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31 ABSTRACT. As a form of adaptive plasticity that allows organisms to shift their phenotype 32 toward the optimum, learning is inherently a source of developmental bias. Learning may be 33 of particular significance to the evolutionary biology community because it allows animals to 34 generate adaptively biased novel behavior tuned to the environment and, through social 35 learning, to propagate behavioral traits to other individuals, also in an adaptively biased 36 manner. We describe several types of developmental bias manifest in learning, including an 37 adaptive bias, historical bias, origination bias and transmission bias, stressing that these can 38 influence evolutionary dynamics through generating nonrandom phenotypic variation and/or 39 nonrandom environmental states. Theoretical models and empirical data have established 40 that learning can impose direction on adaptive evolution, affect evolutionary rates (both 41 speeding up and slowing down responses to selection under different conditions), and 42 outcomes, influence the probability of populations reaching global optimum, and affect 43 evolvability. Learning is characterized by highly specific, path-dependent interactions with the 44 (social and physical) environment, often resulting in new phenotypic outcomes. 45 Consequently, learning regularly introduces novelty into phenotype space. These 46 considerations imply that learning may commonly generate plasticity first evolution.

47

48 **Keywords:** Learning, developmental bias, plasticity, plasticity first, evolvability

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50 **RESEARCH HIGHLIGHTS:** Learning is a major source of developmental bias in animals. Here we 51 review the different types of developmental bias manifest in learning, and show how these 52 influence evolutionary dynamics.

54 A central, largely unresolved, issue in the field of evolutionary biology is whether and how 55 developmental processes contribute to evolutionary change (Love 2015), and one much-56 discussed means by which development might do so is through generating a biased 57 distribution of phenotypic variation (i.e. 'developmental bias'; Maynard-Smith et al 1995; 58 Brakefield, 2006; Uller et al 2018). Perhaps some developmental biologists will not think of 59 learning as a 'developmental' process, as it is typically studied without consideration of 60 gastrulation, cell division or hox genes. However, if development is viewed broadly to 61 comprise all of the changes in size, shape, and function that take place during the life of an 62 organism, learning is unquestionably a developmental process. Viewed in this manner, any 63 biases in behavioral phenotypes that are generated through learning are a form of 64 developmental bias.

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This point takes on new significance once some well-documented properties of learning are recognized. What is immediately apparent to most students of animal learning, but perhaps less obvious to many other biologists, is that learning typically is a highly flexible form of adaptive plasticity that shifts many aspects of the phenotype towards the optimum. Also selfapparent is the fact that animals commonly learn knowledge and skills through observing and interacting with other animals, including other species, again with a strong tendency to acquire adaptive knowledge.

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74 In this article we describe how phenotypes generated through animal learning are generally 75 not just biased, but adaptively biased. Moreover, such phenotypes are not just manifest in a 76 single individual but commonly rapidly propagated to multiple individuals and, through social 77 transmission, passed on to descendants. We also review the evidence that novel phenotypes 78 propagated through learning can impact genetic evolution. Here we set out to present the 79 evidence, both experimental and theoretical, that leads us to the view that learning should 80 be regarded as an important source of developmental bias in animals, and a profound 81 influence on adaptive evolution.

82

83 **DEFINITIONS**

84 What is developmental bias?

85 The term 'developmental bias', as commonly deployed, is somewhat ambiguous because it is

86 manifestly subject to two distinct readings: Is it the products of development that are biased 87 (i.e. are a biased set of phenotypic variants generated)? Or are developmental processes 88 biasing something else – most obviously, the course of evolution? While the most evident 89 way in which developmental processes can bias the course of evolution is through biasing 90 phenotypic variation, in principle, these two readings can be disassociated. Biased phenotypic 91 variation need not affect the course of evolution (e.g. if dynamics are dominated by 92 selection), whilst developmental processes could affect the course of evolution even if 93 phenotypic variation were isotropic (e.g. through nonrandom modification of selective 94 environments). We suspect that usage of the term slips between these two meanings, with 95 users perhaps sometimes unaware of the inherent ambiguity, and frequently committed to 96 both interpretations. This slippage may partly account for the diversity of usage of this term.

97 One way of resolving the ambiguity is to distinguish between the two usages explicitly: 98 that is, distinguishing between a biased product of development (henceforth 99 'developmentally biased phenotypic variation'), and a biasing process of development 100 ('developmentally biased evolutionary process'). This approach has proven useful in helping 101 to clarify a similar ambiguity in the use of the term 'innovation' (Reader & Laland, 2003).

102 To characterize the process or the product of development as 'biased' we must have 103 some notion of what an unbiased product/process would look like. Hence, ideally a definition 104 of developmental bias would state relative to what baseline the bias arises. Here, following 105 Uller et al (2018, p949), we define developmentally biased phenotypic variation as 'the bias 106 imposed on the distribution of phenotypic variation, arising from the structure, character, 107 composition, or dynamics of the developmental system, relative to the assumption of isotropic 108 variation'. We also define a developmentally biased evolutionary process as 'any bias in the 109 rate, dynamics and pattern of evolution arising from the production of nonrandom phenotypic 110 variation (broadly construed), relative to the expected rate, dynamics and pattern of evolution 111 arising from random genetic variation.'

We introduce the qualification 'broadly construed' as our use of this term will encompass cases in which organisms express their nonrandom (extended) phenotypic variation in the external environment, for instance through building nests, burrows, mounds, webs, and pupal cases, or modifying local soils, hydrology, chemistry, nutrients, or flows (i.e. niche construction), and which thereby bias the sources of selection that they, and other ecologically interacting populations, experience (Odling-Smee et al, 2003; Laland et al., in

118 press).

119 In this article, we are interested in both the specific form of developmentally biased 120 phenotypic variation that arises from animal learning, and in its evolutionary consequences. 121 We suggest that the forms of bias that result from learning are of relevance to the 122 evolutionary biology community because, (1) through learning, animals tune their behavior 123 to environments, including novel environments, by selectively generating, retaining and 124 refining adaptive behaviors more readily than non-adaptive ones. Moreover, (2) these 125 adaptive novel phenotypic variants are commonly propagated to other individuals, including 126 nonrelatives, and across generations, through social learning. This social transmission of 127 behavior is a second source of bias towards the propagation of adaptive variants – evidence 128 from diverse species of animals demonstrates that the likelihood of social transmission of 129 novel learned knowledge and skills is significantly higher for adaptive than for non-adaptive 130 behavioral variants. In addition, (3) learned and socially transmitted behavior can bring about 131 consistent changes in the social and ecological environments, thereby biasing the selective 132 environment of both the learner and of other species that experience modified conditions 133 (i.e. niche construction). We submit that by generating and propagating novel phenotypes 134 that are *adaptive* (i.e. nonrandom with respect to fitness), and modifying selective 135 environments in reliable ways, animal learning biases the course of evolution. We go on to 136 make further distinctions between different types of developmental bias manifest in, and 137 resulting from, learning (Table 1).

138

139 What is animal learning?

Learning is generally defined as a relatively permanent change in behavior (or potential behavior) that results from experience (Dickinson 1981; Rescorla, 1988; Kirkpatrick & Hall, 2004). Central to definitions of learning is the requirement that there must be a memory trace of what has been learned, allowing the animal on subsequent occasions to recall or do what they have learned previously. Transient changes, such as reflexes, do not qualify. Learning is usually inferred from changes in observable behavior, but is not always immediately manifest, and can be stored to influence future performance.

147 There are many forms of learning (Kirkpatrick & Hall, 2004; Staddon 2016). Animals 148 may learn about a single event through habituation or sensitization, or form associations 149 between events, which includes 'classical' (a.k.a. 'Pavlovian') and 'operant' (a.k.a.

150 'instrumental') conditioning. The latter is of most interest here, as it is thought to be the 151 primary means by which animals acquire behaviour (Staddon, 2016). This kind of learning 152 occurs through reinforcement, in which positive or negative experiences provide animals with 153 a mechanism for the selection of appropriate behavior. Actions that bring about positive 154 consequences (e.g. finding food, avoiding danger) are more likely to be performed in the 155 future, whilst those with negative consequences (causing pain, missing out on reward) 156 become less likely. Such actions occur in a particular context, or in response to a particular 157 cue, and the learning that takes place is described as 'associative' because the animal learns 158 to produce the action in response to the cue (i.e. stimulus-response learning) or else learns 159 that the action has a particular consequence (i.e. response-reinforcement learning).

160 That animals learn through operant conditioning has been known for a long time 161 (Thorndike, 1898) and has been demonstrated in so many species, including countless 162 invertebrates, that it is commonly regarded as virtually universal across animals. Skinner 163 (1938) stressed three general features of animal learning: (i) animals are frequently active, 164 and hence are continuously emitting behavior; (ii) these emitted behavior patterns frequently 165 have consequences that influence the frequency with which the behavior is repeated in the 166 future; and (iii) the effects of the consequences are influenced by the animal's motivational 167 state, as well as by the physical and social environment. The first of these is rarely 168 emphasized, but important. Learned behavior is often the result of an exploratory search 169 conducted over multiple trials, through which individuals hone their behavior to exploit their 170 environment. This exploratory component to learning is significant, because it generates 171 behavioral flexibility and variability. There is seemingly no end to the associations that many 172 animals could form.

173 In their natural environment, animals frequently learn from other individuals. In this 174 manner, animals rapidly acquire skills and functional information concerning what to eat, 175 where to find it, how to process it, pathways to take through their environment, what a 176 predator looks like, how to escape the predator, calls, songs, and more (Hoppitt & Laland, 177 2013). Social learning is defined as *learning that is facilitated by observation of, or interaction* 178 with, another individual or its products (Heyes 1994; Hoppitt & Laland 2013). It is also 179 widespread amongst animals, including invertebrates, and even in species described as 180 'solitary' (Wilkinson et al, 2010). Theoretical analyses and experimental studies both strongly 181 suggest that social learning is more efficient than individuals learning alone, for instance,

182 through trial-and-error (Rendell et al, 2010; Hoppitt & Laland, 2013). That is because when 183 animals learn socially, the aforementioned 'exploratory search' is effectively expanded to 184 encompass the trials and associated experiences of multiple individuals. Social learning is 185 particularly valuable in helping animals to solve difficult problems where the optimal action 186 is one of many possible actions, or when a long sequence of actions is required to be 187 performed in the correct order to elicit the reward (Whalen et al, 2015). If finding the optimal 188 behavior is like searching for a needle in a haystack, then learning is as if someone tells you 189 when you are getting close (Hinton & Nowlan, 1987; Maynard Smith 1987); social learning is 190 when someone actually shows you where to look.

