}{P(V_1|T) \cdot P(V_2|T) \cdot \dots \cdot P(V_n|T)} \right\rceil}$$

which, assuming equally reliable witnesses, reduces to

$$P(T|V^n) = \frac{1}{1 + \left[\frac{1 - P(T)}{P(T)}\right] \cdot \left[\frac{P(V_i|\neg T)}{P(V_i|T)}\right]^n}$$

Let us refer to this equation as the *Earman convergence equation*.

Earman points out that for the occurrence of a crime to be likely given all the witness reports, the witnesses need not be reliable in the absolute sense. All that is required, rather, is that the witness reports be reliable in the relative sense, so that $P(V_i|\neg T) < P(V_i|T)$, since in that case as $n \to \infty$, $\left[\frac{P(V_i|\neg T)}{P(V_i|T)}\right]^n \to 0$, and $P(T|V^n) \to 1$, regardless of how low P(T).

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¹⁵ Earman also conditionalises on the witnesses background knowledge and evidence, which I'll leave out here for the sake of simplicity. Earman also develops the argument with regards to the occurrence of miracles, instead of crimes.

5 Converging virtue judgements

In the context of theory-choice, I suggest we interpret the above probabilities in the following way. Let $P(V_i)$ stand for the probability of a scientist i deeming a theory T true on the basis of some virtue V of T, and let P(T) stand for the probability of T being true. Let $P(V_i|T)$ then be the conditional probability that T would be correctly judged true on the basis of V by scientist i, and $P(V_i|\neg T)$ the conditional probability of T being incorrectly judged true on the basis of V by scientist i. $P(T|V^n)$ is then the posterior probability of T being true given that it was judged true on the basis of V by n scientists. If we now take into consideration that theories can be virtuous along different dimensions, then:

$$P(T|(E \cdot C \cdot S \cdot U \cdot F)^n) = \frac{1}{1 + \left[\frac{1 - P(T)}{P(T)}\right] \cdot \left[\frac{P(E_i \cdot C_i \cdot S_i \cdot U_i \cdot F_i | \neg T)}{P(E_i \cdot C_i \cdot S_i \cdot U_i \cdot F_i | T)}\right]^n}$$

where E_i , C_i , S_i , U_i , F_i is a scientist i's judgement about a theory being true based on that theory's empirical accuracy, consistency, simplicity, and fertility, respectively, in line with the Kuhnian framework of theory choice. The posterior probability (the left-hand side of the equation) thus measures the probability that a very virtuous theory (i.e., a theory with all five virtues) is true, given that it is being judged true by n scientists on the basis of that theory possessing all five virtues.

Note that, just like in the case of the witnesses in Earman's equation, we are assuming that scientists' judgments about the theory's truth on the basis of its virtues are fully independent. This follows directly from Kuhn's assumption that scientists' theory-choice preferences are subjective and diverse (cf. Section 3 and 7). We also assume that the virtues themselves are independent: a theory possessing one virtue will not make it more (or less) likely that it possesses another virtue. We'll get to that in a moment, but regardless of whether the virtues are independent, so long as it is the case that scientists are independent and relatively reliable, i.e., more likely to judge a theory true on the basis of its virtues when it's actually true (rather than false), it will still be the case that when n (i.e., the number of scientists) $\rightarrow \infty$, the posterior probability $P(T|V^n) \rightarrow 1$. With regards to Magnus and Callender's challenge, this means that the base rate of true theories need not be high for nomiracles arguments like the NVC to have any traction. What's more, if n would really converge to infinity, the base rates could be neglected, as they would be diminishingly small.

Of course, in any realistic scenario, the number of scientists n will not converge to infinity. Thus P(T) cannot be arbitrarily small. Yet P(T) may still be so small that the realist may argue that despite our ignorance about the precise value of the base rates, the chances are good that a very virtuous theory is true, if only a low P(T) is granted by the antirealist. It will not win the realist the argument against a very hard-headed antirealist, but it will make the realist's argument much more unassuming. And *some* small value for P(T) the antirealist must grant; otherwise, the Bayesian formalism is simply ill-defined. We will consider further objections in Section 7.

