

I suggest: Ape cultures do not require behavior copying  
(because copying is under-defined otherwise, and then this way around it seems to flow slightly better)

# Copying is not required for ape cultures

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inspired seems the wrong word here: targeted at maybe?

capitalise these too?

We developed an individual-based model inspired by (1) to test whether population-level distributions of behavioural traits suggestive of cultures could emerge without the existence of high-fidelity copying. We reproduce several details, including realistic demographic and spatial features, and parametrised the range of genetic and ecological variations between the populations. We also parametrised the degree to which individual innovations are socially-mediated, i.e. the degree to which the probability for an individual to innovate a behaviour is dependent on the frequency of the same behaviour in the population. Our results show that, under realistic values of the main parameters, namely null to medium importance of genetic variation, medium to high importance of ecological variation, and various values of social influence on innovations, we can reproduce distributions of behavioural traits used to prove the existence of ape cultures. Our model reproduces other details of the behavioural patterns found in wild population, such as the proportion of behaviours present in all sites, not habitual in all site, or absent because of ecological factors, as well as a correlation between population size and the number of cultural traits in each site. Overall, our results suggest that ape cultures can emerge without copying, provide an explanation to why they are not cumulative.

behavior

one keyword should be behavior copying

I think currently the abstract is a bit hard to understand. Lets concentrate

cultural transmission | cultural evolution | cumulative culture | non-human great ape culture | individual-based models | animal culture  
Cumulative culture, the transmission and improvement of knowledge, technologies, and beliefs from individual to individual, and from generation to generation, is key to explain the extraordinary ecological success of our species (2, 3). Which cognitive abilities underpin human's cumulative cultural capacities, and how these abilities affect the evolution of culture itself are among the most pressing questions of evolutionary human science.

on making it punchy. It needs to explain diff. between SMR and copying and define what traits are etc. before going in for the kill.

Many species are able to at least use social cues to modify their behaviour. Various primates have been shown to possess complex traditions that are socially influenced (1, 4, 5). Humans, in contrast, have cumulative culture. While there are various definitions of cumulative culture (6), some of its characteristics are broadly accepted. Cumulative culture requires the accumulation of cultural traits (more cultural traits are present at generation  $g$  than at time  $g-1$ ), their improvement (cultural traits at generation  $g$  are more effective than at generation  $g-1$ ), and ratcheting (the innovation of cultural traits at generation  $g$  depends on the presence of other traits at generation  $g-1$ ) (7).

While not all human culture needs to be supported by faithful copying (8), our cumulative culture depends on an ability to accurately transmit and preserve new information. Experiments have indeed shown that humans are capable of copying, and that they routinely do it in all known societies. More controversial is the claim that other species copy. Arguments regarding the existence of non-human great ape cultures based on copying raise a puzzling question: if other ape species can

and do copy, why do they not develop cumulative cultures? There are only two possible answers to this question: either they do not copy, or copying does not automatically lead to cumulative culture.

Primatologists have claimed the existence of ape cultures based on the ability of copying faithfully drawing on observations conducted on wild populations. For example, researchers examined the population-level distribution of behavioral traits in populations of chimpanzees across seven sites, and argued that the inter-site differences in the frequency of behaviors proved the existence of copying-based cultures in these populations (1). We developed an individual-based model to assess whether these patterns actually justify the conclusion that copying is the underlying learning mechanism. We reproduced several details of the original study, including realistic demographic and spatial features, and effects of ecological availability and genetic predisposition, to investigate whether an equivalent distribution of behavioral traits could emerge in absence of any copying. While our simulated species, *oranzees*, can be influenced by social cues (widespread in the animal kingdom, and certainly present in all apes), we explicitly did not model any copying.

Our results show that, under realistic values of the main parameters, we can reproduce the distribution of behavioral traits found in (1), without any copying required. In other words, as *oranzees* can and do show cultural patterns resembling wild ape patterns, this suggests that such patterns do not constitute evidence that copying must have taken place.

