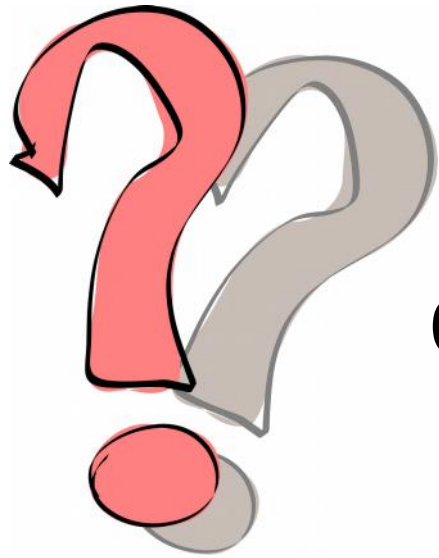


# Predicting implicit and explicit questions

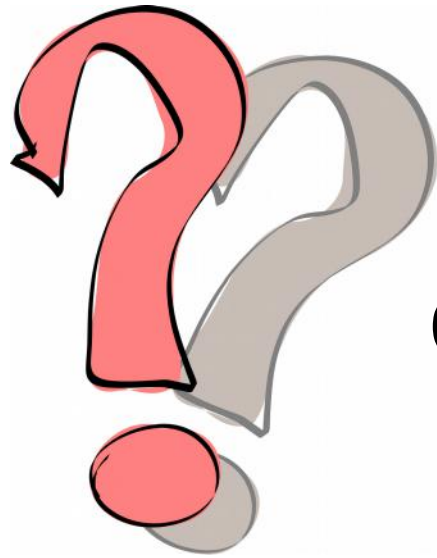


Matthijs Westera

COLT kick-off workshop



# Predicting implicit and explicit questions



Matthijs Westera

COLT kick-off workshop

= Computational Linguistics  
& Linguistic Theory



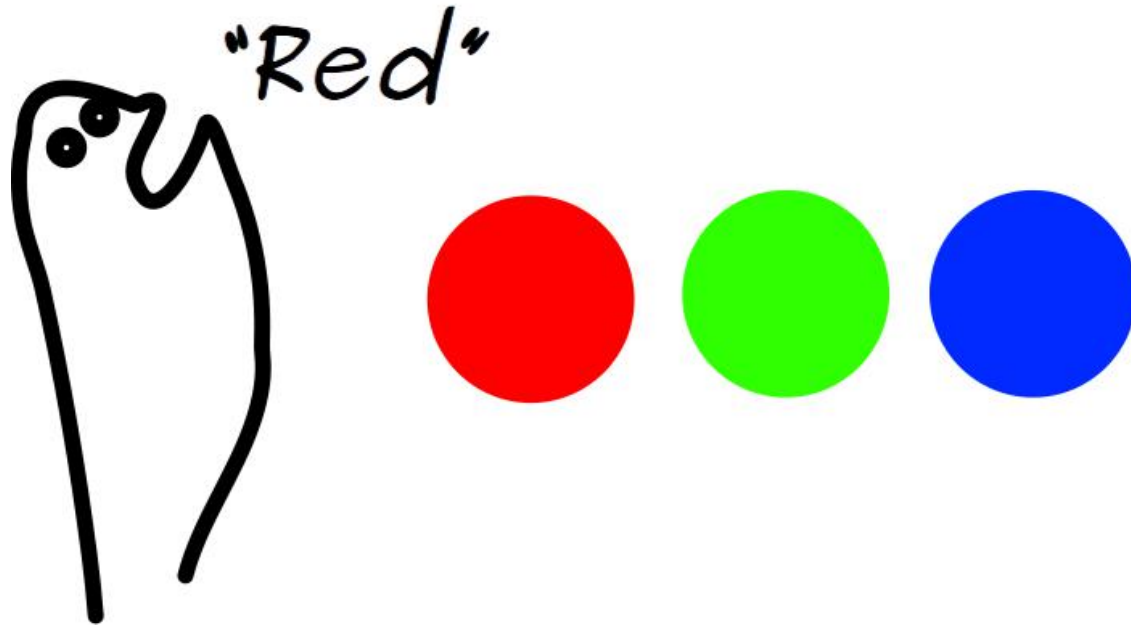
**The data of linguistic theory:**

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(Semantics & Pragmatics)