NVC depends on the Kuhnian framework of theory choice in the following way. As we noted above (Section 3), when different theories have different virtues and scientists different virtue preferences, then scientists will end up choosing different theories: some might deem true theories that are simple (but not fertile), others might deem those theories true which are fertile (but not simple), etc. On the other hand, if a theory does possess all the virtues, scientists will choose the same theory despite different virtue preferences. In our formalism, we assume that there is a theory that does possess all the virtues. Accordingly, the formalism represents scientists' judgements as the joint probability that a scientist judges a theory to be true on the basis of all of the theory's virtues. And this makes good sense: after all, it is reasonable to assume that scientists judge a theory not only on the basis of the virtue they prioritize, but also on the basis of the other virtues. In a more realistic representation of theory choice than the one provided here, the different virtue judgements would have a weight. But since this would complicate matters unduly, we shall refrain from incorporating weights. It suffices for our purposes that weights would make a real difference in theory-choice situations in which there is no theory that possesses all the virtues—situations, that is, which we are not interested in here.

As mentioned above, we also presume here that scientists' judgements about a theory's truth on the basis of that theory's virtues are independent. This follows directly from Kuhn's assumption that scientists' theory-choice preferences are subjective and diverse. Another question is whether the virtues themselves are independent. That is, is it plausible that a theory's possessing one virtue does not raise or lower the probability of it possessing another virtue? I think it is. Consider for example simplicity, fertility, unifying power, and consistency in relation to empirical accuracy. It seems obvious that neither a theory's simplicity nor a theory's internal consistency could imply anything about empirical accuracy (and vice versa), as the latter is a relation between the theory and the world whereas simplicity and

consistency are theory-internal relations. The relation between empirical accuracy and the other virtues is perhaps less obvious, but I think there is a good case to be made for their independence as well. Let's start with fertility. If a theory's fertility and theory's empirical accuracy were dependent, then we could infer one from the other. But that's not the case. A theory being empirically accuracy doesn't tell us whether or not the theory has any novel success (i.e., a form of fertility); in fact, many theories in the history of science were empirically accurate but had no novel success. Conversely, a theory having novel success with regard to some phenomena doesn't tell us whether the theory is empirically accurate: there may be phenomena (other than the one the theory successfully predicted) which the theory does not manage to accommodate. Or take unifying power. A theory accommodating a large number of phenomena doesn't tell us whether the theory has unifying power: the theory might just be an incoherent conjunction of very narrow hypotheses. Conversely, a theory having unifying power does not imply that it is empirically accurate (e.g. string theory unifies the four fundamental forces of nature but is not testable). Lastly, a theory being empirically accurate with regards to the empirical consequences that can be derived from it doesn't imply that it is actually consistent with other (empirically accurate) theories. The inconsistency of quantum mechanics and general relativity are prominent examples.

Overall then, there are good grounds for assuming that empirical accuracy is independent from all the other virtues. Similar points can be made about the independence of the other virtues. The assumption that the virtues are independent will be required for estimating the 'error rates' of scientists' judgements for each virtue separately, which we will attempt in the next section. We should stress again, however, that the question of whether or not the virtues are independent does not affect NVC itself, as $P(T|V^n) \rightarrow 1$ when $n \rightarrow \infty$, even when the virtues are dependent; all that is required is that the scientists' judgements are independent and relatively reliable (in the sense specified above).

6 Estimating the error rates and relative truth-conduciveness

As we saw in the last section, for the NVC to go through, scientists' virtue judgements need not be absolutely reliable. They only need to be relatively reliable, that is, the true positive rate $P(V_i|T)$ must only be larger than the false positive rate $P(V_i|T)$, but those rates need not both be low. Is that the case?