## Significance Statement

Human culture is cumulative: it grows in complexity and efficiency, drawing on the innovations of previous generations. In contrast, traditions of other primates, while also based on social information, are cumulative to a minimum degree, if any. It has been proposed that human cumulative culture depends on our ability to accurately transmit and preserve information. At the same time, researchers have claimed that also non-human primates can copy others with high-fidelity. This raises a puzzling question: why are their cultures not cumulative? We show, through computer simulations, that the behavioural patterns used to prove the existence of copying-based culture in wild ape populations can be reproduced, in realistic conditions, without copying, suggesting a reason why ape cultures are not cumulative. With this fininding, the puzzle of why ape cultures are not cumulative resolves itself.

\*This requires the copying of these innovations, and the basic mechanism for that is behavior copying

AA designed the research, developed the model and analyse the data, and wrote the paper. WS contributed the artworks for Figure 2. CT designed the research and wrote the paper.

add that WS helped with the paper too, and to let him do that pls send him the paper.

Yes Tomaselli-I :-)

Materials and methods

We built an individual-based model that reproduces a world inhabited by six populations of “oranzees”, a hypothetical ape species. The model is spatially explicit: the oranzees populations are located at relative positions analogous to the six chimpanzees sites in (1). This is important to determine the potential genetic predispositions and ecological availabilities associated with their possible behaviours (see below). Population sizes are also taken from the sites in (1). Following (9), we use data from (10), and we define population sizes as  $N = \{20; 42; 49; 76; 50; 95\}$ .

Oranzees are subject to an age-dependent birth/death process, broadly inspired by descriptions in (11). A time step  $t$  of the simulation represents a month in oranzees’ life. From when they are 25 years old ( $t = 300$ ), there is a 1% probability an oranze will die each month, or they die when they are 60 years old ( $t = 720$ ). The number of individuals in the population is fixed, so each time an oranze dies it is replaced by a newborn.

A newborn oranze does not yet show any behaviour. Behaviours can be innovated at each time step. The process of innovation is influenced by: (i) the oranzes ‘state’, which depends on the behaviours an individual already possesses, (ii) the frequency of the behaviours already present in the population (“socially-mediated reinnovation” in (12)), and (iii) the genetic propensity and ecological availability locally associated to the behaviour. At the beginning of the simulations, the populations are randomly initialised with individuals between 0 and 25 years old.

**Oranze’s behaviours and state.** In the oranzes world, 64 behaviours are possible. Behaviours are divided into two categories: 32 social and 32 food-related behaviours. These figures were chosen to resemble the behavioural categories considered in (1). Behaviours serve oranzes to fulfill various goals. Oranzes have a ‘state’ that is based on how many goals are fulfilled in the two main categories of social and food-related behaviours.

In the case of social behaviours, we assume four sub-categories (‘play’, ‘display’, ‘groom’, ‘etc.’courtship’, the names are only suggestive), each with eight possible different behaviours that serve the same goal. A goal is considered fulfilled if an oranze has at least one behaviour out of the eight in the sub-category. Oranzes have a ‘state’ that is based on how many of the four goals are fulfilled. An oranze has a state value of 0.25 if, for example, it has at least one behaviour in the category ‘play’, and none of the others, and a state value of 1 if there is at least one behaviour in each sub-category.  $p_{\text{social}}$ , the probability to innovate a social behaviour, is drawn from a normal distribution with mean equal to  $1 - \text{state}_{\text{social}}$ .