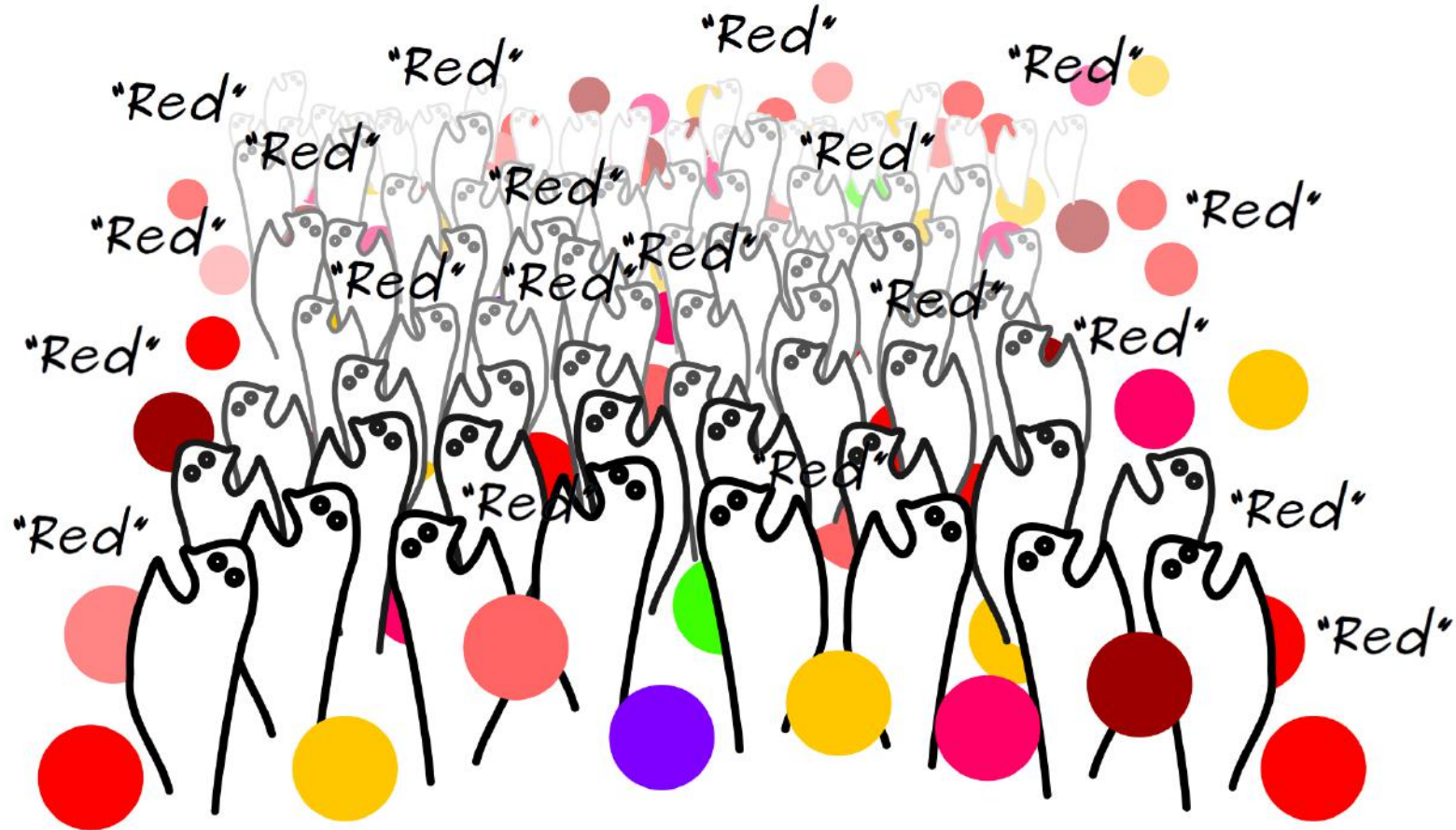
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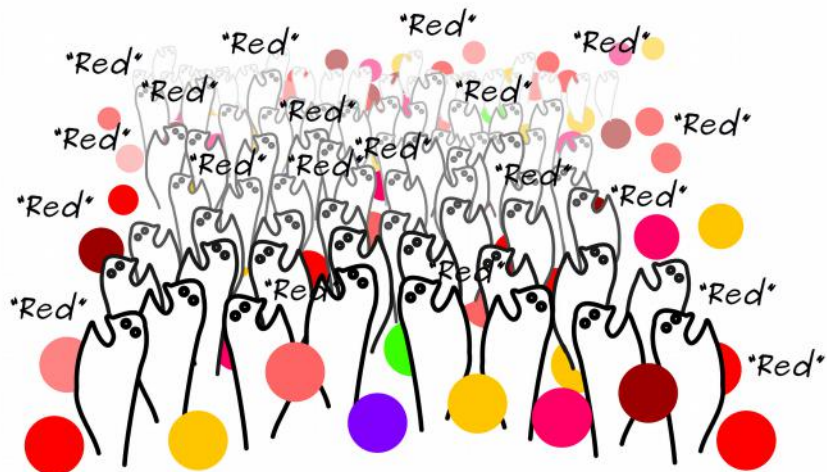
**The data of computational ling:**