In order to address this question, we shall exploit an interesting inverse relationship between the 'error rates': a high false positive rate implies a low true negative rate and vice versa, since $P(V_i|\neg T) = 1 - P(\neg V_i|\neg T)$, and a high true positive rate implies a low false negative rate and vice versa, since $P(V_i|T) = 1 - P(\neg V_i|T)$. We shall interpret the true negative rate $P(\neg V_i|\neg T)$ as the probability of a scientist i to *correctly* judge a theory T to be *false* on the basis of it not being virtuous, and the false negative rate $P(\neg V_i|T)$ as the probability of scientist i to *correctly* judge *false* a theory T on the basis of it not being virtuous. In what follows, we shall use these relationships to estimate the error rates.

Although the probabilities scientists assign to a theory based on its virtues will of course differ from one individual to the other (in agreement with the Kuhnian picture of theory choice), an individual scientist judging a theory likely to be true when there is no good reason to (and vice versa), would amount to this scientist being rational. The error rates can thus be viewed as constraints on rational theorychoice decisions.

First consider empirical accuracy. If a theory is not empirically accurate, it presumably is no candidate for being true: empirical accuracy is a necessary condition for truth. So if a theory is true, it would have to be empirically accurate, and accordingly be judged empirically accurate by scientists. Thus, $P(E_i|T)$ must be 1.17 On the other hand, empirically accurate theories may of course simply save the phenomena without being true. Thus, $P(E_i|\neg T)$, the false positive rate, *could* in principle also be 1. However as a matter of fact it cannot, for if $P(E_i | \neg T) = 1$, then $P(\neg E_i | \neg T)$, i.e., the probability of a theory being correctly judged false on the basis of it not being empirically accurate would be zero, because $P(\neg E_i | \neg T) = 1 - \Box$ $P(E_i | \neg T)$ (see above). But that is extremely implausible. Indeed, a lack of empirical accuracy is probably the best criterion scientists can go by when judging a theory to be false. Thus, $P(\neg E_i | \neg T)$ must have some positive value and $P(E_i | \neg T)$ accordingly a value lower than 1. Since, as determined above, $P(E_i|T) = 1$ and $P(E_i|\neg T) < 1$, the latter is lower than the former, and we can therefore conclude that empirical accuracy is indeed relatively truth-conducive. That means that although empirical accuracy is by no means a guarantee for truth (after all, we're dealing here with

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¹⁶ $P(V_i|T)$ is also known as the sensitivity, and $P(\neg V_i|\neg T)$ as the specificity of a test.

¹⁷ The empirical accuracy of a theory may not be absolute: the theory may be empirically accurate with regards to only some (but not other) relevant phenomena. As explained in Section 3, in our model of theory-choice situation at hand, we would then simply subdivide the virtue of empirical accuracy into empirical accuracy with regards to one set of phenomena and empirical accuracy with regards to another set of phenomena.

probabilities), and although empirical accuracy must not make it even likely that a theory is true (i.e., it must not even be the case that $P(E_i|T) > .5$, although here it appears to be), we determined on the basis of the aforementioned inverse relationships of the error rates that it is still more likely that a theory is empirically accurate when it is true than when it is false. Importantly, this does not necessarily mean the converse, namely that a theory which is empirically accurate is likely to be true. This probability is the probability of the left hand side of our Earman equation derived in Section 4, namely $P(T|V^n)$, and is not to be confused with the error rate $P(E_i|T)$.