191 Social learning occurs throughout the lifespan, and from many different individuals, 192 and thereby allows for the propagation of phenotypic variants amongst unrelated individuals, 193 often within timespans significantly shorter than a generation (e.g. social transmission of 194 predator recognition in minnows, *Pimphales promelas;* Chivers & Smith 1995; socially learned 195 mating preferences in grouse, Centrocercus urophasianus; Gibson et al, 1991). Socially 196 transmitted activities (e.g. foraging) can modify ecological circumstances, sometimes in ways 197 that feed back to impact natural selection (niche construction). Social learning generates an 198 additional mechanism of inheritance operating parallel to genes 'cultural inheritance') 199 (Hoppitt & Laland 2013; Whiten et al. 2017).

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201 BIASES IN PHENOTYPIC VARIATION ARISING FROM ANIMAL LEARNING

This section focuses on developmentally biased phenotypic variation resulting from animallearning.

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205 Biases arising from individual learning

206 Experimental research in a very large number of species of animals provides compelling 207 evidence that learning typically increases the rate of reinforcement, and reduces the rate of 208 punishment, experienced by animals (Dickinson 1980; Kamil, 1983; Kirkpatrick & Hall, 2004; 209 Staddon, 2007, 2016). Faced with multiple potential food sites, an animal will typically sample 210 the alternatives and choose the option yielding the highest return. The decision made, the 211 amount of sampling, the number of times the animal performs the action (e.g. if on a 'fixed-212 reinforcement schedule'), the timing of the performance (e.g. when on an 'interval 213 schedule'), and other parameters, have all been reliably shown to improve over trials with 214 relevant experience (Krebs et al, 1978; Dickinson 1980; Kamil, 1983; Kirkpatrick & Hall, 2004;
215 Staddon, 2016). Similar findings apply to learning to avoid threats.

This kind of associative learning is widespread and has general properties that allow animals to learn about the causal relationships among a wide variety of events (Dickinson, 1980; Mackintosh, 1974). Learning can occur through quite simple rules. One example is the theory known as the *Rescorla–Wagner rule*, which describes updates in knowledge as a linear combination of current knowledge and new information. It has proved useful in explaining the results of experiments on foraging in honeybees, avoidance conditioning in goldfish, and inferential reasoning in humans (Rescorla & Wagner, 1972).

223 Thirty years ago, inspired by optimal foraging theory (Stephens & Krebs, 1986), there 224 was extensive theoretical interest in the idea that learned behavior might maximize the rate 225 of reinforcement, and thereby generate optimal behavior (Kamil, 1983; Staddon, 2007). That 226 particular research agenda met only partial success (Staddon, 2007): animals were found to 227 learn optimally only under restricted conditions, with their behavior often following 228 mechanical rules that seemingly evolved to produce close-to-optimal behavior only under 229 natural conditions encountered by the species during its evolutionary history. Yet this does 230 not undermine the general conclusion that the learned behavior of animals is typically 231 adaptive, and that reinforcement learning generally shifts behavior towards the optimum. 232 Learning is adaptive precisely because animals have been fashioned by evolution actively to 233 seek out high-fitness behavioral outcomes, and to forestall activities that might negatively 234 impact their survival and reproduction (Pulliam & Dunford 1980; Staddon 2016).

235 Skinner's (1953) bold claim that "reinforcement shapes behavior as a sculptor shapes 236 a lump of clay" somewhat exaggerates the power of reward and punishment to influence 237 behavior. In practice, evolved predispositions bias what learning takes place (a.k.a. 238 'constraints on learning'; Hinde & Stephenson-Hinde, 1973). Garcia and Koelling (1966) 239 famously gave rats food and then radiation that made them sick. The rats tended 240 subsequently to avoid food with that taste or smell, but struggled to learn an association 241 between other characteristics of the food and sickness, and were extremely slow to learn that 242 a sound or light predicts illness. From an evolutionary perspective, this makes sense, as 243 sickness generally results from eating rather than from noises or lights and taste is a reliable 244 indicator of a food's nature. Likewise, Mineka and Cook (1988) demonstrated that laboratory-245 reared, juvenile rhesus monkeys exhibit fear responses to snakes only after watching adults

246 respond fearfully to snakes. The monkeys failed to acquire fear responses to either a toy 247 rabbit or flowers after watching video sequences of conspecifics appearing to behave fearfully 248 toward them, but such video presentations were sufficient to induce fear of snake-like stimuli. 249 Interestingly, an earlier study had found that these monkeys could be socially conditioned to 250 fear other arbitrary stimuli (kitchen utensils) (Stephenson 1967). A similar study of blackbirds, 251 which learn to recognize predators through attending to the mobbing behavior of 252 conspecifics, also found that they could be conditioned to acquire a fear of arbitrary objects, 253 in this case, plastic bottles, in this manner (Vieth et al., 1980; Curio, 1988). Seemingly, the 254 monkeys have evolved a perceptual bias that enhances the salience of snake-shaped stimuli, 255 making it easier for them to learn about snakes than flowerpots, but not precluding their 256 acquiring fears of novel stimuli through observational conditioning. In comparison, the 257 blackbirds do not yet seem to have evolved this kind of perceptual bias. The adaptive value 258 of an observational-conditioning mechanism, whereby animals learn to be fearful of objects 259 or events that conspecifics fear, is easy to envisage. Sensitivity to persistent threats (e.g. 260 snakes, in the case of monkeys) can be heightened through natural selection up-regulating 261 the salience of such stimuli, yet the general observational-conditioning mechanism allows the 262 animal to learn about novel threats with rapidity and flexibility.

263 These data suggest that learned behavior is neither always optimal, nor infinitely 264 malleable through reinforcement. Animal learning typically begins with an exploratory search 265 or sampling procedure, and the initial trials may not be biased towards adaptive decisions 266 (e.g. in which direction to search of food, or which food patch to try first). However, after a 267 small number of trials the animal's behavior will adjust to the patterns of reinforcement 268 encountered. The final form of the behavior, after repeated trials, is generally highly adaptive 269 (foraging efficiency is enhanced, the best food patch is selected, dangers are avoided, and so 270 forth) (Staddon, 2016). This generic shift towards adaptive or optimal behavior as a 271 consequence of reinforcement learning we label here an *adaptive bias* (see Table 1).

Learning may generally be adaptive but it is not universally optimal. Evolved predispositions themselves bias the learning process, a phenomenon that we refer to as an *historical bias* (see Table 1). Seemingly, animals have been tuned by their evolutionary history to form some associations more readily than others, or to perform particular actions in particular contexts. Apparently, ancestral natural selection has fashioned dedicated learning predispositions or motivational priorities tailored to the particular ecological circumstances

of each species. However, the generality of the observed mechanisms of learning imply that the observed species-specificity is better regarded as selection tinkering with a general system than as selection constructing an independent set of species-specific learning processes (Bolhuis & MacPhail, 2001). *What* an animal learns may vary adaptively between species, but *how* animals learn appears to be broadly similar across diverse taxa (Shettleworth, 2000).

284 Nonetheless, the aforementioned literature also makes it clear that historical biases 285 exert a *probabilistic* influence on learning and are rarely hard or prohibitive constraints. This 286 is because learning by definition results from historically contingent experiences, which often 287 depend on complex interactions between many environmental factors. For example, why an 288 animal learns to forage on one specific food type instead of another may be because of the 289 idiosyncratic sequence of food items it encountered during earlier decision-making episodes. 290 Such contingencies could not have been predicted at the outset of its development because 291 of chance events experienced, the recursive interactions between learning on many 292 environmental factors, and decision-making based upon the knowledge of other individuals 293 in the local environment. This contrasts with many other sources of phenotypic plasticity that 294 can more satisfactorily be characterized as reaction norms to an environmental factor (but 295 see Sultan, forthcoming). On the one hand, this means that the existence of evolutionary 296 biases on learning cannot always prevent the coincidental development of non-adaptive 297 behavior, even under normal environmental conditions. On the other hand, it means that 298 evolutionary biases do not preclude the acquisition of entirely novel and yet adaptively biased 299 behavior, one consequence of which is that learning is a major source of behavioral 300 innovation.

301 Through learning, for instance, how to discover and exploit new foods, or devising 302 novel means to escape or avoid a threat, animals can introduce new behavior into the 303 population's repertoire. Such instances are labeled *behavioral innovations*, defined by Reader 304 & Laland, (2003, p 14) as new or modified learned behavior not previously found in the 305 *population*. Innovations are novel functional solutions tailored to new challenges or hitherto 306 unexploited opportunities. Not all cases of learning result in innovation, since animals 307 frequently learn associations that other members of their population have learned previously. 308 However, behavioral innovation, as currently generally understood, requires learning, since 309 otherwise innovation could not be distinguished from exploration, or from any idiosyncratic

310 or accidental behavior (Reader & Laland, 2003). Learned behavioral innovation is now 311 extensively documented in animals (Reader & Laland, 2003; Reader et al, 2016). Examples 312 include killdeer feeding on live frogs (a novel food item; Scharsien & Jackson, 1982), 313 Northwestern crows fishing for sand eels by digging in the sand at low tide (i.e. inventing 314 novel foraging technique; Robinette & Ha, 1997), and New Caledonian crows crafting hooked 315 tools for foraging (e.g. devising novel tools; St Clair et al. 2018). Learned behavioral 316 innovations are thus novel phenotypes – traits not previously observed in the lineage. 317 However, while analogous to genetic mutation in the respect that they introduce novel 318 variation, as the above examples highlight, behavioral innovations are usually not random but 319 exhibit an adaptive bias (Snell-Rood et al, 2018).