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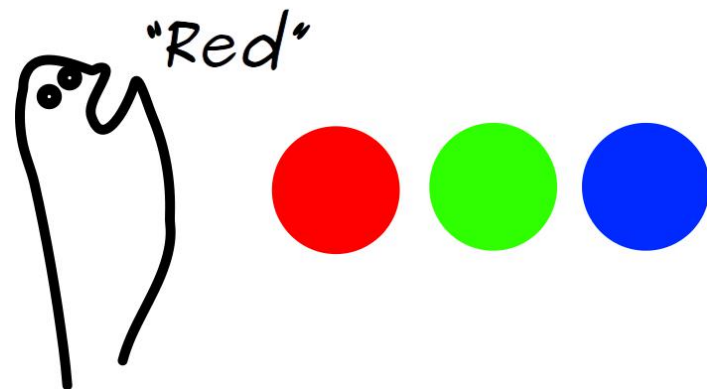


# Main interest

messy



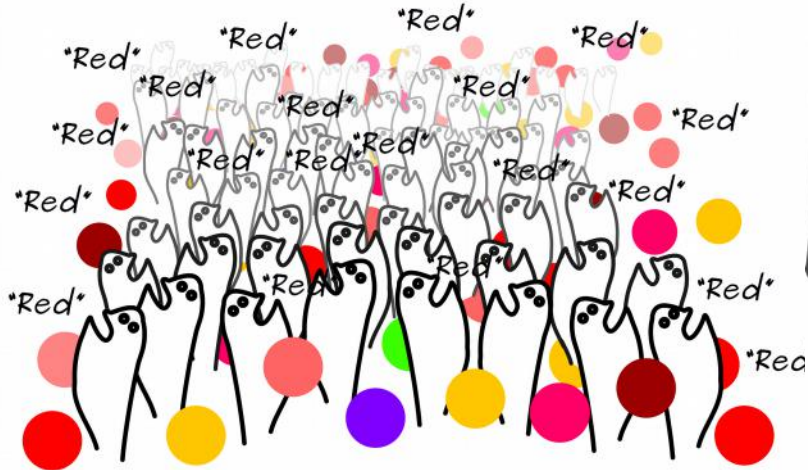
crisp





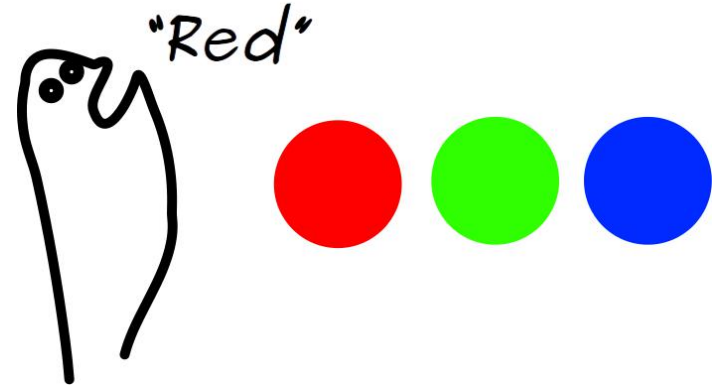
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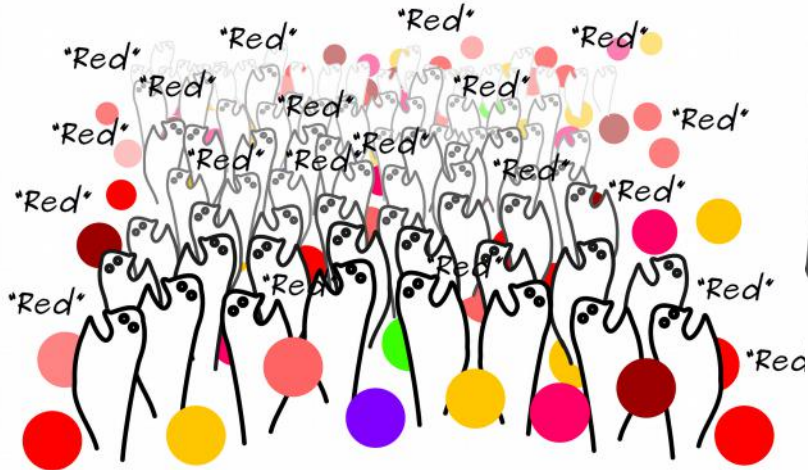
enables