Next simplicity. Van Fraassen (1980) and others have argued that a theory's being simple gives us no grounds for thinking that the theory is true or likely to be true. Although this is generally accepted, I have provided reasons for the contrary view in the previous section. If we were to assume that there were indeed no good grounds for simplicity being truth-indicative, it would not be the case that $P(S_i|T) > P(S_i|\neg T)$, i.e., it would not be the case that the probability of a scientist i correctly judging theory T to be true on the basis of it being simple could be larger than the probability of i falsely judging theory T to be true on the basis of it being simple. On the other hand, van Fraassen's arguments of course do not establish that false theories are bound to be simple (which would translate to $P(S_i|\neg T) = 1$), or even that false theories are more likely to be simple than true theories (which would translate to $P(S_i|\neg T) = 1$). If 1 is not only the upper, but also the lower limit, then $P(S_i|T) = 1$, which would cancel it out of our $P(S_i|T) = 1$, which would cancel it out of our $P(S_i|T) = 1$, which would cancel it out of our $P(S_i|T) = 1$.

Let us now turn to unifying power. Theories that have been singled out as approximately true by the realists generally manage to unify the phenomena. Einstein's theory of relativity, the standard model of particle physics, the modern synthesis in evolutionary biology, plate tectonics etc. are cases in point. Thus a true theory, for the realist, is likely to unify and therefore $P(U_i|T)$, i.e., the probability of a theory being correctly judged true on the basis of it unifying the phenomena should approach 1. Of course, the antirealist may want to doubt that a theory is likely to unify if true, i.e., she may want to insist that $P(\neg U_i|T)$ is low, which would, according to the error-rate relations mentioned above, drive down the "realist's" $P(U_i|T)$. But that would imply that it is likely that true theories will not be

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¹⁸ Forster and Sober (1994) and Hitchcock and Sober (2004) argue that simpler models are more likely to accurately predict data than more complex ones. Whether these results extrapolate to theories, which the realism debate is about, is questionable.

recognized as true by virtue of their unifying power. Since the realist holds high unifying power as a mark of truth, it may be that there are many more true theories out there that are unrecognized. But that wouldn't be a problem for the realist. She only wants to make sure that she has good grounds for believing in the truth of those theories to which she does commit. The antirealist would therefore need to give us some reason for driving down $P(U_i|T)$ other than that it wins her the argument. I can't see such an independent argument. The realist, on the other hand, seems to have an argument for $P(U_i|T)$ being high: it simply makes sense (not only from a historical perspective) that theories will unify the phenomena, if they are supposed to be genuine truth-candidates. With regards to the false positive rate, $P(U_i|\neg T)$, it seems glaringly obvious that false theories have only rarely, if ever, achieved the kinds of unification that have regularly been accomplished by theories like the ones above. It seems then safe to assume that $P(U_i|\neg T) < P(U_i|T)$, as required by the *Earman equation*.

Consider consistency next. Kuhn lumps together internal and external consistency. And yet they are best treated separately. Let's start with internal consistency. Clearly, a true theory must be internally consistent (for short: C_{I_i}), i.e., $P(C_{I_i}|T)$ must be 1, which means that the false negative rate must be zero. On the other hand, the false positive rate $P(C_{I_i}|\neg T)$ is much more difficult to assess. There are probably indefinitely many false theories out there that are internally consistent. But there will also be as least as many false theories that are not even consistent. We also know that $P(\neg C_{I_i}|\neg T) = 1 - P(C_{I_i}|\neg T)$, so $P(\neg C_{I_i}|\neg T)$ and $P(C_{I_i}|\neg T)$ cannot both be equal to 1, or be close to 1. In the face of our ignorance about the precise values, it seems most reasonable to set both expressions to .5. That would give us $P(C_{I_i}|\neg T) < P(C_{I_i}|T)$ in conformity with the requirement of the *Earman equation*.

