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MODUS DARWIN RECONSIDERED

Casey Helgeson, London School of Economics c.helgeson@lse.ac.uk

Abstract. *Modus Darwin* is the name given by Elliott Sober to a form of argument that Sober attributes to Darwin in the *Origin of Species*, and to subsequent evolutionary biologists who have reasoned in the same way. In short, the argument form goes: *Similarity, ergo common ancestry.* In the present paper I review and critique Sober's analysis of Darwin's reasoning. I argue that *modus Darwin* has serious limitations that make the argument form unsuited for supporting Darwin's conclusions. Thus, either Darwin argued badly, or he didn't use *modus Darwin*. I briefly argue for the latter.

INTRODUCTION

One of the central tenants of modern evolutionary biology is the shared ancestry of all extant life on Earth. Darwin's book *On the Origin of Species* gave us a big push in that direction. Darwin could address only the portion of Earth's biota of which nineteenth-century naturalists were aware, and he could see only a short ways back into the long history of life. But he argued compellingly that diverse groups of organisms had evolved each from a single ancestor species, concluding that "animals have descended from at most only four or five progenitors, and plants from an equal or lesser number" (Darwin; 1859/2003, 484). It was a radical conclusion, yet the scientific audience was largely convinced (Bowler; 1989; Larson; 2004).¹

In a series of publications, Elliott Sober has sought to clarify and analyze Darwin's case for common ancestry, and to generalize Darwin's reasoning to encompass contemporary thinking about newer evidence for the hypothesis (Sober; 1999, 2008, 2011; Sober and Steel; 2002, 2014). Sober's project is thus part exegesis, part epistemology: *How does Darwin argue?*, and *How does that argument justify common ancestry?* In answer to the first question, Sober attributes to Darwin the following argument form:

Similarity, ergo common ancestry. This form of argument occurs so often in Darwin's writings that it deserves to be called *modus Darwin*. The finches in the Galapagos Islands are similar; hence, they descended from a common ancestor. Human beings and monkeys are similar; hence, they descended from a common ancestor. The examples are plentiful, not just

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¹The broad acceptance of *common ancestry* by Darwin's scientific audience – within a decade or two of the *Origin* – should not be confused with their lukewarm response to *natural selection*, which languished until the modern synthesis.

in Darwin's thought, but in evolutionary reasoning down to the present. (Sober; 1999, 265)

To address the *epistemological* question, Sober sets out to formalize *modus Darwin* with mathematical rigor, ultimately deriving the force of the argument form from the *Law of Likelihood* (explained below).

In this essay I review and critique Sober's analysis of Darwin's reasoning. After introducing Sober's account, I temporarily bracket exegesis to focus on the epistemic merits of *modus Darwin* as Sober understands it. Here I argue that several difficulties undermine the cogency of the argument form. From this it follows that *either* Darwin reasoned badly (he gave bad reasons for a true conclusion) *or* he did not employ *modus Darwin*. From there I bring Darwin himself back into the picture, and argue against attributing to him the flawed argument form *similarity, ergo common ancestry*.

MODUS DARWIN

Sober derives the normative force of *modus Darwin* from the *Law of Likelihood* (Hacking; 1965; Royall; 1997; Sober; 2008), according to which an observation supports one hypothesis over another whenever that observation is more probable supposing the one hypothesis were true, compared with supposing the other hypothesis were true. More formally, observation o favors hypothesis h_1 over hypothesis h_2 if and only if $p(o|h_1) > p(o|h_2)$. Mapping this framework onto Darwin's reasoning requires identifying an observation o , and two hypotheses h_1 and h_2 .

Similarity between two species is the observation o . The hypothesis h_1 is com *mon ancestry* (CA), which says that those two species descended from a single ancestor species. For the alternative hypothesis h_2 , Sober chooses *separate ancestry* (SA), meaning that the two species' lineages trace back to separate origin-of-life events. These are, however, only the rough, qualitative statements of o , h_1 , and h_2 . To evaluate the inequality $p(o|h_1) > p(o|h_2)$, Sober must define *o* more concretely and then formally characterize h_1 and h_2 as stochastic (chancy) processes that can produce such outcomes with some concrete probability.

Regarding the observation *o*, when do two species count as "similar"? Any two species are similar in some ways and dissimilar in others. What is the right yardstick? Sober initially sidesteps this thorny question, and begins with a simpler and more tractable observation: that two species share the same trait on a single *dichotomous character*. A dichotomous character is one that has just two possible states, for example an insect might have wings or lack them, or the edge of a leaf might be smooth or serrated. (Coding morphology in terms of dichotomous characters typically masks more continuous underlying variation, but dichotomous characters are adequate in many scientific contexts, and they provide a convenient starting point for the formalization of *modus Darwin*.)