crisp

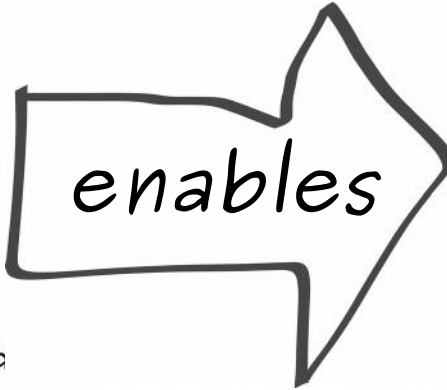
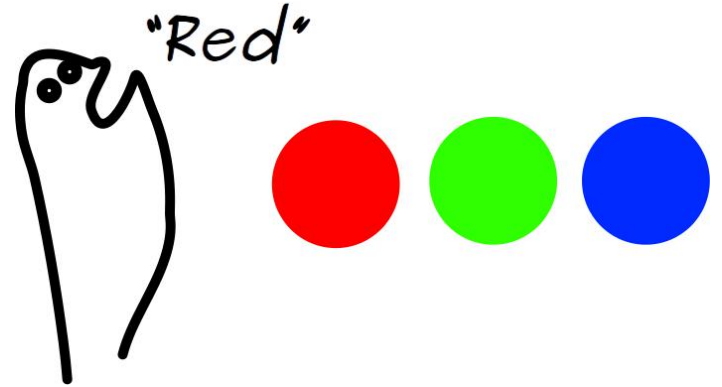


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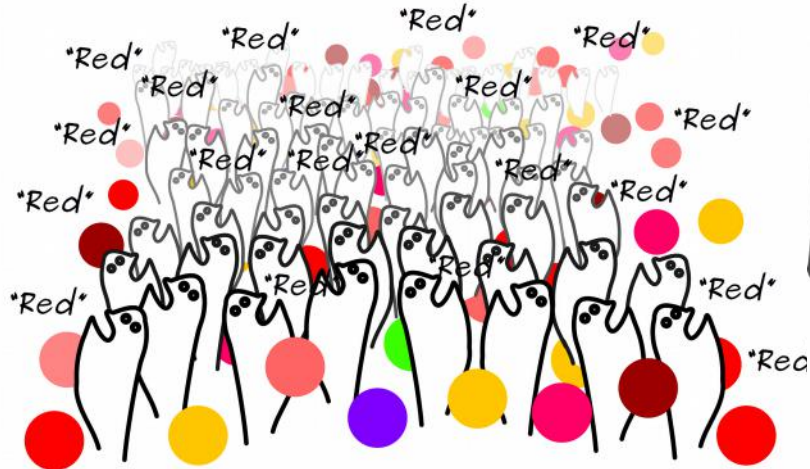
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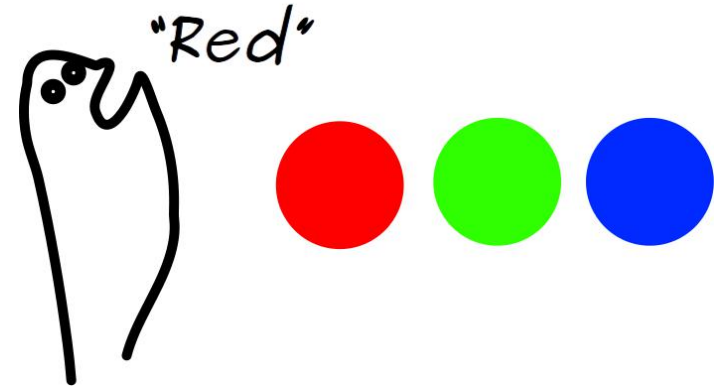
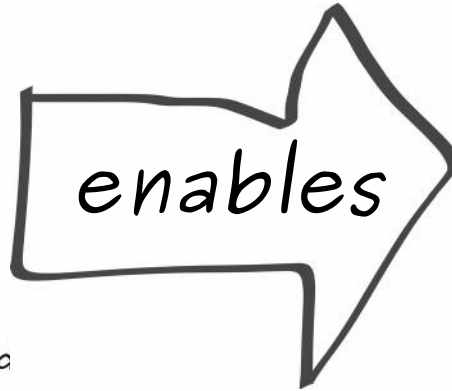
How?