Food-related behaviours are analogously divided into sub-categories. Differently from social behaviours, there is a variable number of behaviours in each sub-category. In addition, sub-categories are associated to two different ‘nutrients’,  $Y$  and  $Z$ . Here individuals need to balance their nutritional intake, so that their optimal diet consist in a roughly equal number of food for one and the other nutrient. The state, for food-related behaviours, depends on the total amount of food ingested and on the balance between nutrients. The state is calculated as the sum of each sub-category fulfilled (as above, for this to happen there needs to be at least one

behaviour present) minus the difference between the number of sub-categories providing nutrient  $Y$  and the number of sub-categories providing nutrient  $Z$ . We normalize the state between 0 and 1, and, as above  $p_{\text{food}}$  is then calculated as  $1 - \text{state}_{\text{food}}$ .

Say sth maybe (in SI?) about the somewhat arbitrariness of possible number of nutrients, which is why we choose

**Socially-mediated reinnovation.** At each time step, all oranzes have a probability of innovation for social and food-related behaviours calculated as described above. The specific behaviour an oranze will innovate depends both on the frequency of the behaviours already present in the population, and on the ecological availability and genetic propensity associated to the behaviour. A further parameter of the model,  $S$ , controls the probability that each reinnovation is socially-mediated (12). When a reinnovation is socially-mediated, the probability of innovating each behaviour  $B_i$  is weighted by its proportional instances in the population, among the behaviours of the same category, so that common behaviours are more likely to be reinnovated.

note that Social mediation is not behavior copying, the behaviour need be ind. derived instead

When the reinnovation is not socially-mediated, the probability of innovating each behaviour is random. Only one behaviour per category can be innovated at each time step.

(re-) \* extra space?

**Genetic propensity and ecological availability.** The behaviour selected in the previous step is then innovated or not according to its genetic propensity and, in case of food-related behaviours, ecological availability.

Genetic propensity is a probability  $p_g(0, 1)$ , assigned independently for each of the 64 behaviours. A parameter of the model,  $\alpha_g$ , determines the probability that the genetic propensity of each behaviour is equal for all the six populations or whether it is different. If the probability is equal,  $p_g$  is randomly drawn. If it is different, we assign the propensity using a geographical gradient. We choose a random point and calculate its distance to each population. Distances are then transformed to  $p_g$  by rescaling them between 0 and 1, so that for the farther site  $p_g = 0$  i.e. the associated behaviour will be impossible to express (see SI). Notice that  $\alpha_g = 0$  does not mean that there are no genetic influences on the behaviour, but that there are no differences between the populations with regard to this aspect.

\*\* We need to also say that genetic infl. can be very indirect, as in cognition (at least in SI)

Ecological availability is a probability  $p_e(0, 1)$  that represents the likelihood of finding a resource, or its nutritional value, in each site. Ecological availability is assigned only to food-related behaviours, and it is calculated in the same way of  $p_g$ , using the parameter  $\alpha_e$  to determine the probability of ecological availability being different in the six populations.

**Model’s output.** We run simulations for  $t_{\text{max}} = 6000$  (corresponding to 500 years of oranze-time). For each simulation, following (1), we classify each behaviour, in each population, as:

- *customary*: a behaviour observed in over 50% of individuals in at least one age class (see SI for how age classes are defined in our model).
- *habitual*: a behaviour observed in at least two individuals across the population.
- *present*: a behaviour observed in at least one individual across the population.

- *absent*: a behaviour not observed even once in the population.
- *ecological explanations*: a behaviour that is absent because of complete lacking of local ecological availability (i.e., in our model, associated to  $p_e = 0$ ).

Notice the last category in (1) (*unknown*, i.e. “the behaviour has not been recorded, but this may be due to inadequacy of relevant observational opportunities”) does not apply in our case, because we have complete knowledge of the output of the simulations.

Finally, to test how well our model compares to the results of wild apes, we calculate the same “patterns” described in (1):

- *A*: behaviour absent at no site.
- *B*: behaviour not achieving habitual frequencies at any site.
- *C*: behaviour for which any absence can be explained by local ecological factors.
- *D*: behaviour customary or habitual at some sites yet absent at others, with no ecological explanation, i.e. behaviours defined as “cultural”.