Does the observation favor CA over SA *sensu* the Law of Likelihood? To generate the required conditional probabilities Sober repurposes the idealizations and mathematical framework of contemporary phylogenetic inference, as follows. Let variables X and Y represent the two species, where each can take states $\{0,1\}$, standing for the two possible states of the dichotomous character. So the observation *o* is both species in the same state (either both 0 or both 1). Each hypothesis is then characterized by a schematic genealogy for the two species (Figure 1), plus a stochastic model describing how the character variables change states as they moves along a line in the genealogy.

FIGURE 1. Schematic diagrams illustrating lineages postulated by the common ancestry (CA) and separate ancestry (SA) hypotheses.

The model of character-state evolution (applied in the same way to all solid lines in both Figure 1 schematics) works as follows.² Each solid line comprises a number of time steps (the same number for each of the four lines); the variable associated with each line starts in one state or the other, and then undergoes this many time steps of evolution. At every step there is a small probability that the variable changes from its present state to the other state. (Two state-change probabilities are required: $0 \rightarrow 1$ and $1 \rightarrow 0$, which need not be equal.) The probability of changing states at any given step depends only on the current state of the variable. The longer the stretch of lineage, the greater the chance that the character variable will change along that stretch.

In which state does a character variable begin? The initial state of is determined by a random draw from a probability distribution over the state space *{*0*,* 1*}* (*i.e.*, a coin flip—though the coin may be biased). And here lies the only difference between the stochastic models of CA and SA: for SA the initial states of *X* and *Y* are set by two independent draws from that distribution, whereas for CA just one draw is required because $\mathcal X$ and $\mathcal Y$ must begin in the same state (think of this as the point just before speciation).

With CA and SA so characterized, Sober proves the following result: for *X* and *Y* to end up in the same state at the end of the process is more probable on CA than on SA *regardless of time steps, state-change probabilities, and starting-state*

²While Darwin's primary target in *Origin* was a non-evolutionary, *creationist* version of the separate ancestry hypothesis, Sober prefers to reconstruct *modus Darwin* using a separate ancestry hypothesis that embraces evolutionary change. The idea is that this choice leaves the basic form of Darwin's reasoning intact, with the added benefit of illuminating the fundamental similarity between Darwin's reasoning and subsequent arguments made *within* evolutionary theory.

 $distribution$ (Sober: 2008, chap. 4).³ In other words, two species found in the same state always favors CA over SA. It isn't hard to understand intuitively why this is so. If the state-change probabilities are small relative to the number of time steps, then the most probable outcome along any branch is stasis. In this case, since CA puts the two species in the same state from the start, chances are good they will both still be in that state at the end. The chances of ending in the same state are somewhat smaller on SA, since X and Y may or may not *begin* in the same state. As the probability of state change along a branch increases (due either to long lineages or high state-change probabilities), *p*(*o|CA*) and *p*(*o|SA*) converge on the same value, though $p(o|CA)$ must always be a little bit higher. The opposite is true for species found in different states: *mismatches* always favor SA over CA.

Sober goes on to extend this treatment to cover *multistate* characters as well, where the variables $\mathcal X$ and $\mathcal Y$ can now take any number of states $\{1, 2, \ldots n\}$ and correspondingly more state-change probabilities are needed: one for every possible transition from one state to another $(i \rightarrow j,$ for all $i, j \in \{1, 2, \ldots n\})$. Sober shows that, here too, $\mathcal X$ and $\mathcal Y$ in the same state at the end of the process is more probable on CA than on SA. Mismatches on multistate characters, however, are more complicated. Some mismatches will favor CA, while others will favor SA, depending on the details (Sober; 2008, 295–314).

Finally, Sober returns to the question of *overall* similarity by considering a *set* of observations $\{o_1, o_2, \ldots, o_m\}$, each concerning a different trait. Given such a set, including both matches and mismatches, which hypothesis is favored *overall*? As described above, the evidential import of of each individual observation *oⁱ* is encoded by the ratio of conditional probabilities $p(o_i|CA)/p(o_i|SA)$. Supposing that the process by which each trait evolves is probabilistically independent of that governing every other trait,⁴ the *set* of observations favors CA over SA if and only if the *product* of those ratios (one from each observed trait) is greater than one—in mathematical notation, if and only if:

(1)
$$
\prod_{i=1}^{m} \frac{p(o_i|CA)}{p(o_i|SA)} > 1.
$$

The idea is that for *similar* species (*e.g.*, humans and chimpanzees, or two types of finch) the calculation will come out in favor of CA.⁵

³With these very minor assumptions: the starting-state distribution gives non-zero probabilities to both states; transition probabilities are strictly between 0 and 1; and time steps are finite.

⁴While this assumption is certainly not true, it is a standard idealization in, *e.g.*, phylogenetic inference from genetic data (thinking of each nucleotide site, or of each codon, as a trait).