320 Innovations may also exhibit historical biases. Perhaps the most famous example of 321 an animal innovation is the invention of the habit of washing sweet potatoes in water by 322 Japanese macaques (Kawai, 1965). Subsequent research established that food washing is 323 common in several species of macaques, which means that this particular innovation involved 324 the application of an established behavior to a novel food (Reader & Laland, 2003). In fact, 325 many animal innovations fall into this category of established behavior applied in a novel 326 context, or to a novel stimulus (Reader & Laland, 2003; Reader et al, 2016). Behavioural 327 innovation through learning commonly allows the generalization or new application of a 328 behavioral phenotype to novel environments or contexts, as well as the *de novo* invention of 329 novel solutions. There is a lot of interest currently in whether organisms adapt to the rapidly 330 changing world, and the role that plasticity plays in this (Snell-Rood et al, 2018; Fox et al, 331 2019), but few articles in a recent special edition on this topic (Fox et al, 2019) even mention 332 learning. Nonetheless, this community have stressed how the processes of plasticity and 333 adaptation, traditionally considered independently of each other, need to be viewed 334 synergistically (Fox et al, 2019). Greater attention to how animals adjust to novel 335 environments through learning is surely merited.

Additionally, unlike genetic mutations, which generally occur equally likely across all members of the population, behavioral innovations may be significantly more likely to arise amongst particular classes of individuals in the population. For instance, inexperienced individuals may be more likely to try novel behaviors, as in several large migratory bird species

340 where juveniles exhibit more variation in migratory routes than older individuals (Mueller et 341 al., 2013; Oppel et al., 2015; Vansteelant et al., 2017), particularly when there are few 342 experienced adults in the population (Mueller et al., 2013; Oppel et al., 2015). Although 343 juveniles suffer from higher mortality, they are thought to be more likely to discover novel 344 adaptive routes. Conversely, amongst nonhuman primates, the inventors of novel behavior 345 are usually more likely to be older, experienced individuals than youngsters (Reader & Laland, 346 2001; Kendal et al, 2005), and more commonly low-ranking than dominants (Reader & Laland, 347 2001). We characterize these patterns as manifestations of another type of developmental 348 bias, which we call an *origination bias*, since they exhibit a bias in where the innovation will 349 originate (see Table 1).

350

351 Biases arising from social learning

352 Animals frequently acquire knowledge and skills from conspecifics and heterospecifics, 353 including adopting innovations devised by others. Here, the mechanism of transmission can 354 influence the frequency of phenotypic variants in the next generation. This contrasts with the 355 genetic inheritance system that follows the Hardy-Weinberg principle, implying that the 356 mechanism of genetic transmission does not by itself cause changes in allele frequencies and, 357 by implication, the frequency distribution of phenotypes. There are many mechanisms that 358 cause exceptions to this principle, such as inter-species hybridization and the presence of 359 standing genetic variation. This is important for evolution, because these processes can bias 360 novel phenotypic variation towards adaptive variants (e.g. Rieseberg et al., 2003; Seehausen, 361 2014; Lai et al., 2019). Social learning is rarely considered in this context, perhaps because it 362 is not expected to cause differences between alleles in the probability that they are being 363 passed on to the offspring; it nonetheless clearly *does* affect the frequency distribution of 364 phenotypes, and typically will do so in adaptive ways. Moreover, it also provides a mechanism 365 for the inheritance of these phenotypes across generations.

Typically, animals do not copy at random, nor at all conceivable opportunities, nor simply copy the first individual that they see (Coussi-Korbel & Fragaszy, 1995; Laland, 2004). Rather, animals copy highly selectively, deploying *social learning strategies*, which are *transmission biases* in copying (Boyd & Richerson, 1985; Henrich & McElreath, 2003, see Table 1). There are well-documented tendencies of animals to copy successful individuals and highpayoff behaviour preferentially, to conform to the majority behavior (known to be adaptive

in spatially variable environments; Boyd & Richerson, 1985), and also to copy more when
uncertain or when learning asocially would be costly or difficult (Laland, 2004; Rendell et al
2011; Kendal et al., 2018). Strategic copying is a general feature of animal social learning,
whilst random copying is a comparatively rare special case (Hoppitt & Laland, 2013). Almost
all animal (including human) social learning is subject to a transmission bias.

377 Extensive experimental evidence has accumulated showing that animals exhibit a 378 range of non-random copying strategies, often causing a transmission bias towards the more 379 adaptive trait variants (Rendell et al. 2011; Kendal et al., 2018). A prime example is success-380 biased copying. For instance, red knots are more likely to join groups of foraging conspecifics 381 that are successful at obtaining food (Bijleveld *et al.* 2015), whilst red-winged blackbirds copy 382 feeding conspecifics except when they exhibit an aversive reaction to the food (Mason & 383 Reidinger 1982). Animals may also have a copying bias towards demonstrators that are more 384 likely to be successful. For example, young female guppies have a preference for older over 385 younger female models during mate-choice copying (Amlacher & Dugatkin 2005). Similarly, 386 nine-spined sticklebacks can monitor the foraging success of other fish through observation 387 and subsequently select the richer of the alternative food patches, a mechanism that allows 388 them to converge on the optimum (Coolen et al, 2003; Kendal et al., 2009). Whether animals 389 copy, and whom they copy, can depend on their relative state of knowledge. For example, 390 less-experienced pigeons are more likely to follow more-experienced pigeons than vice versa 391 (Flack et al. 2012). Bats that are unsuccessful at locating food alone follow previously 392 successful bats to feeding sites, using cues indicative of recent feeding, such as defecation 393 (Wilkinson, 1992). Insects and birds too are known to copy the nest-site decisions of 394 successful conspecifics and heterospecifics (Sarin & Dukas, 2009; Pasqualone & Davis, 2011; 395 Seppanen et al 2011; Forsman & Seppanen, 2011). One consequence of the existence of these 396 transmission biases is that learned information does not spread randomly, but along specified 397 (i.e. biased) pathways.

A second source of transmission bias in social learning stems from the fact that the learned traits an individual exhibits (unlike the individual's genes) are modified during the course of its development through experience. The net consequence is that the set of behavior patterns performed, and hence available to other individuals to copy, is not a random set but rather a biased set of high-performance, high-payoff behaviors. This mechanism leads to 'adaptive filtering' (Enquist & Ghirlanda 2007), and a transmission bias

404 to propagate adaptive knowledge. This adaptive bias associated with socially learned 405 information was demonstrated by Rendell et al (2010), who found that social learning was 406 highly adaptive under normal circumstances, where demonstrators chose to perform the 407 highest-payoff option in their repertoire. But when the adaptive filtering of demonstrators 408 was artificially switched off, such that demonstrators drew from their repertoire at random, 409 social learning was no longer advantageous.

410 Teaching (i.e. behavior that functions to facilitate learning in another individual; 411 Hoppitt et al 2008; Thornton & Raihani, 2010) is a third source of transmission bias. While 412 social learning is widespread amongst animals, teaching is rarer. Nonetheless, there is 413 evidence for teaching in a small number of species, including some ants, bees, birds and 414 meerkats, with other plausible but not yet experimentally demonstrated cases (Hoppitt et al 415 2008). Theory shows that it is only worth investing in teaching (by definition, a costly means 416 of information donation) if the adaptive advantage of the trait is large (Fogarty et al, 2011). 417 This conclusion is supported by experimental data. For example, honeybees actively 418 communicate potential nesting sites to the colony in autumn, but only after they have 419 decided that the nesting site is of appropriate quality (Seeley 1977; Seeley & Buhrman 2001). 420 As a consequence, the more adaptive behavioral choice is more readily transmitted through 421 the colony.

422 Transmission biases on the part of the receiver, adaptive filtering by the information 423 transmitter, and teaching combine to reinforce the adaptive bias generated through asocial 424 learning. They ensure that 'good information' (supporting fitness-enhancing behavior) is far 425 more likely to be propagated than 'bad information'. Social learning is applied flexibly, 426 encompassing learning from both conspecifics and heterospecifics, which means that animals 427 are not restricted to learning solely about those environmental features previously 428 encountered by their lineage (e.g. established predators or foods). Animals can also learn 429 about entirely novel stimuli or events, and devise appropriate responses to them (e.g. birds 430 learn to evade a novel predator; Davies & Welbergen, 2009; Thorogood & Davies, 2012). In 431 addition, learning can also generate opportunities for phenotypic change in the absence of 432 any immediate environmental change or stressor (such as when orangutans, Pongo 433 pygmaeus, proactively devise new food-processing techniques, social learning allows others 434 to access hitherto-unexploited foods, in this case palm heart; Russon, 2003). Thus, through

435 learning, animals can generate adaptive responses to conditions without the prior evolution436 of dedicated traits with suitable reaction norms.

Various biases in the distribution of phenotypic variation that result from animal learning are summarized in Table 1, together with illustrative examples. These terms are neither mutually exclusive (for instance, historical, origin and transmission biases will also often be adaptive) nor is our classification designed to be exhaustive (plausibly, biases may exist that do not fit any of the categories in Table 1).

Table 1 about here

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446 THE EVOLUTIONARY CONSEQUENCES OF BIASED VARIATION ARISING THROUGH LEARNING

447 Thus far, our focus has been on the learning processes responsible for the generation of 448 biased phenotypic variation. In this section, we move on to consider the evolutionary 449 consequences of biased variation arising through learning. We show that the production of 450 nonrandom phenotypic through animal learning causes biases in the rate, dynamics and 451 pattern of evolution (i.e. triggers developmentally biased evolutionary processes). In fact, 452 learning can influence evolutionary processes in at least two separate ways: either through 453 generating some phenotypic forms more readily than others (a variational bias) or through 454 generating some environmental states more readily than others (a selective bias, a.k.a. 'niche 455 construction').

456

457 *Learning affects evolutionary rates*

458 Theoretical work has established that learning can both speed up and slow down genetic 459 evolution (Cavalli-Sforza & Feldman 1981; Boyd & Richerson 1985; Ancel 2000; Borenstein et 460 al. 2006), consistent with the role of phenotypic plasticity in both driving and inhibiting 461 genetic evolution (e.g. Chevin et al., 2010; Edelaar et al., 2017; Ghalambor et al., 2007; Price 462 at al., 2003). Learning has an advantageous effect on adaptation in relatively quickly changing 463 environments, allowing individuals to acclimate to changes that cannot be tracked by 464 selection of genes (Cavalli-Sforza & Feldman 1981; Boyd & Richerson 1985; Todd 1991; Aoki 465 & Feldman, 2014). The benefits of learning in stationary or slowly changing environments are 466 more complex. Hinton and Nowlan (1987) suggested that learning could accelerate evolution 467 in a static environment by helping genotypes to locate otherwise difficult-to-find fitness 468 peaks. However, learning can also weaken selection by reducing phenotypic differences 469 between genotypes (Anderson 1995; Ancel 2000; Frank 2011). These seemingly conflicting 470 results follow from different theoretical assumptions (Borenstein et al. 2006; Paenke et al. 471 2007; Frank 2011). The emerging consensus is that individual learning typically slows 472 evolution in static unimodal fitness landscapes, but typically accelerates evolution in dynamic 473 or static multimodal fitness landscapes. In the latter case, the existence of multiple optima 474 usually slows down evolution as populations get trapped on suboptimal fitness peaks. By 475 generating adaptive variation and thereby smoothing the fitness landscape, learning 476 increases the likelihood of a directly increasing path of fitness to the global optimum 477 (Borenstein et al. 2006; Mills and Watson 2006; Frank 2011).