Now consider external consistency (C_{E_i}) . True theories must be consistent with our background knowledge (Boyd 1983, Lipton 1991/2004, Psillos 1999). Thus $P(C_{E_i}|T)=1$ and accordingly the false negative rate $P(\neg C_{E_i}|T)$ would have to be zero. What about the false positive rate $P(C_{E_i}|\neg T)$, i.e., the probability that a theory is judged true on the basis of it being externally consistent if it is actually false? Although there are probably many false theories that are consistent with our background knowledge, there are at least as many (but probably many more) false theories that are inconsistent with our background knowledge, which would mean that $P(\neg C_{E_i}|\neg T)$ will approach 1. But since $P(C_{E_i}|\neg T)=1-P(\neg C_{E_i}|\neg T)$, $(P(C_{E_i}|\neg T))$ would then approach 0. In that case our condition of $P(C_{E_i}|\neg T)<$ seems to be well satisfied.

Lastly, consider fertility. As mentioned above, fertility is standardly construed in terms of novel success. And the capacity to predict novel phenomena is indeed the virtue most cherished by the realist.¹⁹ These days it is in fact treated as a necessary condition for taking a theory to be true. Thus, $P(F_i|T) = 1$. Conversely, realists consider false theories very unlikely to generate successful novel predictions, thus $P(F_i|\neg T)$ ought to be close to zero. The condition for our *Earman equation* is again well satisfied. If the antirealist wishes to challenge this, she would have to present evidence as to false theories being capable of producing novel success. For that it won't be enough to present a handful of cases where false theories allegedly produced novel success (Laudan 1981). Not only need there be a more substantial data base, but also must the antirealist make a case for the theory's false posits being responsible for novel success (Psillos 1999). This has not yet been achieved to any persuasive degree. In fact, by virtue of a logical point made by Vickers (2013), it appears that the realist can remain rather relaxed about allegedly threatening cases.²⁰ Thus, as it stands, the realist is in a good position to demand that $P(F_i|\neg T)$ be kept at a low level. This once again would give us $P(F_i | \neg T) < P(F_i | T)$ in accord with our requirement.

In sum then, it appears that for almost all theoretical virtues considered here (except perhaps simplicity), $P(V_i|\neg T) < P(V_i|T)$ holds and that therefore our NVC, based on the *Earman convergence equation*, against the antirealist succeeds: for $n \to \infty$, $\left[\frac{P(V_i|\neg T)}{P(V_i|T)}\right]^n \to 0$, and therefore $P(T|V^n) \to 1$, regardless of the value of P(T). Less formally, since the false positive rate is smaller than the true positive rate, the more scientists embrace a theory on the basis of its virtues, the more likely it is that it is true, even when the base rates of true theories is very small. As $P(V_i|T)$ need not be >.5 for this argument to go through, this means that the realist can assume that the theoretical virtues are only *minimally* truth-conducive (so that $P(V_i|\neg T) < P(V_i|T)$).

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¹⁹ Some prominent examples are the prediction of light bending by Einstein's theory of relativity, the prediction of the white spot by Poisson on the basis of the wave theory of light, and the prediction of chemical elements by Mendeleev. What makes these predictions impressive is their quality, rather than their quantity: to say it with Popper, the respective theories "took a high risk" of being wrong. There are several notions of novelty. A popular one is so-called "use-novelty". For a recent discussion see *blinded reference*.

²⁰ Vickers points out that "just because a posit is definitely 'derivation internal', and plays an obvious and explicit role in the derivation of interest, does not thereby make it a 'working posit' to which realists are obliged to make a commitment" (204). This is so because, as a matter of principle, wrong working posits can always contain true posits that are responsible for the novel success. This lesson, Vickers admits, applies as much to a prima facie rather compelling case discussed by himself and his collaborator (Saatsi and Vickers 2011) as to any other.

In fact, we *argued* in this section that the theoretical virtues are indeed truth-conducive in this minimal sense.

7 Objections and clarifications

It should be obvious by now that the correct estimates of the error rates are crucial for the NVC argument for realism to have any force. Although we sought to set the error rates with a great deal of charity (consider e.g. simplicity), the antirealist might nevertheless have specific objections to how we set the error rates. Such objections are not necessarily bad news for the purposes of this paper. On the contrary, as this paper sought to undermine Magnus and Callender's claim that the realism debate is irrational, pointed objections against the way the error rates are set would actually support the conclusions of the current paper, as they would be evidence for a rational debate. And although it might be over-optimistic to expect that the realist and the antirealist will come to any agreements (as it is usually the case in philosophy), arguments about the error rates would be decidedly more tractable than arguments about the base rates.