⁵Not that anyone explicitly carried out such a calculation. But evaluating historical reasoning through the lens of modern epistemic norms always involves out-of-context formalities. If one aims, in addition, to illuminate the way that an author or their audience actually reasoned, the fact that no actor drew pen and paper to calculate is not necessarily an obstacle: the success of a simple reasoning heuristic might require some math to explain, and the cognitive underpinnings of ostensibly qualitative reasoning can approximate complex calculations (as per the wide-spread

Application to biogeography. To interpret Darwin's geographical distribution observations (how species are distributed about the globe), Sober develops a variant of *modus Darwin* that proceeds from observed *geographical proximity* rather than anatomical similarity, in other words: *proximity, ergo common ancestry*. All that's required is a reinterpretation of the stochastic model of character-state evolution as a model of *geographical dispersal.*

Consider a multistate character with ten discrete states. The model governing how this character evolves requires a ten-by-ten matrix of transition probabilities, one for each possible transition from one state to another (Equation 2). Allow nonzero probability only between neighboring states (and between a state and itself). Now think of the states themselves as *geographical locations* along a line (*e.g.*, islands in an archipelago) rather than variants of an anatomical character. And think of state change as *geographical dispersal* rather than morphological evolution. A species can disperse from one location to another only by passing through the locations in-between, thus the zeros for non-neighboring state transitions. "Neutral evolution within an ordered *n*-state character is formally just like random dispersal across an *n*-island archipelago." (Sober; 2008, 326)

$$
(2) \qquad \begin{pmatrix} .99 & .01 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ .01 & .98 & .01 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & .01 & .98 & .01 & 0 & 0 & 0 & 0 & 0 & 0 \\ \vdots & & & & & & & \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & .01 & .99 \end{pmatrix}
$$

A random draw from a distribution over the ten states determines where a species begins.⁶ And just as with anatomical *modus Darwin*, the difference between CA and SA is that CA posits one random draw (whence *both* species begin dispersing) while SA posits two independent draws, one for each species. The observation *o* is then the observed spatial separation between species $(|\mathcal{X}-\mathcal{Y}|)$ after a period of dispersal. In this example, Sober calculates that:

With ten locations, the expectation under the separate-ancestry hypothesis is that X and Y will be a bit more than three islands away from each other. If X and Y are more spatially proximate than this, then CA has the higher likelihood; if not, not. (Sober; 2008, 326)

Sober goes on analyze Darwin's use of geographical distribution observations in the *Origin* by mapping the reinterpreted formalism onto Darwin's (chap. 12) discussion of the Galapagos Archipelago. I will return to the Galapagos example later on.

use of Bayesian statistics in the descriptive modeling of human and animal reasoning, see, *e.g.*, Kemp and Tenenbaum's (2008) descriptive model of pre-Darwinian taxonomic reasoning).

⁶The state-change probabilities (Equation 2) determine what is called the *equilibrium distribution* of the location variable, which gives the probabilities of finding the variable in each of its ten states after (loosely speaking) infinitely many time steps. Sober uses this equilibrium distribution as the starting-state distribution; in this case that distribution is uniform.

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Modus Darwin in Practice

Now I turn to some objections to Sober's analysis of Darwin's reasoning. In this section I focus on epistemic considerations. Set Darwin to one side, and suppose that someone (anyone) argues for common ancestry along the lines of *modus Darwin*. Is it a *good* argument?

The core mathematical result underlying Sober's analysis is that two species found in the same state for a single character always favors CA over SA. While this conclusion is striking in its generality, it does not by itself get one very far towards applying *modus Darwin* to real observations. Most applications call for a continuous, or at least multi-state, treatment, where exact matches will be few and far between. And as soon as we leave behind the special case of the exact match, all of the details and parameters that Sober's proof manages to bracket become important again. Here *modus Darwin* can pronounce evidential favoring verdicts only after additional assumptions fix the moving parts within the stochastic models of CA and SA. Can the right assumptions be identified in the contexts in which the inference form is supposed to operate? There is reason for worry in the cases of *branch lengths*, and the *size of the anatomical space*.

Anatomical space. Suppose we compare species *X* and *Y* on a given anatomical character, and we model this character as having 10 ordered states (Sober's example, from above). Say it's the length of a certain bone in centimeters, and the species measure 1cm and 4cm, for a difference of 3. Sticking with the Equation 2 transition probabilities (and the resulting equilibrium distribution for the initial states) and supposing a middling 300 time steps, the observation gives a likelihood ratio a hair above 1 (*i.e.*, no evidence either way). But now rethink one of the modeling decisions that led to this number. Who said the range of possible character states is 1–10? Perhaps the upper limit is instead 5, or 15. Figure 2 displays likelihood ratios for the same observation—and others—recalculated on the assumption that the range of possible states is $1-5$ (light gray) and $1-15$ (dark gray). Using the 1–5 space, our 3cm observation registers as evidence favoring SA, but using the 1–15 space, the observation favors CA. Looking across possible observations, on the $1-5$ space the evidence turns against CA when the difference between states passes 1; in the case of 1–15 the same happens only above 4.