Further details of the model implementation and of how outputs are processed are available in SI. The full code of the model allowing to reproduce all our results, plus a detailed description of the model development is available in a dedicated GitHub repository, at <https://github.com/albertoacervi/oranzees>.

## Results

We are particularly interested in the realistic parameter conditions of moderate to high environmental variability (i.e.  $\alpha_e$  from 0.5 to 1) and zero to moderate genetic differences (i.e.  $\alpha_g$  from 0 to 0.5). We ran 20 simulations for each combination (for a total of 600 runs). For all, reinnovation is socially-mediated ( $S = 1$ ). The results show that various combinations of parameters produces a number of cultural behaviours (pattern *D*) consistent with the 38 found in (1), in absence of any explicit copying mechanism implemented (see Figure 1). In Figure 2, we reproduce the output of a run where 38 cultural behaviours were found, and how they were classified in each of the six simulated populations, using a visualisation inspired by (1).

We also analysed the effect of the parameter  $S$  (proportion of socially-mediated reinnovations), in three conditions (see Figure 3): (a) no genetic differences and intermediate ecological differences (compare to the high-left corner of Figure 1, where with  $S = 1$  simulations produce less than 38 cultural behaviours), (b) one of the conditions that produce good match with (1), namely  $\alpha_e = 0.8$  and  $\alpha_g = 0.2$ , and (c) intermediate genetic differences and high ecological differences (compare to the low-right corner of Figure 1, where with  $S = 1$  simulations produce more than 38 cultural behaviours). As expected, decreasing  $S$ , decreases the number of cultural behaviours. Conditions where, with  $S = 1$ , there were more than 38 cultural behaviours could still produce results analogous to (1), given that not all reinnovations are socially mediated.

Our results show that our model not only accurately reproduces the number of cultural behaviours (pattern *D*), but also

the number of behaviours classified in the other three patterns (*A*, *B*, *C*) in (1). Figure 4 shows the four patterns produced in one of the conditions for which we have a good match for cultural behaviours ( $\alpha_e = 0.8$ ;  $\alpha_g = 0.2$ ,  $S = 1$ ).

Finally, we ran 100 simulations for one of the conditions where we have a good match for cultural behaviours with (1) ( $\alpha_e = 0.8$ ;  $\alpha_g = 0.2$ ,  $S = 1$ ). In each simulation, we recorded, for each population, the number of behaviours (habitual + customary + present) that are also classified as cultural (see Figure S4). We find a small, but significant, correlation between population size and number of cultural traits ( $p < 0.00001$ ,  $\rho = 0.2$ ,  $N = 600$ ). In other words, our model reproduces the effect of cultural accumulation relative to population size possibly found in real populations - see (9, 13, 14).

\* add bracket: (i.e. increased number of expressed behaviors) [because most people still not familiar with the difference]

## Discussion

We developed an individual-based model to examine under which conditions a distribution of behavioral traits analogous to the distribution reported in (1) in chimpanzees could emerge, crucially, without allowing for the existence of any copying mechanism. We implemented several details of the original study, including realistic demographic and spatial features, as well as effects of genetic propensity and ecological availability on the behaviours. Given the widespread availability of non-copying variants of social learning, we also included socially-mediated reinnovation, where social learning merely catalyses individual reinnovation (12).