It is worth recalling that we already established that the antirealist cannot undermine the NVC by simply setting the base rates to zero: that would render the formalism ill-defined. It is however widely accepted that the NMA is suitably expressed in Bayesian terms. There is another reason why the antirealist cannot help herself to such an escape: the antirealist is a skeptic, not a dogmatist. That is, antirealists think we have no good reason to believe that our theories are true, not that we have good reason to believe that our theories are false. However, setting the base rates to zero would mean insisting that virtuous theories are *bound to be* false.

There is a more severe problem for the argument presented in this paper. As mentioned above, the number of scientists n can of course not go to infinity; the size of the scientific community is limited at any given time. Accordingly, there will be values for the base rate P(T) for which it will no longer be the case that it is likely that a theory is true when very virtuous, i.e., it will no longer be the case that $P(T|V^n) > .5$ —as the realist would like to have it. The antirealist could thus simply adopt values for P(T), which prevent the NVC to go through. It would seem that Magnus and Callender's observation would then still hold. At the very least, however, such a move by the antirealist would be utterly ad hoc, if not question-begging: the antirealist would have no other motivation for setting her base rates than to avoid the realist's argument to go through. The antirealist would thus

damage the possibility of a rational debate about the error rates, when such debate is clearly available.

Although the number of scientists *n* is not going to converge to infinity, it is still the case on my account that the more scientists embrace a theory, the more likely it is to be correct. One might consider this to be counterintuitive. However, I'm happy to embrace this consequence of my account. After all, I do believe it is plausible that a theory, which is subjected *to more scrutiny* when assessed by a bigger scientific community, is less likely to be false when accepted as true by capable scientists: the probability that the scientists in questions are mistaken (e.g., because they are mistaken about the empirical support the theory enjoys) is simply lower, the more critical eyes there are.

Although I do claim that virtue convergence enables scientists with diverse virtue preferences to choose the same theory and that such virtue convergence gives us good reason to believe that the theory in question is true, I must emphasise that I do not claim that virtue convergence is necessary for realist commitments. In other words, I wouldn't want to deny that a realist attitude can be warranted also in cases in which there is no virtue convergence. For example, there could be cases where the vast majority of scientists choose a theory T1 possessing a single virtue V1 instead of another theory T2 that possesses several virtues, say, V2, V3, and V4.21 Whilst I admit the possibility of such scenarios, my formalism could not accommodate such a case, because it presumes that the theory under consideration possesses all the virtues. In fact, I'm not even sure such a case ought to be accommodated, as it is not quite compatible with the Kuhnian picture of theory-choice according to which scientists' theory-choice preference are diverse; this rules out situations in which a majority of scientists *jointly* spurns several virtues in favour of the *same* single virtue. Regardless of the Kuhnian picture of theory-choice, it just seems odd that scientists would embrace a theory with just a single virtue rather than one with several ones. But once again, I would not want to deny that there may be other good grounds for taking a realist attitude towards theories; it is thus no part of my picture that virtue convergence is necessary for realist commitments.