In general, positing a larger anatomical space raises the likelihood ratio, making the evidence appear more favorable to CA, while positing a smaller space lowers the ratio, pushing the needle back towards SA. This effect happens through the denominator, $p(obs. |SA)$. (If the starting states of X and Y are chosen independently from a uniform distribution, then a bigger space makes larger observed differences more probable.) The size of the space matters little to the numerator, *p*(*obs.|CA*): if variables that begin in the same state will have typically evolved apart by 3 units at the end of the process, it makes no difference to the outcome whether the space in which this occurs is 15 units wide or 150.

The problem is that the choice between these different character state spaces appears to be arbitrary. What could motivate the choice? You might think to use the range of states observed across all taxa, though this solution makes little sense from the evolutionary perspective: surely the organisms that have evolved so far don't exhaust all *possible* anatomies. The question is equally puzzling from the perspective of Darwin's creationist opponents: is a bone of length 11cm beyond the creator's imagination? (The difficulty is the same regardless of whether the origin events are understood as natural or supernatural.) Yet without a sensible and theoretically neutral way of defining the range of possible character states—to include a defense of the very idea that there is such a fixed range—the formalism that Sober uses to reconstruct *similarity, ergo common ancestry* cannot make any evidence rulings, and cannot validate *modus Darwin*.

Branch lengths. Continuing with the example of the ordered, 10-state character (now bracketing concerns about how to choose the range of possible states), Sober writes that the expectation under SA is that species *X* and *Y* will be observed to differ by just over three states, and that observations below this threshold favor CA over SA. But this analysis understates the dependence of the evidential favoring verdict on the stipulations that go into the model's evolutionary mechanics: while the expectation claim is correct, it does not follow, and it is not generally true, that distances below that expectation favor CA. For trait differences of $1-3$, the direction of evidential favoring depends on *branch length*, a term from phylogenetics that refers to the probability of change along a lineage. Branch length is a function of both the number of time steps (in the solid lines of Figure 1) and the transition probabilities (*e.g.*, Equation 2): one branch is longer than another

if change is more probable along that branch, whether this is due to more time steps, or to higher transition probabilities, or a combination of the two.

To understand intuitively the dependence of evidential favoring on branch length, consider the case of branch lengths so short that any change at all is very improbable. Since CA puts the species in the same state to begin with, they will very probably still be in the same state after the period of evolution, for a trait difference of 0. In this case, observing a difference of $1, 2$, or 3 will heavily favor separate ancestry. The broader picture of dependence on branch length can be seen in Figure 3, which displays likelihood ratios for all observations 0–9, calculated on three different assumptions about the number of time steps of evolution. The shorter the time frame, the closer the two states must be for the observation to favor CA. And since the mathematics is the same for geographical dispersal, the lesson applies equally to biogeographical *modus Darwin*. (Equation 2 transition probabilities are used throughout; alternatively, one could explore dependence on branch length by fixing the number of time steps and scaling the transition probabilities—with equivalent results.)

FIGURE 3. Likelihood ratios $p(obs. | CA)/p(obs. | SA)$ for observed character state differences, varying the number of time steps. Ratios above 1 favor CA and ratios below 1 favor SA.

So using *modus Darwin* to interpret similarity/proximity as evidence bearing on common ancestry requires knowledge of branch lengths. Would this have posed a problem for mid-nineteenth century naturalists? Insight into the timescale of biological change came from geology via paleontology. Tremendous progress was made in the eighteenth and nineteenth centuries in collating layers of sediment from sites around the world, resulting in a coherent time-ordering of geological eras and of the fossil remains carried within those layers. But the project of assigning absolute dates to geological eras (and thus fossil remains) proceeded much more slowly. The nineteenth century was characterized by competing and wildly

divergent estimates of the age of the earth and its geological eras (Gohau; 1990), and by interdisciplinary jostling on the subject between biologists, geologists, and physicists (Shipley; 2001).

Early nineteenth century catastrophists thought in terms of hundreds of thousands of years (Cuvier), or of millions (de Serres, Buckland). Lyell's uniformitarian assumptions led him to posit 240 million years since the beginning of the Cambrian period—which contained the earliest known fossils at that time (Gohau; 1990). But physicists balked at the idea of a steady-state earth, and following mid-century developments in thermodynamics William Thompson (later Lord Kelvin) calculated at most one half—and more probably one tenth—of that time for the earth's entire history from a molten state to its present condition (Burchfield; 1975). Thompson's work was influential, pushing most geologists in the late nineteenth century away from uniformitarianism and towards shorter time scales and faster geological processes (Bowler; 1989, chap. 7).