478 Learning can generate 'plasticity first' evolution

479 The 'plasticity first hypothesis' is "a mechanism of adaptive evolution in which environmental 480 perturbation leads, via phenotypic plasticity, to ... a novel developmental variant (i.e., trait) 481 that ... is subsequently refined through 'genetic accommodation'" (Levis & Pfennig, 2016, 482 p564). Here, 'genetic accommodation' means the refinement or stabilization of the trait 483 through selection of underlying genetic variation. Where learning accelerates evolution, 484 phenotypic change (a.k.a. 'phenotypic accommodation') precedes, and then facilitates, 485 genetic adaptation by modifying selection on genetic variation (West-Eberhard, 2003; Levis 486 & Pfennig, 2016). Conversely, when sources of learning are reliably present (e.g. the 487 availability of a parent when a chick hatches), social learning can buffer selection on genetic 488 variation that would otherwise lead to genetic adaptation, as selection cannot favor a trait 489 that compensates for the loss of developmental input that is reliably present (Griffiths 2002). 490 However, in many cases this buffering will not be perfect, and hence will not preclude 491 selection of alleles that increase the probability of producing, or the performance of, the 492 learned phenotype, a form of genetic accommodation known as 'genetic assimilation' (West-493 Eberhard, 2003). Indeed, (particularly stochastic) learning can facilitate genetic adaptation 494 through producing adaptively biased phenotypic variation that changes the selection on 495 genotypes (Borenstein et al. 2006).

496 There is empirical evidence that learning can generate plasticity first evolution 497 (Whitehead et al, 2019). For instance, killer whale (*Orcinus orca*) populations exhibit culturally

498 transmitted specializations on particular prey resources (e.g. fish, dolphins, pinnipeds). These 499 dietary traditions have favored population-specific genes influencing morphology and 500 digestion, giving rise to different killer whale "ecotypes" (Foote et al., 2016; Hoelzel & Moura, 501 2016). Population-genomic studies confirm that these lineages have diverged genetically, and 502 that functional genes associated with digestion differ between ecotypes, suggesting that this 503 is an instance of genetic assimilation (Foote et al., 2016; Hoelzel & Moura, 2016). Seemingly, 504 the ecotypes arose through culturally mediated specialization in matrilineal groups, which 505 later developed reproductive barriers (Riesch et al 2012). Here, learning and social 506 transmission appears to have triggered the evolution of multiple lineages considered to be 507 undergoing speciation, influencing the direction of adaptive evolution.

508 Social learning can also trigger genetic adaptation in other traits (Whitehead et al, 509 2019). For instance, in some fruit flies, fishes, birds and mammals, the choice of mating 510 partner is influenced by the mate-choice decisions of other individuals (mate-choice copying). 511 This propagates mating preferences over short periods, such as a season, yet experimental 512 data and population-genetic models demonstrate that it can strongly influence the sexual 513 selection of male traits (Gibson et al., 1991; Kirkpatrick & Dugatkin, 1994; Nöbel et al., 2018). 514 Birdsong provides another illustration of how animal culture can be consequential for genetic 515 evolution, affecting patterns of migration and assortative mating, and facilitating speciation 516 (Beltman et al, 2003; Lachman & Slater 1999). There is evidence for reed warbler learning 517 driving the evolution of plumage patterns in cuckoos (Davies & Welbergen, 2009; Thorogood 518 & Davies, 2012), and for social learning reducing genetic diversity in socially structured whale 519 populations (Whitehead, 1998). Finally, extensive empirical evidence now implicates learning 520 in mate choice, sexual selection, and reproductive isolation, where experimental studies 521 clearly show that learning imposes biases on signal evolution (ten Cate & Rowe, 2007; 522 Verzijden et al., 2012). Hence, the theoretical expectation of genetic accommodation and 523 genetic assimilation in response to animal learning is supported by a small and growing 524 number of studies.

In these examples, learning is not just changing the rate of evolution but co-directing the outcome. It was the culturally transmitted dietary tradition of each killer whale population that caused the natural selection of genes for a morphology and digestive physiology that matches their learned dietary habits. Similar points can be made with respect to the mate choice, bird song, and plumage evolution examples.

530 Learning can also modify natural selection and trigger plasticity first evolution through 531 bringing about physical changes in environments, or through learned habitat choice. Over the 532 past 50,000 years, humans have spread from Africa around the globe, begun to exploit 533 agriculture, witnessed rapid increases in densities as a direct consequence, domesticated 534 hundreds of species of plants and animals and, by keeping animals, experienced a new 535 proximity to animal pathogens. Each of these events represents a major transformation in 536 human selection pressures, recognized though substantive genetic change in human 537 populations, and each is a self-induced change in environmental conditions (Laland et al, 538 2010). Humans have modified selection through their learning and culture, for instance by 539 dispersing into new environments with different climatic regimes, by devising agricultural 540 practices or domesticating livestock, and causing extinctions and dramatic shifts in 541 community structure (Boivin et al, 2016). It is now well-established that dairy farming created 542 the selection pressure that led to the spread of alleles for adult lactase persistence (Gerbault 543 et al, 2011). Similarly, agricultural practices, such as cultivating yams, appear to have 544 inadvertently promoted the spread of malaria in some West African populations, leading to 545 the selection of the HbS allele which confers some resistance to malaria in the heterozygote 546 form, but leads to Sickle-cell anaemia in homozygotes (Durham, 1991). The same practices 547 appear also to have favored high copy number of the salivary amylase (AMY1) gene that 548 facilitate the breakdown of the excess starch in agricultural diets (Perry et al, 2007). Again, 549 such examples illustrate how learning can affect evolutionary outcomes, and not just rates. 550 Producing and consuming milk and alcohol has selected for alleles for adult lactose absorption 551 and alcohol dehydrogenase, whilst the agricultural practices that led to greater consumption 552 of starch, protein, lipids and phosphate have selected for alleles that metabolize these foods 553 (Laland et al 2010). Given that both niche construction and learning are ubiquitous in animals, 554 it would seem highly likely that the learned environmental modification of other animals has 555 similar consequences, although well-researched examples are rare.

Learned human activities are also driving evolutionary responses in other animals. Recent studies have demonstrated strong phenotypic changes in organisms in response to urban and other anthropogenic environments, ranging from supplemental feeding affecting beak shape in garden birds, to earthworms and insects evolving tolerance of pollutants (Palkovacs et al, 2012; Alberti, 2015; Alberti et al, 2017; Sullivan et al, 2017). Anthropogenic change studies suggest plasticity is important to evolutionary responses (Snell-Rood et al, 562 2018; Fox et al, 2019), and the field could benefit from greater consideration of the role 563 played by animal learning in these adaptive responses.

564

565 Learning can generate 'adaptation' without natural selection

It is often claimed that natural selection is the only process that can systematically lead to increments in fitness across generations, but adaptive evolution can also result from phenotypic plasticity, habitat choice and niche construction (Edelaar & Bolnick, 2019). This is an important point, since it is widely, and mistakenly, believed that incremental improvements in a trait over generations, with corresponding enhancements in fitness, can only arise through the natural selection of genetic variation.

572 Experimental evidence reveals that social learning (a form of adaptive phenotypic 573 plasticity) can cause offspring fitness to be higher than that of their parents, even in novel 574 habitats. This is, at least to some extent, recognized for humans where, for example, 575 agricultural advances (irrigation methods, fertilizers, breeding programs, insecticides, etc) 576 have repeatedly underpinned population growth (i.e. increased absolute fitness). However, 577 evidence is starting to emerge for similar processes operating in other animals. For instance, 578 Jesmer et al (2018) showed that bighorn sheep and moose adjust to novel environments in 579 the course of several generations, through a process of learning and cultural transmission. 580 These animals generally migrate through exploiting the high-quality forage manifest in 581 "green-wave surfing" (van der Graaf et al. 2006), which requires possessing the requisite 582 knowledge of where and when to find high-quality food; a typical needle-in-a-haystack 583 problem. The study shows that after translocation to a novel environment, the animals do 584 not show their typical migratory behavior. Apparently, past natural selection did not enable 585 individuals to find the optimal foraging strategy in a single lifetime. Rather, the study shows 586 an iterative increase over generations in the fraction of translocated populations that 587 migrate, and that – due to these movements – their whereabouts increasingly overlaps with 588 the phenology of suitable habitat. The bighorn sheep acquire and accumulate this 589 'adaptation' to a novel habitat not through natural selection of genes, but through learning. 590 Seemingly, individual learning allows each generation to exploit high-quality forage more 591 effectively than their parental generation, and social learning allows these iterative 592 improvements to be transmitted to the rest of the group, including the next generation. Here

improvements in the adaptive fit between individuals and their environment accumulate overgenerations.

595 The semi-natural experiment of translocated sheep is unique in its temporal and 596 spatial scale, but similar processes likely operate widely. Sasaki & Biro (2017) demonstrate 597 the process of incremental increase in movement efficiency (which in the wild should 598 correlate with fitness) amongst gps-tagged homing pigeons, which arises through 'cumulative 599 culture'. Similarly, sticklebacks have been found to exhibit a hill-climbing learning strategy of 600 selectively adopting the food-patch choices of fish more successful than them (Coolen et al, 601 2003; Kendal et al., 2009). While these studies do not demonstrate increases in fitness across 602 generations, they do show that adaptive phenotypic plasticity mechanisms exist that mimic 603 'adaptation' without the natural selection of genetic variation.

The evolutionary relevance of such mechanisms will not go unnoticed to those familiar with the Price equation. In addition to the selective term, the Price equation contains a term that captures whether the next offspring systematically differ from their parents, which can be rendered positive by adaptive phenotypic plasticity (Edelaar & Bolnick, 2019). Many open questions remain as to the extent of such phenomena among different taxa and in the wild, but there can be little doubt that they have far-reaching consequences for evolution (Berdahl et al. 2018; Edelaar & Bolnick, 2019; Brakes et al., 2019).