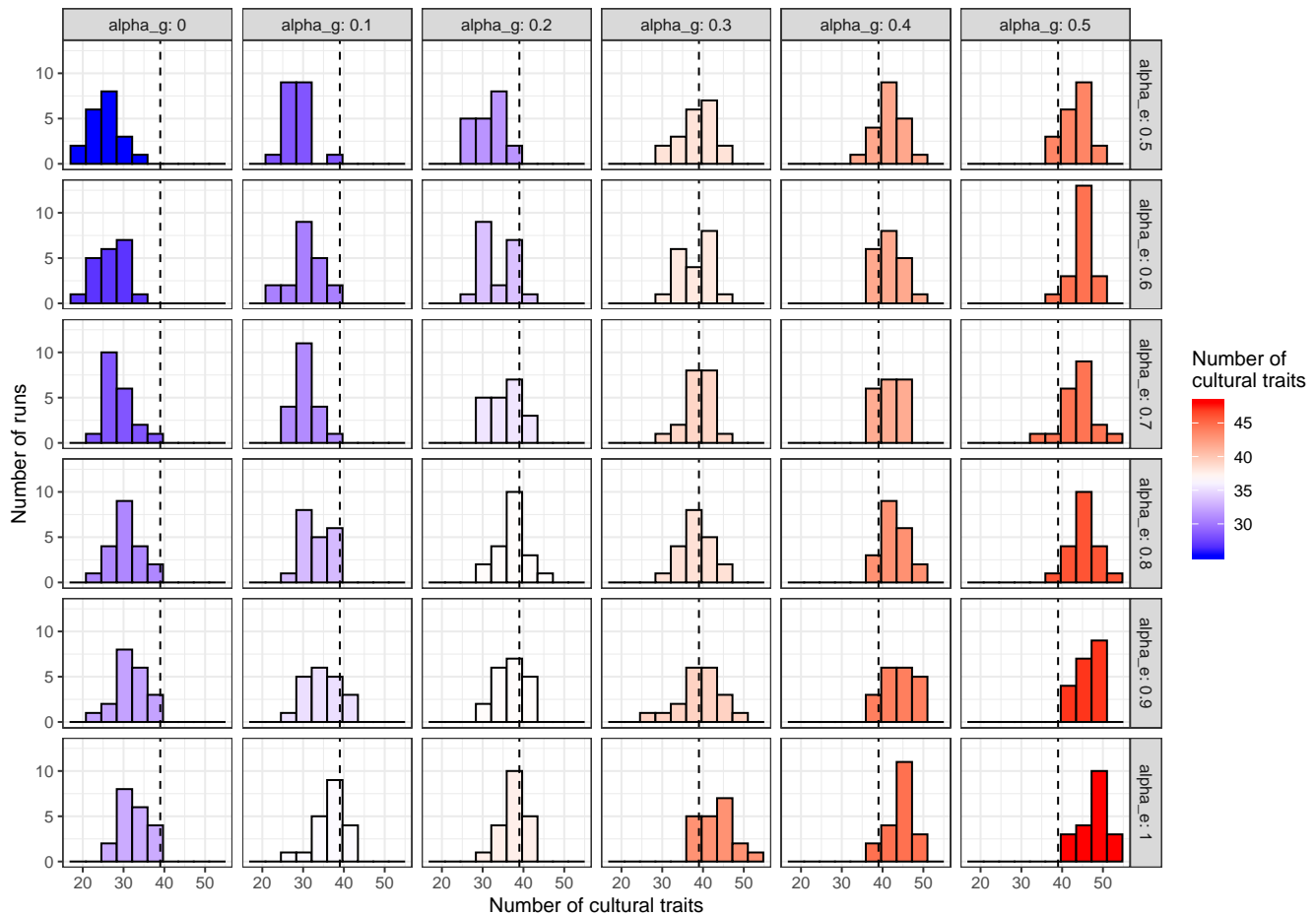
Our main result is that we can reproduce the pattern observed in populations of chimpanzees under realistic values of the parameters of genetic propensity and ecological availability, namely null to medium importance of genetic variation, and medium to high importance of ecological variation. Our model cannot precisely determine which exact values of parameters reproduce real populations of chimpanzees (or other apes). However, we are confident that the range of values explored, and the relative ease by which patterns of cultural behaviours similar to (1) can be produced, strongly suggest that copying is not required for those patterns to emerge. Therefore, ape-like cultural patterns do not pinpoint copying abilities. In addition, and as further support to our results, our model not only reproduces the cultural behavioural patterns, but also the proportions among the other patterns, i.e. absent behaviours, behaviours not achieving habitual frequencies at any site, and behaviours absent because of ecological factors.

