



# WHAT CAN WE LEARN FROM ABSENT CUES?

Master's Project Thesis

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**Abstract:** (250 words, placeholder) Far far away, behind the word mountains, far from the countries Vokalia and Consonantia, there live the blind texts. Separated they live in Bookmarksgrove right at the coast of the Semantics, a large language ocean. A small river named Duden flows by their place and supplies it with the necessary regelialia. It is a paradisematic country, in which roasted parts of sentences fly into your mouth.

Even the all-powerful Pointing has no control about the blind texts it is an almost unorthogonal life. One day however a small line of blind text by the name of Lorem Ipsum decided to leave for the far World of Grammar. The Big Oxmox advised her not to do so, because there were thousands of bad Commas, wild Question Marks and devious Semikoli, but the Little Blind Text didn't listen. She packed her seven versifier, put it in the belt and made her way. When she reached the first of the great many cities, she said to herself, 'This will be a last view of the skyline of my hometown Bookland.' Then she went on and on, and the sun was in the sky. On her way she met a little blind text who said to her, 'You should have introduced the topic, so I think the part starting "There is still a lot that we do not know..." isn't really necessary anymore. I would then introduce EDL a bit more. E.g. some literature showing that people learn through EDL.'

I really like how you took the ideas and applied them to real world experiences to understand the implications. For a formal piece of writing, this could be more precise and succinct. Making things succinct is quite a challenging part of writing and takes practice, so we can discuss how to do this if you like.

I would suggest merging the first two paragraphs into one - a very nice introduction. Then go straight into introducing the possible answers to this question - you have already nice introduced the topic, so I think the part starting "There is still a lot that we do not know..." isn't really necessary anymore. I would then introduce EDL a bit more. E.g. some literature showing that people learn through EDL.

## 1 Introduction

nice intro

You are the first pirate space explorer to set foot on a new planet. Everything here is new and you have no idea what all these different shaped objects are. All you know is that you are going to search for treasure. How will you learn all these new concepts and if they will lead to treasure or not?

I'd suggest "Imagine you are..."

When we first come into this world all input is new and we still need to learn everything. We often see this when taking experiments where they provide stimuli that do not relate to anything else that we know in real life as well. So then how do we learn these new concepts?

Formatting: apart from the first paragraph under the heading, indent first line of each paragraph.

There is still a lot that we do not know about learning. Often research focuses on smaller theories that explain how learning works in a constrained domain, such as small tasks done in a lab, after which they then try to extrapolate that to other forms of problem solving and learning. One theory that actually has been shown to work in multiple domains (e.g. word learning, social psychology, category learning and more, see Siegel and Allan (1996) for review) and is therefore not constrained to explaining only one part of learning, is Error Driven Learning (EDL). In this theory the main goal when learning something, is minimising the uncertainty about upcoming states in the world. To give a concrete example of this, let's say you

good

nice

detector in your house and you see the light blink on it. You are not quite sure what it means, but the next day you hear it beep like it does when the batteries are empty. There is now a connection between the light blinking, the cue, and the batteries of the detector being empty, the outcome. However on that same day as you saw the lights blink just as you got out of the shower and the hallway was a bit steamy as well. So there is also a connection between the light and the shower steam. There is still uncertainty. The day the empty battery beeps, the connection between the light and the shower steam is weakened, while the connection between the light and the detector's batteries is strengthened. This way uncertainty about the world is reduced.

S2 seems to get away from real world stuff a bit. Maybe remove?

This is a practical example of what EDL is. However there are different proposals on how the exact mechanisms behind EDL should work. In this research we will disentangle two of those mechanisms, to hopefully gain more insight into happens when learning new concepts.

nice sentence

First it is important to understand that Error Driven Learning might be an implicit process. Ramscar et al. (2013) looked at how adults and children learn in the context of Error Driven

This is great, but I would shift the implicit question down after introducing the main question of EDL and learning from absent cues.

very nice paragraph

Learning. They found that children showed different results in a word learning task than adults, which they attributed to adults applying reasoning strategies whereas children only seemed to use implicit learning. The reason for that is that the prefrontal cortex, the part of the brain responsible for processes such as logic or reasoning (explicit inference), is not fully developed in children yet. The development of the prefrontal cortex might be responsible for the difference in results between children and adults, as it allows adults to use explicit task strategies, while children cannot use those yet. Children's results looked more similar to what EDL predicts would happen, while the adults diverted from that prediction. Implicit learning, according to Reber (1989), is best done without interference from logic and reasoning. Therefore explicit inference might get in the way of EDL taking place, if EDL is indeed an implicit process.

interfere with EDL (more formal style)