Darwin followed Lyell in matters geological, and his own back-of-the-envelope calculations were even more generous than Lyell's Cambrian estimate.⁷ Darwin had originally assumed an almost unlimited amount of time for life to evolve (Bowler; 1989; Larson; 2004), and the trend towards shorter time scales put pressure on his theory of natural selection. In particular, Thompson's timeframe was regarded by all parties as too short for Darwin's slow, gradual process to yield the observed diversity of life. The discrepancy contributed to skepticism about natural selection and encouraged evolutionists' explorations of alternative processes, including orthogenesis, saltationism, and Lamarckian inheritance. Though skeptical of Thompson's results, Darwin himself gave the inheritance of acquired characteristics an ever greater role in later editions of the *Origin*, in part to allow for more rapid evolution (Larson; 2004, chap. 5).

Yet through all of the uncertainty and discord over the timescale, pace and processes of evolution, naturalists grew ever more committed to common ancestry and evolution *by some mechanism or other*—also called the "theory of descent." Writing in 1907, American entomologist Vernon Kellogg summarized the state of play in his *Darwinism to-day* ("Darwinism" referring specifically to Darwin's theory of natural selection):

While many reputable biologists to-day strongly doubt the commonly reputed effectiveness of the Darwinian selection factors to explain descent – some, indeed, holding them to be of absolutely no species-forming value – practically no naturalists of position and recognized attainment

⁷Darwin gives an example close to home: a large geological feature in south-eastern England called the Weald, where relatively deep geological strata are exposed. Higher layers of known (local) thickness must have been worn away over time, and based on what Darwin considers a conservative estimate of the rate of denudation (wearing down, by various means) he estimates that the process must have required 300 million years (Darwin; 1859/2003, 285–7). All of the strata in question are well above the Cambrian layer—so compared to Lyell's Cambrian estimate, Darwin's 300 million is a bigger number for a period known to be significantly shorter.

doubt the theory of descent. Organic evolution, that is, the descent of species, is looked on by biologists to be as proved a part of their science as gravitation is in the science of physics or chemical anity in that of chemistry. Doubts of Darwinism are not, then, doubts of organic evolution. (Kellogg; 1907, 3)

Sober's statistical defense of *modus Darwin* rests Darwin's evidence for common ancestry on knowledge of branch length—a product of the pace and the timescale of evolution. But ideas about those parameters, as well as the science that best facilitated their estimation, remained fluid well into the $20th$ century. A thorough historical investigation might help clarify the degree to which branch length uncertainty would have hampered attempts to evaluate the likelihoods with which Sober underwrites *modus Darwin*, but the general outline of historical development suggests that Victorian naturalists, Darwin included, were not in a position to reason in that way. The broad picture is instead one of conviction on common ancestry driving research into mechanisms of evolution and inheritance, while fuzzy ideas about the pace and timescale of evolution were pushed around by constraints from geology and physics. Sober's formalism has the tail wagging the dog.⁸

Did Darwin use Modus Darwin?

So far I have raised concerns about the formal, probabilistic reasoning that Sober offers in defense of the inference form expressed colloquially as *similarity, ergo common ancestry.* But now that *modus Darwin* looks increasingly difficult to justify, we might step back and (giving Darwin the benefit of the doubt) reconsider the attribution. While Sober sees *modus Darwin* at work throughout Darwin's thinking, two specific *Origin* passages receive special attention (Sober; 2008). In what follows, I examine these two passages and ask whether *modus Darwin* plays a role in the reasoning displayed there. In each case, I'll answer 'No,' and briefly sketch an alternative reading.

Adaptive characters. Are some similarities between species *X* and *Y* more telling evidence than others in favor of common ancestry? Sober raises the question while discussing the combined evidence from a set of observations (Sober; 2008, 297), citing the following passage as Darwin's answer:

On my view of characters being of real importance for classification, only in so far as they reveal descent, we can clearly understand why analogical or adaptive character, although of the utmost importance to the welfare of the being, are almost valueless to the systematist. For animals, belonging to two most distinct lines of descent, may readily

⁸To quicky finish the narrative: In the early twentieth century Thompson's age-of-the-earth calculations were conclusively undermined by new understanding of radioactivity, and geologists began to embrace longer time scales. Another few decades' work in genetics and related fields would ease other worries about the efficacy of natural selection (Mayr; 1982, 510–525), leading to the modern synthesis and the resurgence of "Darwinism."

become adapted to similar conditions and thus assume a close external resemblance; but such resemblances will not reveal—will rather tend to conceal their blood-relationship to their proper lines of descent. (Darwin; 1859/2003, 427)

Sober then shows that within the *modus Darwin* formalism, transition probabilities that bias both X and Y towards a particular state give rise to smaller likelihood ratios for the observation of both species in the favored state, compared to symmetrical transition probabilities (drift) (Sober; 2008, 297–8). In other words, matches on *adaptive* characters are weaker evidence for CA over SA, just as Darwin said.