In our model, we focused on the mechanism of socially mediated reinnovation, that is, we assumed that members of our hypothetical species, oranzees, had a probability to reinnovate a specific behaviour stochastically linked to how many other oranzees in the population were already showing this behaviour. While this is a realistic assumption (15) and it reproduces in our model the chimpanzees cultural pattern observed in realistic conditions, our results demonstrate that it is not necessary. Given certain combinations of parameters, such as higher genetic and ecological diversities, the same population level pattern can even be obtained when reinnovation is not socially mediated, i.e. if oranzees are not influenced by the behaviours of the other individuals. in their populations

Finally, our model reproduces a correlation between population size and number of cultural traits in the six populations. The magnitude of the effect is small, which is to be expected,

\* whats missing in main text above, early on, is a justification/highlighting for the possible numbers (64).





**Fig. 1.** Number of cultural traits in oranzes, when varying ecological and genetic diversity. Red colour indicates simulation runs that produced more than 38 cultural behaviours; blue colour indicates simulation runs that produced less than 38 cultural behaviours. For all simulations,  $S = 1$ ,  $\alpha_e$  and  $\alpha_g$  as indicated in the plot.  $N = 20$  runs for each parameters combination.

I know you love this figure, and I understand why. But I would strongly suggest the following: put the big figure 1 into SI (linked to here) and here instead put a reduced figure with the key finding, i.e. selected cells only, to make the same story in a much smaller space. The "Wow figure" (below) should be the real centerpiece in main MS.

given that the presence of this correlation in real populations of (human and non-human) apes is currently debated ((16)). Again, this correlation is brought about without copying, so that there is no need to invoke specific cultural reasons (e.g. (17)) to explain such pattern.

More generally, the results of our models suggest caution when deriving individual-level mechanisms from population-level patterns (see also (18, 19)). Cultural systems, as many others, often exhibit equifinality: the same global state can be produced by different local processes\*. Models and experiments are crucial to test the plausibility of inferences going from global to local properties.

In conclusion, our model strongly suggests that the data

available on the behavioural distributions of chimpanzees populations cannot demonstrate that chimpanzees possess cultures influenced by copying, let alone requiring copying. This, in turn, may provide an explanation to why ape cultures are not cumulative. : if cumulative culture requires behavior copying, we should not expect a species lacking this mechanism

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\*add (e.g. patchy patterns of behaviors come about with and without behavior copying)