# Main interest

messy



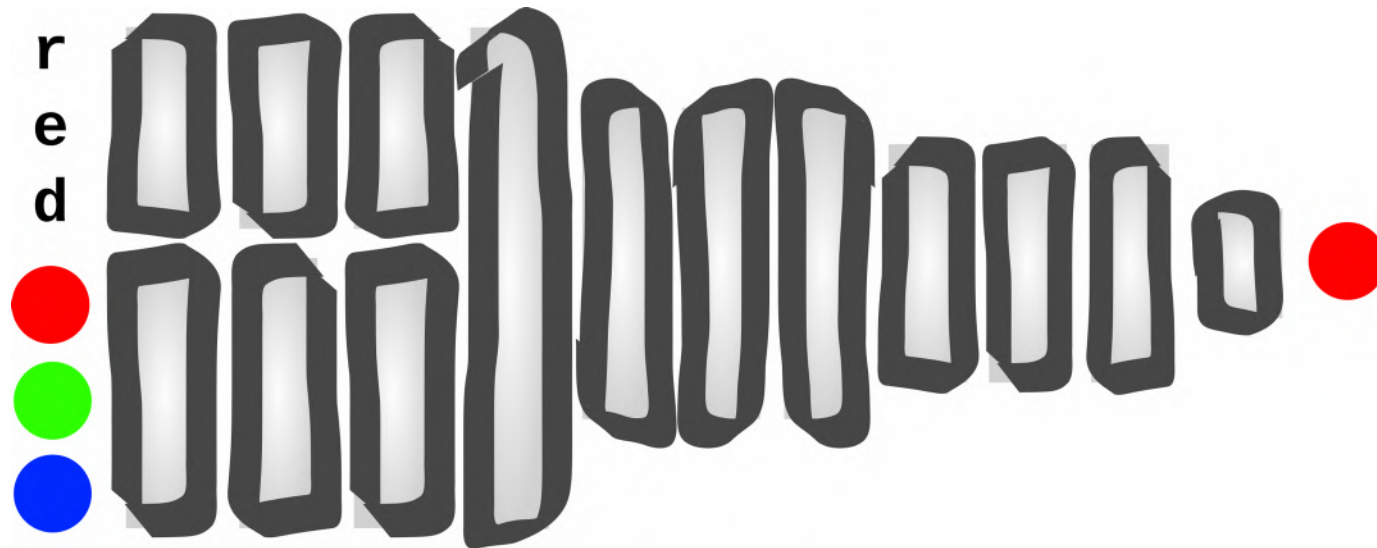
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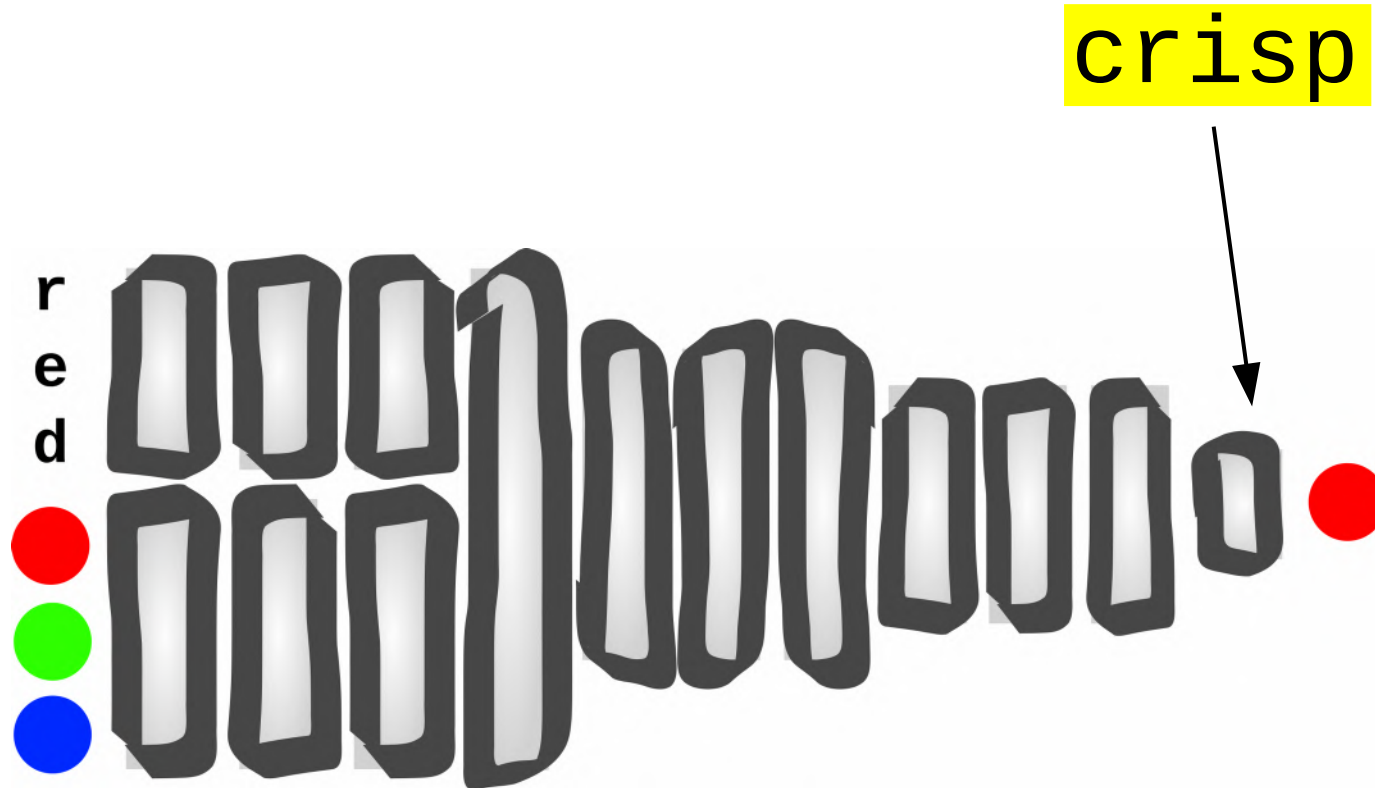
How?