611

612 Learning can help explain the existence of maladaptation

613 Without gainsaying the general conclusion that learning typically generates adaptive 614 phenotypic variation, there are restricted and reasonably well-understood circumstances in 615 which learning can generate, propagate and maintain maladaptive behavior. It is commonly 616 assumed that natural selection will shape organisms to reflect environmental conditions, but 617 cultural transmission can allow animal behavior to become partially disconnected from their 618 environments. For instance, Bluehead wrasse *Thalassoma bifasciatum* mating sites cannot be 619 predicted from knowledge of environmental resource distributions (Warner, 1988, 1990). 620 Rather, removal and replacement experiments demonstrate that mating sites are maintained 621 as traditions, with young fish and newcomers adopting the mating sites of residents (similar 622 findings are observed in French grunts; Helfman & Schultz, 1984). Under restricted 623 circumstances arbitrary and even maladaptive information can spread, or initially-but-no-624 longer-adaptive traits can be preserved (Richerson & Boyd, 2005). Traditions are maintained 625 as Nash equilibria, in which it rarely pays any individual to abandon the tradition unilaterally; 626 each is forced to do what others are doing, leaving populations locked into conventions that 627 track changing environments only slowly. In animals that aggregate for protection, like 628 shoaling fishes, taking the same route as others to a resource, such as a food site, offers 629 fitness benefits even when the route is sub-optimal, since going it alone is dangerous (Laland 630 & Williams 1998). This behavior, and other conformist tendencies (Day et al, 2001), help 631 explain the traditions observed in natural fish populations. In the case of the wrasse, initially 632 adaptive pathways were rendered suboptimal by environmental change, but the population 633 remained locked into a difficult-to-change convention. Another case is informational 634 cascades, where individuals base behavioral decisions on prior decisions of others (Giraldeau 635 et al. 2002). For instance, among lekking sage grouse Centrocercus urophasianus, the 636 decisions of females using social information to decide with whom to mate were less closely 637 correlated with male traits indicating quality than were the decisions of females making their 638 own judgments about males (Gibson et al. 1991). These instances are a form of historical bias, 639 although distinct from genetically evolved biases.

640 Theoretical studies suggest further ways by which learning can generate 641 maladaptation. As described above, reinforcement learning typically comprises an 642 exploratory search (information gathering) followed by decision-making (information 643 exploitation). However, the two stages are not mutually exclusive: rather reinforcement 644 learning often entails both processes operating simultaneously, or in repeated sequence, 645 allowing animals to gain information from a decision-making experience and to refine their 646 decision in the light of updated knowledge, in an iterative manner (Sutton & Barto, 1998). As 647 a consequence, biases in decision-making can bias the acquisition of knowledge, and vice-648 versa (Hertwig & Erev, 2009; March, 1996). This sequential, path-dependent nature of animal 649 learning can be a crucial determinant of the behavior manifest in the population. For instance, 650 March (1996) demonstrated formally how animal learning could lead to risk-averse behavior 651 when its expected reward was lower than a risky alternative. Animals must strike a balance 652 between exploration and exploitation, which typically leads them to reduce the rate of 653 sampling of apparently inferior options. As a result, risky alternatives, which usually give a 654 poor reward but occasionally give a very good reward, are interpreted as worse than they 655 actually are, leading individuals to over-exploit safe alternatives (March, 1996; Denrell, 2007; 656 empirical examples of learning-induced risk aversion are reviewed in Weber et al. 2004, whilst

similar 'peak shift' phenomena are described by ten Cate & Rowe, 2007). Outside of humans,
cases of the cultural transmission or maintenance of maladaptive behavior appear rare: more
commonly, social learning strategies allow individuals to revisit superior options, even despite
repeated personal failures, circumventing potentially maladaptive risk aversion (Rendell et al,
2010; Arbilly et al. 2011).

662

663 **CONCLUSIONS**

664 Developmental biases remain contentious in evolutionary biology, in part because of the 665 claim that developmental processes may impose direction on adaptive evolution and/or 666 account for adaptation – a claim that ostensibly challenges the widespread belief that natural 667 selection does all of the explanatory work in accounting for adaptive evolution (Maynard 668 Smith et al, 1985; Arthur, 2004; Brakefield 2006; Laland et al 2015; Uller et al, 2018). Given 669 that developmental processes themselves evolve, it is perhaps tempting to respond to such 670 claims by regarding the bias as itself a product of natural selection, a stance that might (at 671 least in some researcher's eyes) restore natural selection's privileged status. However, at 672 least in the case of developmental biases that result from learning, such a response appears 673 inadequate.

674 Whilst the general capacity to learn has clearly evolved through natural selection, the 675 above literature leaves no doubt that the content of learning (the precise associations 676 formed, and the behavioral phenotypes that result) is rarely, if ever, specified by ancestral 677 selection. As documented above, animals are able to learn to exploit foods, or evade threats, 678 even when they are novel and have not been encountered by the lineage, often acquiring 679 them from other species. Moreover, such learning is frequently evolutionarily consequential. 680 In such instances, the traditional line that ancestral natural selection favored genes or 681 genotypes with reaction norms that allow animals to adjust their phenotypes to 682 environmental inputs appears overly simplistic. In learning, ancestral selection has conferred 683 on animals an unusually rich form of plasticity that appears to possess some level of 684 autonomy to generate 'adaptive fit' within an individual as a result of its experience, through 685 an ontogenetic selective process that in many respects resembles natural selection (Plotkin 686 1994; Snell-Rood et al 2018).

687 Above we present clear evidence that (i) individual learning commonly allows animals 688 to generate novel and adaptively biased behavior tuned to the local environment, (ii) social

689 learning further biases the propagation of these phenotypic improvements to other 690 individuals, (iii) this learning can modify selection and affect evolutionary dynamics, and (iv) 691 culture sometimes allows animals to improve mean fitness iteratively across generations in a 692 process that resembles 'adaptation'. While these observations are well-recognized within the 693 animal learning literature, they remain poorly appreciated within the evolutionary biology 694 community. For instance, in an otherwise admirable book, Bonduriansky and Day (2018) claim 695 that "only cognitively sophisticated animals" could learn adaptive solutions to novel 696 circumstances, and suggest that maladaptive behavior would spread just as readily as 697 accessing a novel food – claims that are badly out of touch with the literature. There is now 698 extensive data showing that, through learning, a very broad range of species of animals 699 regularly invent and propagate adaptive behavior that introduces novelty into phenotype 700 space.

701 The significance of these findings may be profound. Recently, the suggestion 702 (associated with the extended evolutionary synthesis) that "novel phenotypic variants will 703 frequently be directional and functional" (Laland et al, 2015, p10) excited considerable 704 contention (e.g. Charlesworth et al, 2017). Yet we suspect to readers familiar with the above 705 referenced literature on animal learning, the assertion would not appear unreasonable. 706 Almost all animal innovation, and almost all socially transmitted knowledge and skills, are 707 likely to be adaptive, and those cases that are not can be predicted a priori. Animal learning 708 is an important addition to a range of phenomena that are now broadly accepted to 709 undermine the classic view that adaptation arises solely from natural selection acting on 710 random genetic variation.

711 The reason that learning evolved to become an unusually rich form of adaptive 712 plasticity is precisely because of the benefits to animals of being able to response 713 appropriately to unanticipated eventualities (Plotkin, 1994; Staddon, 2016). The term 714 'evolvability' attempts to capture the capacity of a system for adaptive evolution. There are 715 diverse definitions of evolvability, many inherently assuming that adaptive evolution requires 716 genetic change. However, we embrace the broader definition provided by Kirschner & 717 Gerhart (1998) – "an organism's capacity to generate heritable phenotypic variation" – in the 718 context of which it is possible to recognize how learning (a source of novel, frequently 719 heritable, phenotypic variation) contributes to evolvability. Through behavioral innovation 720 and social learning, animals can adjust to environments phenotypically, sometimes buffering

genetic responses, but perhaps more commonly triggering genetic accommodation. The impact of learning on evolvability is further suggested by recent studies showing a robust relationship between innovativeness and speciosity in birds (Nicolakkis et al, 2003; Sol et al 2005; Lefebvre et al., 2016). These data reinforce the aforementioned evidence that learning can impose direction on adaptive evolution, affecting evolutionary rates, and influencing the probability of populations reaching global optimum.

727 There are many open questions ripe for investigation. For instance, do biases that 728 arise through learning differ from other developmental biases, for instance, in the level of 729 integration or diversity of phenotypes generated? Are there different patterns of bias 730 associated with individual and social learning? Will success-based copying generate more 731 rapid convergence through genetic accommodation on fitness peaks than conformist social 732 learning, which is prone to historical lags? Further investigation is required, but there is 733 already sufficient data to suggest that phenotypic accommodation through learning may be 734 common, rapid and powerful, particularly in vertebrates, and that developmentally biased 735 evolutionary processes resulting from learning may be a truly fundamental feature of animal 736 evolution.

737

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744 **REFERENCES**

- 745 Alberti, M. (2015). Eco-evolutionary dynamics in an urbanizing planet. *Trends in Ecology &*746 *Evolution*, 30, 114-126.
- Alberti, M., Correa, C., Marzluff, J.M., Hendry, A.P., Palkovacs, E.P., Gotanda, K.M., ... & Zhou,
- Y. (2017). Global urban signatures of phenotypic change in animal and plant
 populations. *Proceedings of the National Academy of Sciences*, 201606034.