Or did he? The quoted passage comes from a section of chapter 13 labeled "classification," in which Darwin reinterprets existing taxonomic practice in light of his theory of evolution. Mid-nineteenth century taxonomic classifications used a groups-within-groups structure to represent relationships between taxa. In essence, Darwin said that those taxonomic structures were in fact genealogical trees (now we would say *phylogenetic* trees), and that existing taxonomic practice amounted to a method of phylogenetic inference. To drive home the point, Darwin picked out a handful of taxonomic practices that (while widely used) had no deep methodological justification, and he argued that if his theory is true, and the signal taxonomists have painstakingly extracted from anatomy is in fact that left by ancient genealogical relations between species, then those practices now made sense. One of those poorly-grounded practices was the discounting of adaptive characters.

So Darwin's comments address the role of adaptive characters *in phylogenetic systematics*, where the competing hypotheses are alternative genealogical trees (Figure 4), *all of which presuppose common ancestry*. Such trees differ only on which species have more recently diverged from which. In this context, separate ancestry is out of the picture, and with it *modus Darwin*. The fundamental mode of reasoning to which Darwin's discussion of adaptive characters adds a caveat is not *similarity, ergo common ancestry* but rather *greater similarity, ergo more recent ancestry*. The latter is the basic credo of phylogenetic inference (a comparatively well-researched inference problem). The adaptive characters passage does not show Darwin using *modus Darwin* after all.

FIGURE 4. Three competing genealogical hypotheses.

This is not to say that Darwin's discussion of classification and adaptive characters doesn't ultimately contribute to his case for common ancestry. Darwin takes the branching, tree-like structure of his common ancestry hypothesis to explain the groups-within-groups nature of existing taxonomic relations (Winsor; 2009), as well as (when combined with natural selection) the otherwise mysterious classificatory usefulness of non-adaptive traits, rudimentary organs, and embryological characters (Richards; 2009). And these explanatory feats, thinks Darwin, redound to the credit of his theory. Of course this is only a casual sketch of Darwin's reasoning—not a philosophical analysis linking that reasoning to well-defined epistemic norms. Yet so long as it is *descriptively* accurate, we can see that *modus Darwin* is not invoked.

Galapagos. Darwin's *Origin* discussion of the Galapagos Archipelago is the second spot where Sober explicitly maps *modus Darwin* onto a specific passage. Darwin's brief discussion of the Galapagos comes at the end of two chapters devoted to the geographical distribution of species, where it serves as an illustration of the following generalization: "The most striking and important fact for us in regard to the inhabitants of islands, is their affinity to those of the nearest mainland, without being actually the same species" (Darwin; 1859/2003, 238–9). Darwin takes this feature of island biogeography to speak in favor of common ancestry, and Sober reconstructs that reasoning as follows. Each Galapagos species $\{X_1, X_2, \ldots X_n\}$ is paired with a species found on mainland South America $\{Y_1, Y_2, \ldots, Y_n\}$ on the basis of close anatomical similarity (Figure 5). For each pair, the anatomical similarity of species X_i to its mainland counterpart Y_i supports CA over SA, for that pair, via *modus Darwin*. On top of that anatomical evidence, the geographical proximity of X_i and Y_i then adds further support for CA over SA for that pair, now by the geographical distribution variant of *modus Darwin* (Sober; 2008, 330).⁹

FIGURE 5. Schematic representation of the Galapagos $\{X_1, \ldots, X_n\}$ and mainland South American ${Y_1, \ldots Y_n}$ species featured in Sober's reading of Darwin's Galapagos Archipelago illustration.

I have another reading. Darwin's island biogeography generalization is a special case of an even more general trend that he introduces at the very beginning of his first chapter on geographical distribution, namely that the more accessible any two geographical regions (by migration or dispersal), the more similar the inhabitants

⁹Sober sees an additional inference in Darwin's discussion of the Galapagos, concerning whether the geographical origin of each pair (X_i, Y_i) is the same (Sober; 2008, 331–2). But this additional reasoning is not an instance of *modus Darwin*, and no longer concerns CA versus SA.

of those regions (Darwin; 1859/2003, 347–50). That Darwin's real focus is *relative* proximity within groups of species (*n >* 2) is not obvious from his (rather cursory) treatment of the Galapagos, but it is clear looking at the few examples that he discusses in (somewhat) greater detail. His primary illustrations feature South America's unique rodents and flightless birds. The agouti, viscacha, coypu and capybara are each other's closest taxonomic relations (*i.e.*, they're more similar to each other than to anything else in the big wide world) and they live in nearby regions of South America. Somewhat similar, but less so (again, as judged by existing taxonomic classifications) are the beaver and muskrat, which are found much further afield in North America and Europe; hares and rabbits are even more widely dispersed. The flightless birds (greater rhea, Darwin's rhea, emu, and ostrich) illustrate the same pattern (Darwin; 1859/2003, 349).