The first of the two models that attempt to describe the underlying mechanisms of Error Driven Learning, is the Rescorla-Wagner model (1972). The (simplified) formalisation of this model can be seen in Equation 1.1.  $\Delta V_{ij}^t$  is the change in weights between cue  $i$  and outcome  $j$  at a certain time and  $\eta$  is the learning rate (typically set to 0.01). In the original paper  $\eta$  is replaced by  $\alpha$  and  $\beta$ , where the first is the learning rate for the cue and the second the learning rate for the outcome. However the current form is more similar to the Delta formula (Wasserman et al., 1993), and is chosen this way to limit the amount of parameters to fine-tune when modelling this process.  $act_j^t$  is the activation of outcome  $j$ , which is the sum of the connection weights for the present cue.

great

$$\Delta V_{ij}^t = \begin{cases} 0 & , \text{cue } i \text{ absent,} \\ \eta(1 - act_j^t) & , \text{cue } i \text{ and outcome } j \text{ are present,} \\ \eta(0 - act_j^t) & , \text{cue } i \text{ present but outcome } j \text{ absent} \end{cases} \quad (1.1)$$

This formula states that if a cue does not appear, then there is no change to the connection between the cue and outcome. So if you do not see the light blink, regardless of whether the smoke detector beeps the next day or not, there is no change to the connection. This is shown in the first part of the equation. The second part shows that if a cue appears and the outcome is present, the connection between them is strengthened. If the cue appears and the outcome is absent, then the connection between the two is weakened (see line three).

The reason they do not change the weights if the cue is not present, is that Rescorla and Wagner focus on the informativeness of a cue. If a cue does not appear, then that cue is therefore not informative about a certain outcome and thus

should be updated to the weights.

nice

Error Driven Learning has some other important characteristics too that we will discuss here. One of the main features of EDL is that it does not only work by association, but also by disassociation. We can see how this works in the last part of Equation 1.1, when there is a cue but the outcome does not show up. Here the connection weight of the cue to the outcome would go down. This is to ensure that the weights are updated in respect to the whole network. This would ideally result in only one outcome being expected at a point in time, while all others are discarded.

However in the example we said that if we do not have shower steam and we do have a blinking light then this cue and outcome would also disassociate and their connection becomes weaker. This in contrast to the Rescorla-Wagner model stating that if a cue does not appear (shower steam) then there is no update to the weights. So how does this lead to a lower connection? This happens in a process called cue competition. All of the weights to the outcomes should add up to one together, this means that there are limited resources and the more cues are seen, the fewer those resources are. Each of the cues are competing for informativity and therefore the resources diminish as the learning process continues on. This leads to a process described by Kamin (1967) as the blocking effect. If one outcome is already highly predicted by other cues, and the resources are already divided, then a new predictive cue will have more difficulty to get to the same connection strength as the rest.

This also leads into another aspect of EDL, that it takes each time step as a separate step, so temporal order matters. This is why the new predictive cue later has more difficulty to reach the same strength of connection, unless it is presented predictive over a long period of time.

One aspect is for example less important in statistical learning where input is presented in batches and the temporal order then does not matter much.

In the same vein as cue competition, EDL also has outcome competition. Until now in our example there have been multiple cues, but not multiple outcomes. If we do have multiple outcomes but only very few cues, it is difficult to fully reduce uncertainty, as one cue cannot fully predict multiple outcomes. Therefore the goal of outcome competition is to get the probability of a certain outcome given a cue.

All of these things lead to the fact that an EDL network is asymmetric. There are no associations between cues and outcomes, but rather an association of a cue with an outcome.

I didn't

find this very clear on first reading. How about: Learning does not lead to two-way associations between cues and outcomes. Rather, cues predict outcomes, but not vice versa.

In our simulations only one outcome occurs at a time, but it's also possible for multiple outcomes to occur. Maybe rephrase as an important part of learning is learning what not to expect

will not develop

It's not so much about the actual presentation, but rather the conceptualisation of what affects learning. In statistical learning the input is \*calculated\* in batches and the temporal order is not \*taken into account\* in the theory.

not probability, but expectation. (it's more complex than simple probability).

As already mentioned ~~before~~, Rescorla and Wagner said that if a cue is not present, the cue is not informative and therefore there is no update to the weights. Several researchers did not agree with this, for example Markman (1989), who stated that we often actively encode certain features as missing. Tassoni (1995) also stated that an absence of a stimulus could just be information about the correlation between that stimulus (or cue) and outcome as well. One of the main theories that agrees with this stance of a missing cue being informative (and even based their model on that of Markman), is that of Van Hamme and Wasserman (1994), whose model is the second model of Error Drive Learning that we will discuss in this paper. Van Hamme and Wasserman proposed that accounting for absent cues is something that *is* necessary in describing Error Driven Learning. While they agree with Rescorla and Wagner on the second and third line of Equation 1.1, they introduce an addition to the equation. If we look at our smoke detector example from before, not seeing the light but either hearing or not hearing the smoke detector go off, should be treated differently according to Van Hamme and Wasserman. The formalisation of their theory can be seen in Equation 1.2. While they, just as Rescorla and Wagner, give an  $\alpha$  and  $\beta$  as the learning rates for the cues and outcomes respectively, here we simplified that again into one learning rate of  $\eta$ .