- Allen, J., Weinrich, M., Hoppitt, W. & Rendell, L. (2013) Network-based diffusion analysis
 reveals cultural transmission of lobtail feeding in humpback whales. *Science* 340: 485488.
- Amlacher, J. & Dugatkin, L.A. (2005) Preference for older over younger models during mate choice copying in young guppies. *Ethology Ecology & Evolution*, 17: 161-169
- Ancel, L. (2000). Undermining the Baldwin expediting effect: does phenotypic plasticity
 accelerate evolution? Theor. Popul. Biol. 58: 207–319.
- Anderson, R. (1995). Learning and evolution: a quantitative genetics approach. J. Theor. Biol.
 175: 89–101.
- Aoki K & Feldman MW (2014) Evolution of learning strategies in temporally and spatially
 variable environments: A review of theory. Theor. Pop. Biol. 91: 3-19
- Arbilly M, Motro U, Feldman MW, & Lotem A (2011) Evolution of social learning when high
 expected payoffs are associated with high risk of failure. *J. Roy. Soc. Interface*, 8: 16041615.
- Arthur, W. (2004) The effect of development on the direction of evolution: toward a twenty first century consensus. Evol. Dev. 6: 282–288
- Beltman, J., Haccou, P. & Ten Cate, C. (2003) The impact of learning foster species' song on
 the evolution of specialist avian brood parasitism. *Behav. Ecol.* 14: 917-923.
- 768 Berdahl, A.M., Kao, A.B., Flack, A., Westley, P.A.H., Codling, E.A., Couzin, I.D., Dell, A.I. & Biro,
- D. (2018) Collective animal navigation and migratory culture: from theoretical models
 to empirical evidence. *Philosophical Transactions of the Royal Society B: Biological Sciences*, 373: 20170009.
- Bijleveld, A.I., van Gils, J.A., Jouta, J. & Piersma, T. (2015) Benefits of foraging in small groups:
 an experimental study on public information use in red knots *Calidris canutus*. *Behavioural Processes*, 117: 74-81.
- Boivin NL, Zeder MA, Fuller DQ et al (2016) Ecological consequences of human niche
 construction: examining long-term anthropogenic shaping of global species
 distributions. Proc. Natl. Acad. Sci. USA 113(23): 6388-96
- Bolhuis, J. J. & MacPhail, E. M. (2001). A critique of the neuroecology of learning and memory.
 Trends in Cognitive Sciences, 5, 426–433.
- 780 Bonduriansky R & Day T (2018) Extended Heredity. Princeton University Press.

- Borenstein, E., I. Meilijson, and E. Ruppin. (2006). The effect of phenotypic plasticity on
 evolution in multipeaked fitness landscapes. Journal of Evolutionary Biology 19:1555–
 1570.
- 784 Boyd R & Richerson PJ (1985). Culture and the Evolutionary Process. Chicago University Press.
- Brakefield, P. M. (2006) Evo-devo and constraints on selection. Trends Ecol. Evol. 21: 362–
 368.
- 787 Brakes P et al. (2019) Animal cultures matter for conservation. Science 363(6431): 1032-4
- 788 Breland K & Breland M (1961). The misbehavior of organisms. Am. Psychol. 16: 661-4
- Cavalli-Sforza LL & Feldman MW (1981). Cultural Transmission and Evolution. Princeton
 University Press
- Charlesworth, D., N. H. Barton & B. Charlesworth (2017) The sources of adaptive variation.
 Proceedings of the Royal Society B-Biological Sciences 284: 20162864.
- Chevin, L. M., Lande, R., & Mace, G. M. (2010). Adaptation, plasticity, and extinction in a
 changing environment: towards a predictive theory. PLoS biology, 8(4), e1000357.
- Chivers, D. P. & Smith, R. J. F. (1995) Chemical recognition of risky habitats is culturally
 transmitted among flathead minnows, *Pimephales promelas* (Osteichthyes,
 Cyprinidae). *Ethology* 99: 286-296.
- Coolen, I., Day, R.L. & Laland, K.N. (2003). Species difference in adaptive use of public
 information in sticklebacks. *Proceedings of the Royal Society London B* 270: 2413–
 2419.
- 801 Coussi-Korbel, S. and Fragaszy, D. M. (1995) On the relation between social dynamics and
 802 social learning. Anim. Behav. 50(6): 1441-53.
- 803 Curio, E. (1988). Cultural transmission of enemy recognition by birds. In: Social Learning:
 804 Psychological and Biological Perspectives, B. G. Galef and T. R. Zentall, Eds. Hillsdale,
 805 NJ: Erlbaum. Pp. 75–97.
- Bovies, N. B. & Welbergen, J. A. (2009) Social transmission of a host defense against cuckoo
 parasitism. *Science* 324: 1318-1320.
- Boy, R., MacDonald, T., Brown, C., Laland, K.N. & Reader, S.M. (2001). Interactions between
 shoal size and conformity in guppy social foraging. *Animal Behaviour* 62: 917–925.
- 810 Denrell J. (2007). Adaptive Learning and Risk Taking. Psychological Review. 114: 177-187.
- 811 Dickinson A (1980) Contemporary animal learning theory. Cambridge University Press
- 812 Dukas R & Ratcliffe JM (eds.) (2009) Cognitive Ecology II. University of Chicago Press.

- B13 Durham WH (1991) Coevolution. Genes, Culture and Human Diversity. Stanford University
 B14 Press.
- Edelaar P & Bolnick DI (2019) Appreciating the multiple processes increasing individual or population fitness. Trends Ecol. Evol. https://doi.org/10.1016/j.tree.2019.02.001
- Edelaar, P., Jovani, R., & Gomez-Mestre, I. (2017). Should I change or should I go? Phenotypic
 plasticity and matching habitat choice in the adaptation to environmental
 heterogeneity. The American Naturalist, 190(4), 506-520.
- Enquist, M. & Ghirlanda, S. (2007) Evolution of social learning does not explain the origin of
 human cumulative culture. *Journal of Theoretical Biology*, 246: 129-135.
- Flack, A., Pettit, B., Freeman, R., Guilford, T. & Biro, D. (2012) What are leaders made of? The
 role of individual experience in determining leader–follower relations in homing
 pigeons. *Animal Behaviour*, 83: 703-709.
- Fogarty, L, Strimling P. & Laland K.N. (2011). The evolution of teaching. *Evolution.* 65: 27602770.
- Foote, A. D. *et al.* (2016) Genome-culture coevolution promotes rapid divergence of killer
 whale ecotypes. *Nat. Commun.* 7: 11693
- Forsman, J. and Seppanen, J. (2011). Learning what (not) to do: testing rejection and copying
 of simulated hetrospecific behavioural traita. Anim. Behav. 81: 879–883.
- Fox RJ, Donelson JM, Schunter C, Ravasi T, Gaita n-Espitia JD. 2019 Beyond buying time: the
 role of plasticity in phenotypic adaptation to rapid environmental change. Phil. Trans.
 R. Soc. B 374: 20180174. http://dx.doi.org/10.1098/rstb.2018.0174
- Frank SA (2011). Natural selection II. Developmental variability and evolutionary rate. J. Ev.
 Biol. 24: 2310-2320.
- Garcia, J. & Koelling, R. A. (1966). Prolonged relation of cue to consequence in avoidance
 learning. *Psychonomic Science*, 4: 123–124.
- Gerbault, P., A. Liebert, Y. Itan, A. Powell, M. Currat, J. Burger, D. M. Swallow, and M. G.
 Thomas. (2011). Evolution of lactase persistence: an example of human niche
 construction. *Philosophical Transactions of the Royal Society B* 366:863–877.
- Ghalambor, C. K., McKay, J. K., Carroll, S. P., & Reznick, D. N. (2007). Adaptive versus non adaptive phenotypic plasticity and the potential for contemporary adaptation in new
 environments. Functional ecology, 21(3), 394-407.

- Gibson, R. M., Bradbury, J. W. & Vehrencamp, S. L. (1991) Mate choice in lekking sage grouse
 revisited: the roles of vocal display, female site fidelity, and copying. *Behav. Ecol.* 2:
 165-180.
- Giraldeau, L. A., Valone, T. J. and Templeton, J. J. (2002). Potential disadvantages of using
 socially acquired information. Phil. Trans. R. Soc. Lond. B 357: 1559–1566.
- Goodall, J. (1986) *The chimpanzees of Gombe: patterns of behavior.* Harvard University Press,
 Cambridge, MA.
- 851 Griffiths, P.E. (2002) What Is Innateness? The Monist, 85, 70-85.
- Helfman G. S., Schultz, E. T. (1984). Social transmission of behavioural traditions in a coral reef
 fish. Anim. Behav. 32: 379–384.
- Henrich, J. and McElreath, R. (2003). The evolution of cultural evolution. Evol. Anthropol. 12:
 123–135.
- Hertwig R & Erev I. (2009). The description-experience gap in risky choice. Trends Cog. Sci.
 13:517-523.
- Heyes, C.M. (1994) Social learning in animals: categories and mechanisms. *Biological Reviews*,
 69: 207-231.
- 860 Hinde RA (1982) Ethology. Glasgow. Fontana.
- 861 Hinde RA & Stephenson-Hinde (1973) Constraints on learning. Limitations and
 862 Predispositions. Academic Press
- 863 Hinton GE & Nowlan SJ (1987) How learning can guide evolution. Complex Systems 1: 495864 502.
- Hoelzel, A. & Moura, A. (2016) Killer whales differentiating in geographic sympatry facilitated
 by divergent behavioural traditions. *Heredity* 117: 481-482.
- Hoppitt, W. & Laland, K.N. (2013) Social learning: an introduction to mechanisms, methods
 and models. Princeton University Press, Princeton, NJ.
- Hoppitt, W.J.E., Brown, G.R., Kendal, R., Rendell, L., Thornton, A., Webster, M.M. & Laland,
 K.N. (2008) Lessons from animal teaching. *Trends in Ecology & Evolution*, 23: 486-493.
- Huey, R. B., Hertz, P. E., & Sinervo, B. (2003). Behavioral drive versus behavioral inertia in
 evolution: a null model approach. The American Naturalist, 161(3), 357-366.
- 873Jesmer BR et al (2018) Is ungulate migration culturally transmitted? Evidence of social874learning from translocated animals. Science 361: 1023-5