Darwin's argument goes roughly as follows. Suppose a group of species shares a branching, tree-like ancestry, and suppose the true tree is reflected (albeit imperfectly) in taxonomists' classifications. How might this be checked against geographical distribution observations? Consider any species, together with its closest taxonomic relations plus a somewhat more distally classified species or two (similar to what we now call an *outgroup*). Since more recent common ancestry leaves less time for geographical dispersal, the closest taxonomic relations should typically be found somewhere more accessible than the outgroup species.¹⁰ The observed trend with which Darwin opens his geographical distribution discussion (the more accessible the regions, the more similar the inhabitants) shows that this is generally the case. This relationship is difficult to explain on the supposition that each species was created independently, so the observations support the common ancestry suppositions from which we began.

As before with the adaptive characters passage, my alternative reading falls short of a deep epistemological analysis or evaluation of the argument. The point is that Darwin's geographical distribution argument does not conform to *modus Darwin*. The step in Darwin's reasoning that links accessibility to ancestry *presupposes* CA for every species pair. And while *modus Darwin* attends to the *absolute* proximity between two species, *e.g.*, "If X and Y are more spatially proximate than [three units away], then CA has the higher likelihood; if not, not" (Sober; 2008, 326), Darwin is talking about *relative* proximity $(X$ is closer to Y than to Z), with no regard for scale. Indeed, on an absolute scale the Galapagos are very inaccessible from South America, being separated by 600 miles of open ocean. Darwin's point is that even in such cases, the general pattern of relative similarity mirroring relative proximity persists: for a given Galapagos species, the *most similar* species found outside the Galapagos archipelago inhabit the *most accessible* region, the South American mainland; less similar species are found further afield.¹¹

¹⁰Compare Sober's (2008, 327–9) discussion of Darwin's "space-time principle."

¹¹One special threshold of accessibility does play a role in Darwin's reasoning: if it were *impossible* for a species or their ancestors to get from point A to point B, then species in those locations

So neither the adaptive characters passage nor the Galapagos example illustrate *modus Darwin* in action. While two false alarms don't show that Darwin *never* used *modus Darwin*, I hope that by supplying alternative readings of the passages that Sober discusses explicitly, I have at least shifted the burden of proof. My own judgement—which goes beyond what I can argue for here—is that (at least in the *Origin*) *modus Darwin* plays at best a minor role in Darwin's reasoning.¹² Other passages that may appear to espouse *similarity, ergo common ancestry* are in my view most likely abbreviated rehearsals of Darwin's blanket reinterpretation of biological classifications as genealogical hypotheses. They are, in other words, further instances of *greater similarity, ergo more recent ancestry*. I suggest it is this phylogenetic thinking—and not *modus Darwin*—that occurs again and again in Darwin's reasoning, as a recurring element within various arguments that Darwin constructs in support of his theory.

But it may not be quite correct to say that Darwin himself made inferences of the form *greater similarity, ergo more recent ancestry*. Nineteenth century taxonomic classifications were produced by specialists with years of experience working on specific groups of organisms. Except where Darwin did this kind of work himself (*e.g.*, on barnacles), he would have relied on the work of others, those classifications becoming part and parcel of any judgments of similarity between species. Other naturalists with deeper knowledge of the taxa in question would have proceeded, in the course of constructing their classifications, roughly along the lines of *greater overall similarity, ergo closer taxonomic relatedness*, to which Darwin added "by 'closer taxonomic relatedness' I think you mean more recent common ancestry." In any case, the beginning-to-end chain of observation and reasoning that goes from in-depth knowledge of comparative anatomy to a particular genealogical tree for a given set of taxa is something to which Darwin contributes, and on which many of his arguments rely.

Greater similarity, ergo more recent ancestry

Given Darwin's reliance on something like the inference form *greater similarity, ergo more recent ancestry*, and given that this inference form bears a resemblance to *similarity, ergo common ancestry*, one might reasonably worry that the former founders on the same epistemological objections raised above to *modus Darwin*. I should therefore briefly explain why it does not.

The first of those objections was that *modus Darwin* is inappropriately sensitive to how one models the space of possible character traits. Recall that the

could not share common ancestry. Darwin is therefore keen to emphasize the mechanisms and "accidental means" by which *prima facie* implausible journeys might have happened.

 12 A good candidate may be Darwin's closing comments on common ancestry (Darwin; 1859/2003, 484) where he suggests, on the grounds that all species share some basic chemical and cellular similarities, that there is just one original species from which *everything* evolved. But he concedes this a flimsy argument, and doesn't take it very seriously.

culprit is the quantity $p(obs. |SA)$. On the separate ancestry hypothesis a bigger space allows for more divergent starting states, making observations of large character state differences more probable. In contrast, the size of the space makes no difference to the probabilities assigned to observations by the common ancestry hypothesis—provided it is not so small that the species have already bumped into the endpoints—so there is no need to specify the size of the space beyond "bigger than what evolution has so far explored." The competing trees addressed by phylogenetic inference (Figure 4) all affirm common ancestry, and like $p(obs. | CA)$ the likelihoods $p(obs. |tree_i)$ can be calculated without having to postulate a concrete range of possible character states. (The calculations below employ a onedimensional anatomical space that is unbounded in both directions.)