Firstly they propose a decrease in strength in connection when the cue is not there but the outcome is, as can be seen in the first line. They actively encode a missing cue as *absent* and do this by setting the learning rate  $\eta_1$  to -0.01 instead of its normal positive value of  $\eta_2$ . Secondly there is an increase in connection strength when neither cue nor outcome is present, as can be seen in the second line of Equation 1.2. In this line the value of the learning rate is negative as well. So while the first and second line look like they are the same as the third and fourth, they will lead to opposite connection strengths.

$$\Delta V_{ij}^t = \begin{cases} \eta_1(1 - act_j^t) & , \text{cue } i \text{ absent but outcome } j \text{ present,} \\ \eta_1(0 - act_j^t) & , \text{cue } i \text{ and outcome } j \text{ absent,} \\ \eta_2(1 - act_j^t) & , \text{cue } i \text{ and outcome } j \text{ are present,} \\ \eta_2(0 - act_j^t) & , \text{cue } i \text{ present but outcome } j \text{ absent} \end{cases} \quad (1.2)$$

Van Hamme and Wasserman performed an experiment in the same paper they propose the adjustment in to see if it predicted behaviour correctly. In this experiment, participants had to determine if certain foods resulted in an allergic reaction or not. They had 48 participants divided over 6 groups and each participant saw 3 sheets.

Here's a nice example of the particular style used in academic writing. In the brackets I would just write "(e.g. peanuts, shrimp and yoghurt)". If necessary, you can add "respectively" at the end.

One sheet consists of 3 types of food A, B and X (e.g. A is peanuts, B is shrimp and X is yogurt). X is always seen and A and B both 50% of the time. This means that participants saw either A and X together or B and X together in any given trial. Whether the foods lead to an allergic reaction or not depended on the condition. After each trial, of which there were 16 per sheet, Van Hamme and Wasserman explicitly asked participants for ratings. These ratings reflected how likely participants thought the three food items were to result in an allergic reaction or not. They were especially interested in the rating of the food that was not present in the trial, so either A in a BX trial or B in an AX trial. The ratings given were on a scale from 0 to 8, with 0 indicating that these foods were very unlikely to cause an allergic reaction, 4 was neutral and 8 was very likely. Participants were given as much time as they needed to fill in their ratings. After the 16 trials they were not asked for an overall score.

Van Hamme and Wasserman found that if a certain cue is present, the ratings increase over time when there is an outcome present and decrease an outcome is not present. This is both in line with what they expected and with the Rescorla-Wagner model predicts. If no cue present and there is an outcome ratings decreased over time. If there and no outcome, then the ratings increase is in line with the addition to the Rescorla-Wagner model that Van Hamme and Wasserman

However asking these ratings in this manner could lead to explicit in the process of implicit learning, as with what Reber found. Therefore this might be explained by participants' strategies, and thus not reflect pure learning. This means that we cannot be sure if the findings of Van Hamme and Wasserman's research are due to Error Driven Learning, or due to logic and reasoning.

The paper itself had some other problems as well. While they did find evidence *in the direction* of their hypothesis, only one out of thirty t-tests differed significantly from zero.

Added to this is that in working with cues such as food that predict an allergic or not outcome, there will be certain pre conceived notions about certain foods. For example peanuts and walnuts are foods that are known for causing allergies and they were in the experiment. While they were not in the same food group (A, B, or X) they would give people a certain bias to an answer.

The goal of this paper is to find out which of these two mechanisms actually lies behind

Some of the verbs are in present tense. would put them into past tense

This paragraph is in line with what we initially planned, but due to your results, we can actually add something about modelling here. Before this paragraph you could add another one, e.g.: "However, VHW did not run simulations of their predictions...." and describe that you will run simulation to generate formal predictions of the two model variants

this may just be me and it's not very important, but to me it seems like the first lines should be the parts that agree with RW and the new lines after

Error Driven Learning and whether or not it is an implicit process. Will we find learning in the absence of cues?

We will try to answer this question by replicating the findings that Van Hamme and Wasserman (1994) found with different cues and more participants. We want to reduce biases introduced into the experiment by using non-existing stimuli and increase the statistical power by increasing the number of stimuli and trial types. The latter will in turn help to mask the goal of the experiment and will thus help to reduce the amount of explicit reasoning taking place during the experiment as well.

We expect that by manipulating the presentation speed of the cues, we will find a difference in what participants learn in the slower presentation speed (room for explicit inference) and the fast presentation speed (forced implicit learning).

To model both the Rescorla-Wagner model and the Van Hamme and Wasserman model, we will use, amongst other papers, a paper by Hoppe et al. (n.d.). In this paper they go over the different ways to model Error Driven Learning with a simple neural network and on how to interpret the results.

We will use computational simulations with these models to find the amount of trials or stimuli that would work best for the experiment on human participants.

## 2 Methods

## 3 Results

## 4 Discussion

## 5 Conclusions

## 6 Acknowledgements

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nice

Rescorla and  
Wagner

## A Appendix

## B Appendices