- Kamil AC (1983). Optimal foraging theory and the psychology of learning. American Zoologist
 23: 291-302
- Kawai, M. (1965). Newly-acquired pre-cultral behavior of the natural troop of Japanese
 monkeys on Koshima islet. Primates 6: 1–30.
- Kendal, R.L., Coe, R.L. & Laland, K.N. (2005). Age differences in neophilia, exploration and
 innovation in family groups of Callitrichid monkeys. *American Journal of Primatology*66: 167–188.
- Kendal, J.R., Rendell, L., Pike, T.W. & Laland, K.N. (2009). Nine-spined sticklebacks deploy a
 hill-climbing social learning strategy. *Behavioural Ecology* 20: 238–244.
- Kendal RL, Boogert NJ, Rendell L, Laland KN, Webster M & Jones PL. (2018) Social learning
 strategies: bridge-building between fields. *Trends in Cognitive Sciences* 22(7):651-665
- Kirschner M & Gerhardt J 1998. Evolvability. Proc. Natl. Acad. Sci. USA 95(15): 8420-7
- Kirkpatrick, M. and L. A. Dugatkin. (1994). Sexual selection and the evolutionary effects of
 copying mate choice. Behav. Ecol. Sociobiol. 34: 443–449.
- Kirkpatrick K & Hall G (2004) Learning and Memory. In Bolhuis JJ & Giraldeau LA (eds) The
 Behavior of Animals: Mechanisms, Function, and Evolution. Blackwell.
- Krebs, J. R., A. Kacelnik, and P. Taylor. (1978). Test of optimal sampling by foraging great tits.
 Nature 275:27-31.
- Lachlan, R. F. and Slater, P. J. B. (1999). The maintenance of vocal learning by gene-culture
 interaction: the cultural trap hypothesis. Proc. R. Soc. Lond, B 266: 701–706.
- Lai, Y.-T., Yeung, C.K.L., Omland, K.E., Pang, E.-L., Hao, Y., Liao, B.-Y., Cao, H.-F., Zhang, B.-W.,
- Yeh, C.-F., Hung, C.-M., Hung, H.-Y., Yang, M.-Y., Liang, W., Hsu, Y.-C., Yao, C.-T., Dong,
 L., Lin, K., and Li, S.-H. (2019) Standing genetic variation as the predominant source for
 adaptation of a songbird. *Proceedings of the National Academy of Sciences* 116: 21522157.
- Laland, K.N. (2004). Social learning strategies. Special edition of Learning and Behavior on
 Studies of Social Learning and Imitation. Galef, B.G. Jr. & Heyes, C.M. (eds). 32: 4–14.
- Laland, K.N. & Williams, K. (1998). Social transmission of maladaptive information in the
 guppy. *Behavioural Ecology* 9: 493–499.
- Laland, K.N., Odling-Smee, F.J. & Myles, S. (2010). How culture has shaped the human
 genome: Bringing genetics and the human sciences together. *Nature Reviews Genetics*11: 137–148.

- 907 Laland KN, Uller T, Feldman MW, Sterelny K, Müller GB, Moczek A, Jablonka E & Odling-Smee
- 908 FJ (2015) The extended evolutionary synthesis: its structure, assumptions and 909 predictions. *Proc R Soc B* 282: 20151019.
- Laland KN, Odling-Smee J & Feldman MW. (In Press) Understanding niche construction as an
 evolutionary process. In: Uller T & Laland KN (eds.) *Evolutionary Causation. Biological and Philosophical Reflections.* MIT Press: Cambridge, Mass.
- Lefebvre, L., P. Whittle, E. Lascaris, and A. Finkelstein. (1997). Feeding innovations and
 forebrain size in birds. *Animal Behaviour* 53:549–560.
- Lefebvre, L., S. Ducatez, and J. N. Audet. (2016). Feeding innovations in a nested phylogeny of
 Neotropical passerines. *Philosophical Transactions of the Royal Society of London B*,
 371: 20150188.
- Levis, N. A. & Pfennig, D. W. (2016) Evaluating 'plasticity-first' evolution in nature: key criteria
 and empirical approaches. *Tr. Ecol. Evol.* 31: 563-574.
- 920 Love AC (ed) (2015) Conceptual Change in Biology. Springer.
- 921 Mackintosh N (1974) The psychology of animal learning. Academic Press
- 922 March, J. G. (1996). Learning to be risk averse. Psychological Review, 103, 309–319.
- Mason, J.R. & Reidinger, R.F. (1982) Observational learning of food aversions in red-winged
 blackbirds (*Agelaius phoeniceus*). *Auk*, 99: 548-554.
- Maynard-Smith, J., R. Burian, S. Kauffman, P. Alberch, J. Campbell et al., (1985)
 Developmental constraints and evolution. Q. Rev. Biol. 60: 265–287.
- 927 Maynard-Smith J. (1987) When learning guides evolution. Nature 329: 761-2
- 928 Mills, R., and R. A. Watson (2006) On crossing fitness valleys with the Baldwin effect, pp. 493–
- 929 499 in Proceedings of the Tenth International Conference on the Simulation and930 Synthesis of Living Systems. MIT Press, Cambridge, MA.
- 931 Mineka, S. and Cook, M. (1988). Social learning and the acquisition of snake fear in monkeys.
- In: Social Learning: Psychological and Biological Perspectives, B. G. Galef and T. R.
 Zentall, Eds. Hillsdale, NJ: Lawrence Erlbaum. Pp. 51–73.
- Moczek AP (2008). On the origins of novelty in development and evolution. BioEssays 30(5):
 432-47
- Moczek AP, Sears KE, Stollewerk et al. (2015) The significance and scope of evolutionary
 developmental biology: a vision for the 21st century. Evolution & Development. 17(3):
 198-219

- Mueller T, O'Hara RB, Converse SJ, Urbanek RP, Fagan WF (2013) Social learning of migratory
 performance. Science 341:999-1002.
- Muñoz, M. M., & Losos, J. B. (2018). Thermoregulatory behavior simultaneously promotes
 and forestalls evolution in a tropical lizard. The American Naturalist, 191(1), E15-E26.
- 943 Nicolakakis, N., D. Sol, and L. Lefebvre. (2003). Behavioral exibility predicts species richness in
 944 birds, but not extinction risk. *Animal Behaviour* 65:445–452.
- Nöbel S, Allain M, Isabel G, Danchin E. (2018) Mate copying in Drosophila melanogaster males.
 Anim Behav . 141:9–15.
- 947 Odling-Smee, F.J., Laland, K.N. & Feldman, M.W. (2003). *Niche Construction. The Neglected* 948 *Process in Evolution.* Monographs in Population Biology 37. Princeton University Press.
- 949 Oppel, S., Dobrev, V., Arkumarev, V., Saravia, V., Bounas, A., Kret, E., Velevski, M., Stoychev,
- 950 S. & Nikolov, S.C. (2015) High juvenile mortality during migration in a declining 951 population of a long-distance migratory raptor. Ibis, 157, 545-557.
- Paenke, I., B. Sendhoff, and T. J. Kawecki, (2007) Influence of plasticity and learning on
 evolution under directional selection. Am. Nat. 170: E47–E58.
- Palkovacs, E. P., Kinnison, M. T., Correa, C., Dalton, C. M. & Hendry, A. P. (2012). Fates
 beyond traits: ecological consequences of human-induced trait
 change. *Evolutionary Applications*, 5, 183–191.
- Pasqualone, A. A. and Davis, J. M. (2011). The use of conspecific phenotypic states as
 information during reproductive decisions. Anim. Behav. 82: 281-4
- Perry, G. H., N. J. Dominy, K. G. Claw, A. S. Lee, H. Fiegler, R. Redon, J. Werner, et al. (2007).
 Diet and the evolution of human amylase gene copy number variation. *Nature Genetics* 39:1256–1260.
- 962 Plotkin HC (1994) Darwin machines and the nature of knowledge. Penguin
- Price, T. D., Qvarnström, A., & Irwin, D. E. (2003). The role of phenotypic plasticity in driving
 genetic evolution. Proceedings of the Royal Society of London. Series B: Biological
 Sciences, 270(1523), 1433-1440.
- 966 Pulliam H & Dunford C (1980) Programmed to Learn. Columbia University Press.
- Reader SM, Laland KN. (2001) Primate innovation: sex, age and social rank differences. Int. J.
 Primatol. 22, 787–805.
- Reader, S.M. & Laland, K.N. (2002). Social intelligence, innovation and enhanced brain size in
 primates. *Proceedings of the National Academy of Sciences USA* 99: 4436–4441.

- 971 Reader SM, Laland KN. (2003) Animal innovation. Oxford, UK: Oxford University Press.
- Reader SM, Flynn E, Morand-Ferron J & Laland KN (2016) Innovation in animals and humans:
 understanding the origins and development of novel and creative behaviour. Phil.
 Trans. R. Soc. B Vol 371: 1690
- Rendell, L., Boyd, R., Cownden, D., Enquist, M., Eriksson, K., Feldman, M.W., Fogarty, L.,
 Ghirlanda, S., Lillicrap, T. & Laland, K.N. (2010) Why copy others? Insights from the
 social learning strategies tournament. *Science*, 328: 208-213.
- 878 Rendell, L., Fogarty, L., Hoppitt, W.J.E., Morgan, T.J.H., Webster, M.M. & Laland, K.N. (2011)
 879 Cognitive culture: theoretical and empirical insights into social learning strategies.
 880 Trends in Cognitive Sciences, 15, 68-76.
- 981 Rescorla, RA (1988) Pavlovian Conditioning. Am. Psychol 43(3): 151-160
- Rescorla, R. A. & Wagner, A. R. (1972). A theory of Pavlovian conditioning: Variations in the
 effectiveness of reinforcement and nonreinforcement. In A. H. Black & W. F. Prokasy
 (Eds.), *Classical Conditioning II: Current Research and Theory* (pp. 64–99). New York:
 Appleton.
- Richerson, P. J. & Boyd, R. (2005). Not by Genes Alone: How Culture Transformed Human
 Evolution. Chicago: Chicago University Press.
- Riesch, R., Barrett-Lennard, L. G., Ellis, G. M., Ford, J. K. B. & Deecke, V. B. (2012) Cultural
 traditions and the evolution of reproductive isolation: ecological speciation in killer
 whales? *Biol. J. Linn. Soc.* 106: 1-17.
- Rieseberg, L.H., Raymond, O., Rosenthal, D.M., Lai, Z., Livingstone, K., Nakazato, T., Durphy,
 J.L., Schwarzbach, A.E., Donovan, L.A., and Lexer, C. (2003) Major ecological transitions
 in wild sunflowers facilitated by hybridization. *Science* 301:1211-1216.
- Robinette, R. L. & Ha, J. C. (1997). The significance of fishing by northwestern crows. Wilson
 Bulletin, 109, 748–749
- Russon, A. E. (2003) Innovation and creativity in forest-living rehabilitant orang-utans *In: Animal Innovation* (eds Reader, S. M. & Laland, K. N.). 279-306 Oxford University Press,
 New York, NY.
- Sargeant, B. L. & Mann, J. (2009) Developmental evidence for foraging traditions in wild
 bottlenose dolphins. *Anim. Behav.* 78: 715-721.