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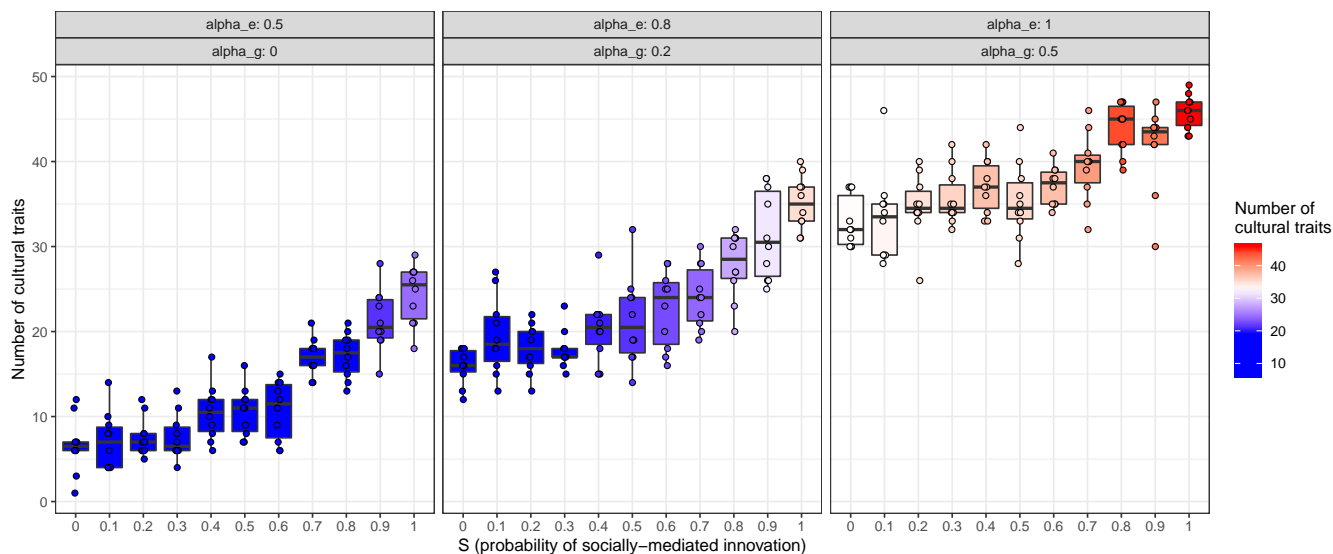
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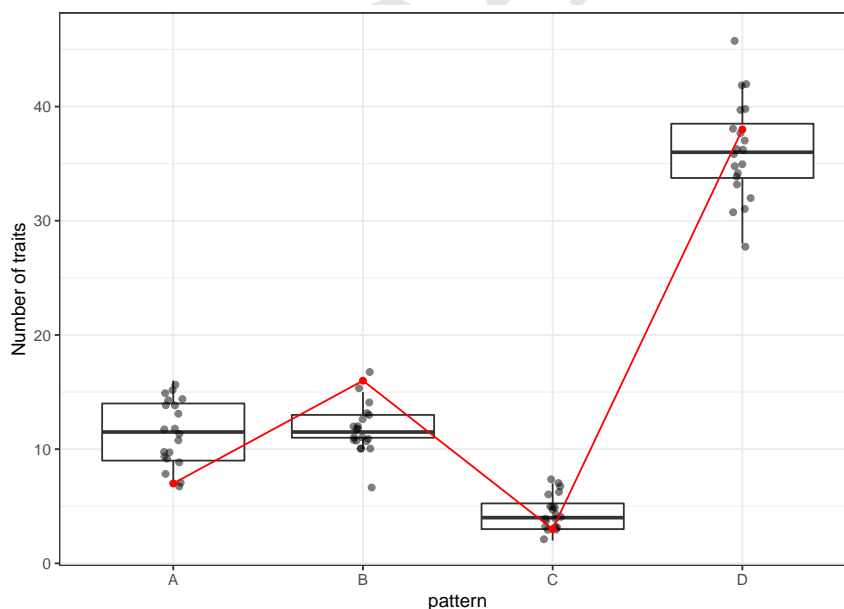
**Fig. 2.** Example of a simulation run that produces 38 cultural behaviours ( $S = 1$ ,  $\alpha_e = 0.8$ , and  $\alpha_g = 0.2$ ). Color icons indicate customary behaviours; circular icons, habitual; monochrome icons, present; clear, absent; horizontal bar, absent with ecological explanation. The names of the behaviours are only suggestive, see SI for a complete list.

Figure 2 should be centerpiece inside



**Fig. 3.** Cultural traits in oranzees, varying the probability of socially-mediated innovations. Red colour indicates simulation runs that produced more than 38 cultural behaviours; blue colour indicates simulation runs that produces less than 38 cultural behaviours.  $S$ ,  $\alpha_e$  and  $\alpha_g$  as indicated in the plot.  $N = 10$  runs for each parameters combination.

Into SI I think



**Fig. 4.** Number of behaviours for each of the four patterns (\*A\*, \*B\*, \*C\*, \*D\*) for the parameters  $\alpha_e = 0.8$ ;  $\alpha_g = 0.2$ ,  $S = 1$ . The red values are the values described for real chimpanzee populations.  $N = 20$  runs.

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