- ...?
- ...?
- ...?

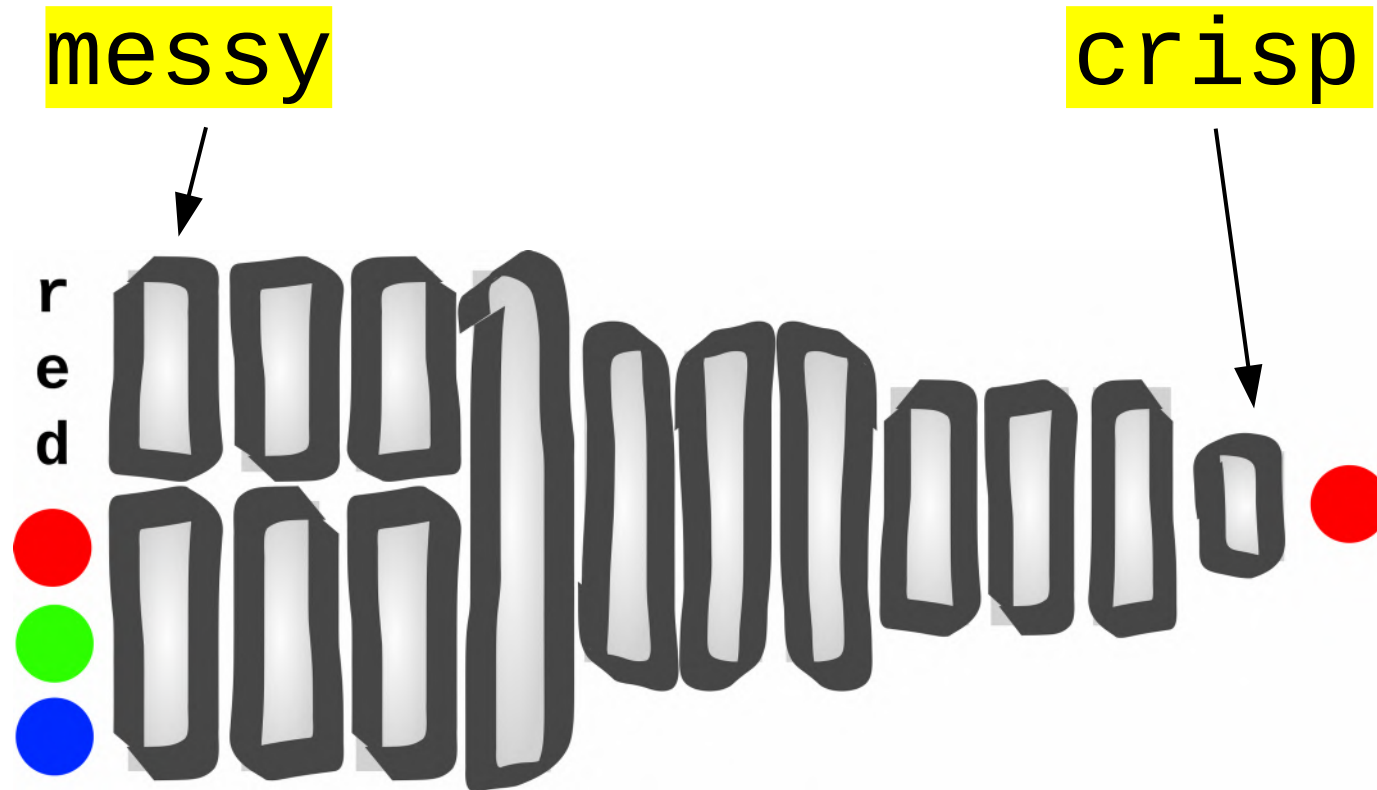
# Neural networks



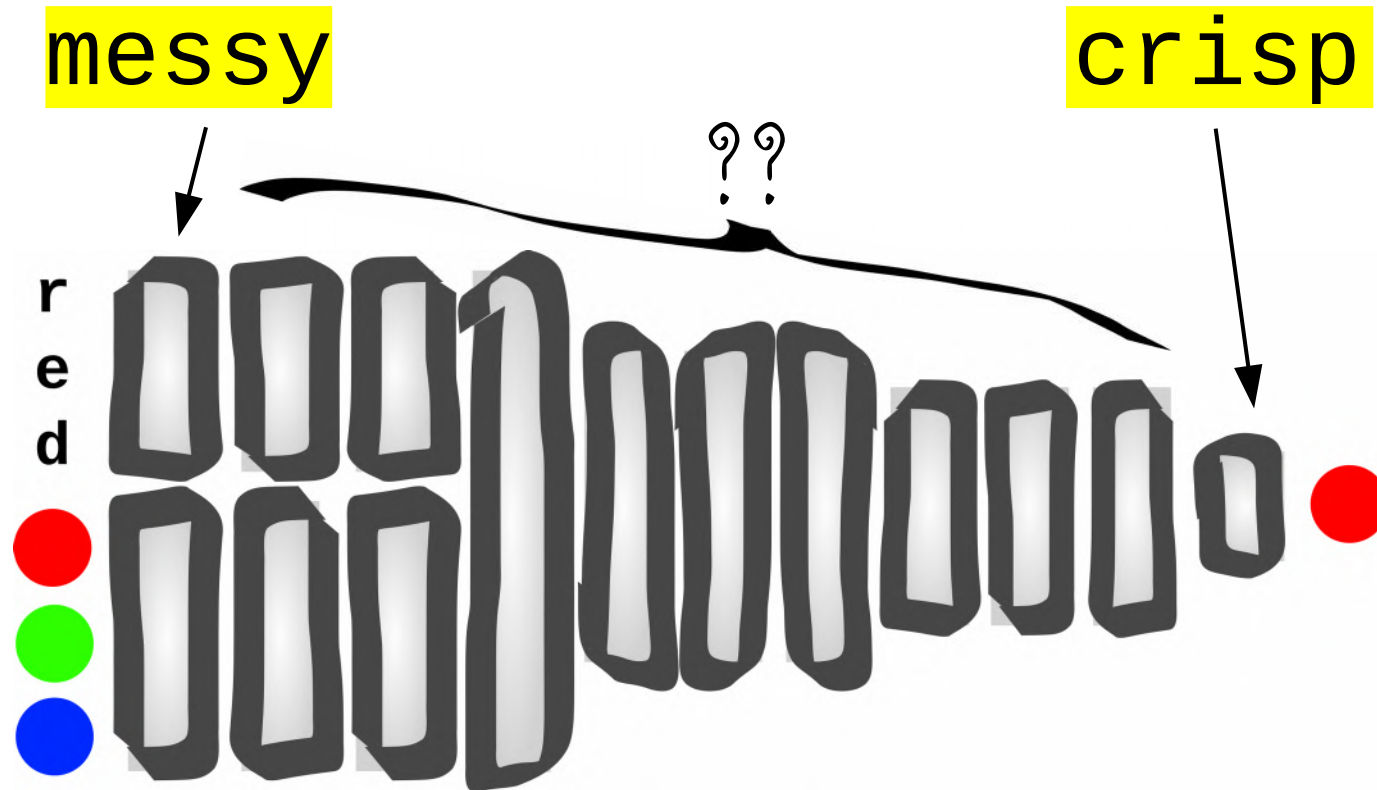