- Sarin, S. and Dukas, R. (2009). Social learning about egg laying substrates in fruit flies. Proc. R.
 Soc. Lond. B 276:4323–4328.
- Sasaki, T. & Biro, D. (2017) Cumulative culture can emerge from collective intelligence in
 animal groups. Nature Communications, 8, 15049.
- 1005 Schardien, B. J. & Jackson, J. A. (1982). Killdeers feeding on frogs. Wilson Bulletin, 94, 85–87.
- Seehausen, O. (2004). Hybridization and adaptive radiation. *Trends in Ecology & Evolution* 19:
 1007 198-207.
- Seeley, T. (1977) Measurement of nest cavity volume by the honey bee (*Apis mellifera*).
 Behavioral Ecology and Sociobiology, 2, 201-227.
- Seeley, T.D. & Buhrman, S.C. (2001) Nest-site selection in honey bees: how well do swarms
 implement the "best-of-n" decision rule? *Behavioral Ecology and Sociobiology*, 49,
 416-427.
- 1013 Seppanen, J., Forsman, J., Monkkonen, M., et al. (2011) New behavioural trail adopted or 1014 rejected by observing heterospecific tutor fitness. Proc. R. Soc. B 278:1736–1741.
- 1015 Shettleworth, S. (2000). Modularity and the evolution of cognition. In C. Heyes & L. Huber 1016 (Eds.), *The Evolution of Cognition* (pp. 43–60). Cambridge, MA: MIT Press.

1017 Skinner BF (1938) The behavior of organisms. Appleton Century Crofts.

1018 Skinner BF 1953. Science and Human Behavior. The Free Press: New York, NY.

- Snell-Rood EC, Kobiela ME, Sikkink KL, Shepherd AM. (2018) Mechanisms of plastic rescue in
 novel environments. Ann. Rev. Ecol. Evol. Syst. 49, 331 354.
- 1021Sol, D., D. G. Stirling, and L. Lefebvre. (2005) Behavioral drive or behavioral inhibi- tion in1022evolution: subspeci c diversi cation in Holarctic passerines. *Evolution* 59:2669–2677.
- Staddon J.E.R. (2007) Is Animal Learning Optimal?. In: Constructal Theory of Social
 Dynamics. Springer, Boston, MA

Staddon JER (2016) Adaptive Behavior and Learning.2nd Edition. Cambridge University
 Press.

- 1027St Clair, JJH, Klump, BC, Sugasawa, S, Higgott, CG, Colegrave, N & Rutz, C (2018) 'Hook1028innovation boosts foraging efficiency in tool-using crows' Nature Ecology and1029Evolution, vol 2, pp 441–444. DOI: 10.1038/s41559-017-0429-7
- Stephens, D. W. & Krebs, J. R. (1986). *Foraging Theory*. Princeton, NJ: Princeton University
 Press.

- Stephenson G (1967) Cultural acquisition of a specific learned response among rhesus
 monkeys. In D Starck, R Schneider & H Kuhn (eds.) Progress in Primatology. Stuttgart:
 Gustav Fisher Verlag.
- Sullivan, A. P., Bird, D. W., & Perry, G. H. (2017). Human behaviour as a long-term ecological
 driver of non-human evolution. *Nature Ecology & Evolution*, *1*, 0065.
- Sultan, S. (forthcoming) Genotype-environment interaction and the unscripted reaction
 norm. In: Evolutionary Causation, edited by KN Laland and T Uller. MIT Press,
 Cambridge, MA.
- Sutton, R. S., & Barto, A. G. (1998). Reinforcement learning: An introduction. Cambridge, MA:
 MIT Press.
- 1042ten Cate C & Rowe C (2007) Biases in signal evolution: learning makes a difference. Trends1043Ecol. Evol. 22(7): 380-7
- 1044Thorndike, E. L. (1898) Animal intelligence: An experimental study of the associative1045processes in animals. Psychological Review Monographs, 2 (Whole No. 8).
- 1046Thornton A & Raihani NJ (2010) Identifying teaching in wild animals. Learning & Behavior104738(3): 297-309
- 1048Thorogood, R. & Davies, N. B. (2012) Cuckoos combat socially transmitted defenses of reed1049warbler hosts with a plumage polymorphism. *Science* 337: 578-580.
- 1050Todd, P. M. G. (1991) Exploring adaptive agency II: simulating the evolution of associative1051learning, pp. 306–315 in From Animals to Animals: Proceedings of the First1052International Conference on Simulation of Adaptive Behavior, edited by J. M. S.1053Wilson. MIT Press, Cambridge, MA.
- 1054 Uller T, Moczek AP, Watson RA, Brakefield PM, Laland KN. 2018. Developmental bias and
 1055 evolution: A regulatory network perspective. *Genetics* 209 (4): 949-966
- van der Graaf, A.J., Stahl, J., Klimkowska, A., Bakker, J.P. & Drent, R.H. (2006) Surfing on a
 green wave: how plant growth drives spring migration in the barnacle goose. Ardea,
 94, 567-577.
- 1059 Vansteelant, W.M.G., Kekkonen, J. & Byholm, P. (2017) Wind conditions and geography shape
 1060 the first outbound migration of juvenile honey buzzards and their distribution across
 1061 sub-Saharan Africa. Proceedings. Biological sciences, 284, 20170387.
- 1062Verziijden MN, ten Cate C, Servedio MR, Kozak GM, Boughman JW & Svensson EI (2012) The1063impact of learning on sexual selection and speciation. Trends. Ecol. Evol. 27(9): 511-9

- 1064 Vieth W, Curio E & Ernst U (1980) The adaptive significance of avian mobbing. III. Cultural
 1065 transmission of enemy recognition in blackbirds: Cross-species tutoring and
 1066 properties of learning. Anim. Behav. 28: 1217-29
- 1067 Warner, R. R. (1988) Traditionality of mating-site preferences in a coral reef fish. Nature 335:1068 719–721.
- Warner, R. R. (1990) Male versus female influences on mating-site determination in a coral-reef fish. Anim. Behav. 39: 540–548.
- Weber E, Shafir S, & Blais A (2004) Predicting Risk Sensitivity in Humans and Lower Animals:
 Risk as Variance or Coefficient of Variation. *Psych. Rev.*, **111**, 430-445. (doi: 10.1037/0033-295X.111.2.430)
- 1074 West-Eberhard, M. J. (2003) *Developmental plasticity and evolution*. (Oxford University Press,
 1075 Oxford, UK.
- Whalen A, Cownden D & Laland KN (2015) The learning of action sequences through social
 transmission. *Animal Cognition* DOI 10.1007/s10071-015-0877-x.
- 1078 Whitehead, H. (1998) Cultural selection and genetic diversity in matrilineal whales. *Science*1079 282: 1708-1711.
- Whitehead H, Laland KN, Rendell L, Thorogood R & Whiten A (2019) The reach of gene-culture
 coevolution in animals. Nature Communications. 10: 2405
- Whiten, A., Ayala, F.J., Feldman, M.W. & Laland, K.N. (2017) The extension of biology through
 culture. *Proceedings of the National Academy of Sciences* 114: 7775-7781.
- 1084 Wilkinson, G. (1992). Information transfer at evening bat colonies. Anim. Behav. 44: 501–518.
- 1085 Wilkinson, A., Kuenstner, K., Mueller, J., & Huber, L. (2010). Social learning in a non-social
- 1086 reptile (Geochelone carbonaria) *Biology Letters, 6* (5), 614-616
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Category	Examples
Adaptive bias Developmental variation biased towards adaptive outcomes	 Reinforcement learning (Staddon, 2007) Adaptive filtering and biased cultural transmission (Enquist & Ghirlanda, 2007; Rendell et al. 2010) Teaching behavior in ants, bees, meerkats and pied babblers (Hoppitt et al 2008; Thornton & Raihani, 2010)
Historical bias Developmental variation biased by historical legacy (e.g. ancestral selection, or tradition)	 Rats avoid taste or smell of poisoned food, but are slow to learn that a sound or light predicts illness (Garcia & Koelling 1966). Lab-reared rhesus monkeys learn a fear of snakes more readily than a fear of arbitrary objects, after watching conspecifics behaving fearfully (Mineka and Cook, 1988; but see Stephenson 1967). Raccoons could not be conditioned to pick up coins and place them in a money box for a food reward (Breland & Breland, 1961).
Origination bias Developmental variation biased in its origination	 Juveniles of some migratory birds exhibit more route variation than older individuals (Mueller et al., 2013; Oppel et al., 2015; Vansteelant et al., 2017) The inventors of novel behavior are usually more likely to be experienced individuals than youngsters in nonhuman primates (Reader & Laland, 2001; Kendal et al, 2005), and more commonly low-ranking than dominants (Reader & Laland, 2001). Innovativeness of monkey species was predicted by their reliance on extractive foraging (Kendal et al, 2005)
Transmission bias Biased transmission of developmental variation, with some forms being propagated more readily than others	 Red-winged blackbirds copy feeding conspecifics except when they show an aversive reaction to food (Mason & Reidinger 1982). Bats unsuccessful at locating food alone follow successful bats to feeding sites, using cues indicative of feeding, e.g. defecation (Wilkinson, 1992). Insects and birds copy the nest-site decisions of successful conspecifics and heterospecifics (Sarin & Dukas, 2009; Pasqualone & Davis, 2011; Seppanen et al 2011; Forsman & Seppanen, 2011).
Variational bias Developmental processes bias evolutionary processes through generating some phenotypic forms more readily than others	 Culturally transmitted dietary traditions in killer whale have favored population-specific genes influencing morphology and digestion, (Foote et al., 2016; Hoelzel & Moura, 2016). Mate choice copying influences sexual selection of male traits (Gibson et al., 1991; Kirkpatrick & Dugatkin, 1994; Nöbel et al., 2018). Reed warbler learning drives the evolution of plumage patterns in cuckoos (Davies & Welbergen, 2009; Thorogood & Davies, 2012).
Selective bias Developmental processes bias evolutionary processes through generating some environmental states more readily than others (niche construction)	 Dairy farming created selection alleles for adult lactase persistence (Gerbault et al, 2011) Agricultural practices (e.g. cultivating yams) have inadvertently promoted the spread of malaria in some populations, leading to selection of the HbS allele which confers resistance (Durham, 1991). The farming and consumption of starchy foods has favored high copy number of AMY1, which facilitates the breakdown of the excess starch in agricultural diets (Perry et al, 2007).

Table 1. Categories of developmental bias generated by learning, with examples (see text for

1092 details).