The second objection was that *modus Darwin* depends on knowledge of branch lengths that was unavailable in Darwin's time. While branch lengths are a source of uncertainty in phylogenetic inference as well, there is an important sense in which that uncertainty is far less debilitating than in the case of *modus Darwin*. In the likelihood contest between CA and SA, simply stretching or shrinking all branches proportionally can change the direction of evidential favoring from one hypothesis to the other: an observation that appears to favor common ancestry instead favors separate ancestry if you double the time scale. The same is not true when comparing one tree to another, as some example calculations will illustrate. In what follows, I use the same understanding of character state evolution used in Sober's *modus Darwin* calculations, now implemented on the genealogies from Figure 4 rather than those from Figure 1.

The observation to which a tree assigns a probability is not a character state comparisons for a single species pair (as per *modus Darwin*), but rather a set of such comparisons, pairwise for every permutation of two species within the group of species under consideration. It is convenient to arrange the resulting numbers on a 2×2 table, where each cell shows the difference between the character states of the species associated with that row and column. Figure 6a shows such a table for the case of three species, and 6b shows one set of trait values that instantiates those character state differences.

FIGURE 6. (A) Example data for calculating likelihoods of phylogenetic trees, and (B) trait values that would generate those data.

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Using these numbers as an example, Figure 7 displays the probabilities $p(obs. |tree_i)$ for trees $1-3$ (Figure 4), over a very wide sweep of branch length assumptions.¹³ The important feature of Figure 7 is that the lines never cross, meaning that the ranking of hypotheses by likelihood is independent of branch length. This independence is a general feature of the inference problem, not specific to these example observations. Even very severe uncertainty about the overall timescale of evolution therefore does not undermine claims about the observations favoring one tree over another. (Though in the limit, the three likelihoods converge to the same value, meaning that evidence for one tree over another gradually weakens. See Sober and Steel (2014) for an in-depth look at this phenomenon.)

Figure 7. Likelihoods *p*(*obs.|treei*) for Figure 6a observations, over a range of branch lengths. (Equation 2 transition probabilities used throughout; scaling the transition probabilities with a fixed number of timesteps yields equivalent results.)

CONCLUSION

What is absolutely clear is that Darwin is eager to convince his readers of common ancestry, and that some of the *Origin* passages where he argues most pointedly for this conclusion involve talk of "similarity" or "resemblance." But the structure of the arguments can be somewhat opaque. Sober sees *similarity, ergo common*

¹³The quantity varied is the number of time steps from the root of the tree to any leaf (assumed equal along all three paths); the branching takes place after half this number of steps. (Selectively stretching only certain sections of a tree, on the other hand, can upend the likelihood rankings—a real issue in phylogenetic inference, as rates of evolution do vary over time and between lineages.)

ancestry at work in those arguments, and launches an investigation into the epistemology of the inference form and its relation to modern statistical inferences within evolutionary biology (Sober; 1999, 2008, 2011; Sober and Steel; 2002, 2014).

My aim here has been to review and assess the argument form *modus Darwin* and its role in Darwin's case for common ancestry in the *Origin*. I have argued that the probabilistic justification Sober offers for *modus Darwin* is inadequate. The basic form of that justification is of course sound (it is the foundation of both likelihoodist and Bayesian statistics): compare the probability of an observation supposing common ancestry were true with the same observation's probability supposing separate ancestry were true. But this is easier said than done. Sober picks an observation type and offers a recipe for calculating the two probabilities, but the recipe calls for some far-fetched ingredients. One of those is *branch length*, a perfectly legitimate scientific quantity that is routinely estimated with some confidence in modern molecular phylogenetics but not by Victorian naturalists. Another is the *range of possible character states*, a dubious notion that has no significance within evolutionary theory.

Sober's mathematical construction does provide a framework for investigating and rigorously evaluating *modus Darwin*. I have continued to use that framework here and it has enabled the present analysis. But for the reasons just rehearsed, that construction does not produce a statistical justification for *modus Darwin*—at least not in the nineteenth century context. None of this rules out the possibility of a statistically sensible defense of *similarity, ergo common ancestry*, but Sober's (informed and enlightening) attempt does not succeed.

In any case, it is far from clear that Darwin argued in that way. Closer inspection of the passages that motivate the attribution to Darwin reveal a different argument form, one familiar from contemporary phylogenetics: *greater similarity, ergo more recent ancestry*. This argument form is more defensible, both epistemically and exegetically, though it cannot replace *modus Darwin* as a self-contained argument for common ancestry—indeed it presupposes that conclusion. *Greater similarity, ergo more recent ancestry* describes just one step of reasoning, used by Darwin in constructing more complex arguments.

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