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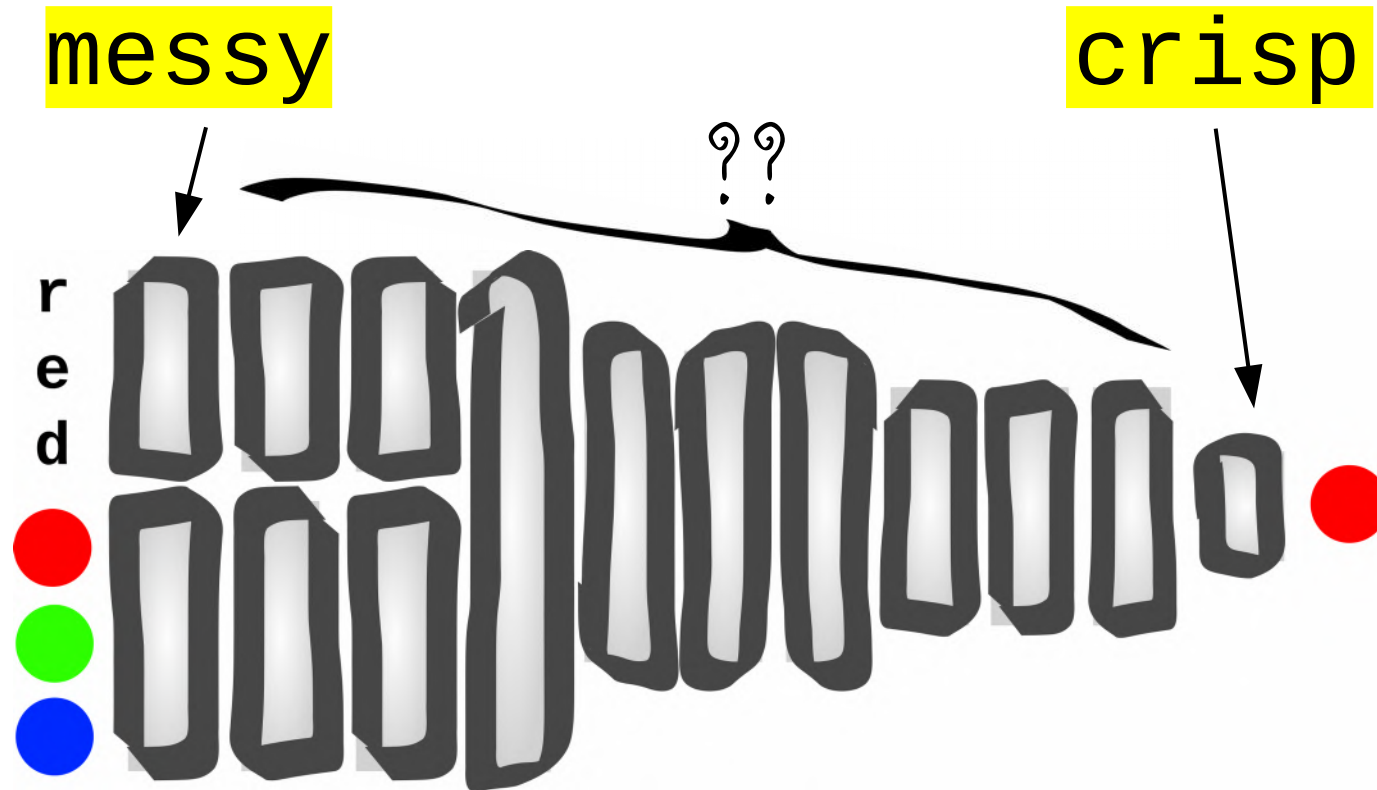