One may fear that the argument proposed here on the basis of the Kuhnian framework of theory-choice invites relativism. My argument suggests that we be realists about theories that are held to be true by numerous scientists on the basis of the theory's virtues. Does that not subject us to the risk that scientists, at some point

²¹ I thank one of the referees of this paper for raising this possibility.

in time, embrace a theory as true that turns out false in the end? More importantly, does that not render realism relative to a social group at a particular time? My answer to both questions is 'yes'. Yet relativism does not follow. First of all, I, like most philosophers, subscribe to fallibilism. That is, we should never think that we possess the ultimately true theory that will remain with us forever. There is always the possibility that nature will teach us better. Since my argument is a probabilistic one, this possibility is always there. A theory embraced by numerous scientists on the basis of it being very virtuous makes it very likely that the theory is true. It doesn't guarantee it. Second, although my argument is relative to scientists' judgements, it is so in an unproblematic way. For one, the judgements are, as I explained in Section 3, grounded in the *actual* virtues of the theories. So there clearly is an objective basis for these judgements. For another, as I argued in Section 6, my account puts constraints on the nature of these judgements. It is therefore not *any* community's judgements that can serve as basis for my argument. Rather, the judgements are rationally constrained ones.

Another objection to the NVC might be to question whether the community of scientists would really be diverse enough for the individual scientists to make independent theory-choice decisions. Isn't it in fact the case that on the Kuhnian picture of theory choice, a scientific community is under the strong influence of a paradigm, ensuring concord amongst the scientists' decisions? First of all, in Kuhn's view, scientists are under the influence of a paradigm only in periods of normal science. But theory-choice is most relevant in periods of revolution, where paradigm (theories) are changed. In these periods, there clearly is diversity of judgements in Kuhn's view. Second, Kuhn in fact believed that scientists' divergent weighting preferences would go some way to guarantee a right balance between conservatism and innovation *throughout* the development of science (Kuhn 1977, 363). Thus, even in periods of agreement on a paradigm, scientists' individual preferences might diverge. Their agreement despite these divergences, as I argued above (Section 3), is explicable when there is virtue convergence.

Let's turn to a different aspect. The NVC assumes that scientists make judgements about the *truth* of a theory on the basis of its virtues. But why should we presume that scientists make such judgements rather than merely acceptance judgements, which do not require any commitment from them regarding the truth of a theory? On the contrary, is it not more plausible that scientists normally do not make such commitments? In fact, I'm happy to say that scientists need not have any commitments about the truth of a theory, so I'm happy to accept that what I referred

to as "scientists' judgements about the truth of a theory" can be construed minimally so that they amount to no more than judgements about empirical adequacy in van Fraassen's sense, that is, a theory's truth concerning observables in the past, present, and future (van Fraassen 1980). I therefore want to keep apart the truth in the context of scientists' judgements, i.e., $P(V_i)$, from the truth of the theory P(T). So a scientist might judge a theory only empirically adequate (and not true) on the basis of that theory's virtue, but still we might, as we did, take this judgement as evidence for the truth of a theory, namely $P(T|V^n)$. More fundamentally, it might still be justified to think that a theory is likely to have certain virtues if true (and accordingly, be judged true (in a deflationary sense), i.e., $P(V_i|T)$), as we argued in Section 6.

Finally, one might object that scientists' judgements about a theory's truth based on its virtues, contrary to what I assumed above, should be sensitive to *degrees* of 'virtueness'. That is, in reality, theories are not just simple or not simple, empirically accurate or not, unifying or conjunctive, etc., but rather more or less simple, empirically accurate etc. But we can happily admit that our assumption that judgements are binary is indeed an idealization. Reality is regularly more complex than our representations of it. I think it would be foolish, however, to conclude that our argument for this reason alone is therefore meaningless. That would make large parts of science, in which idealization looms large, meaningless too. Although the judgements the NVC is based on are perhaps more fine-grained than supposed here, I can't see that this would undermine the basic argument.

8 Conclusion

In this paper I argued, with the help of a point made by Earman in the case of converging witness reports and by presuming the Kuhnian framework of theory choice, that a convergence of a significant number of scientists' judgements about a very virtuous theory being true will make it very likely that the theory is true, almost regardless of the base rates. Although, for reasons to do with the finite amount of scientists embracing a theory at any particular time, this cannot be a blanket victory for the realist, my argument still tilts the balance in favour of the realist.

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