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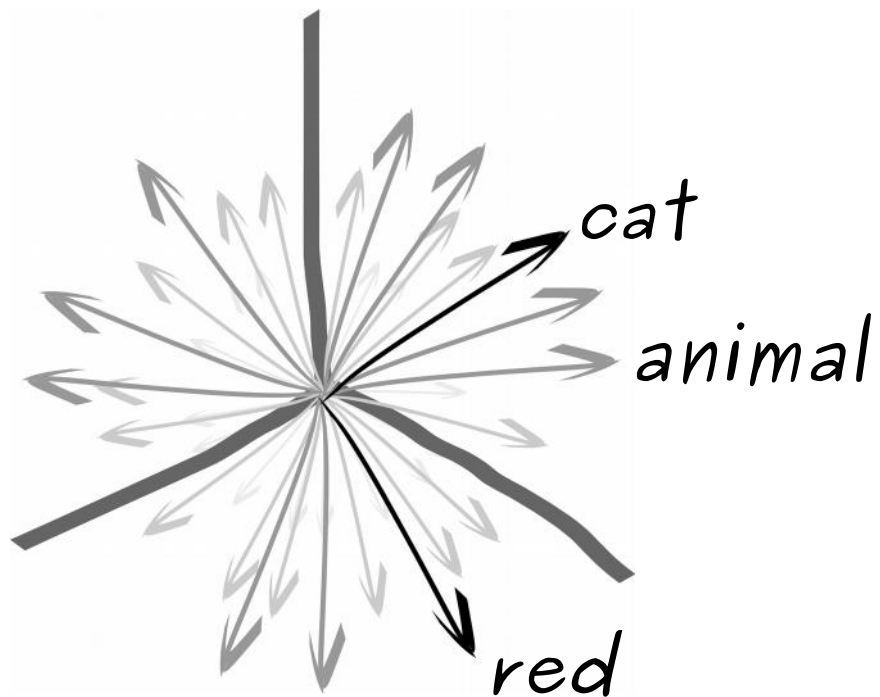


cf. Aina et al. (2018) [SemEval]



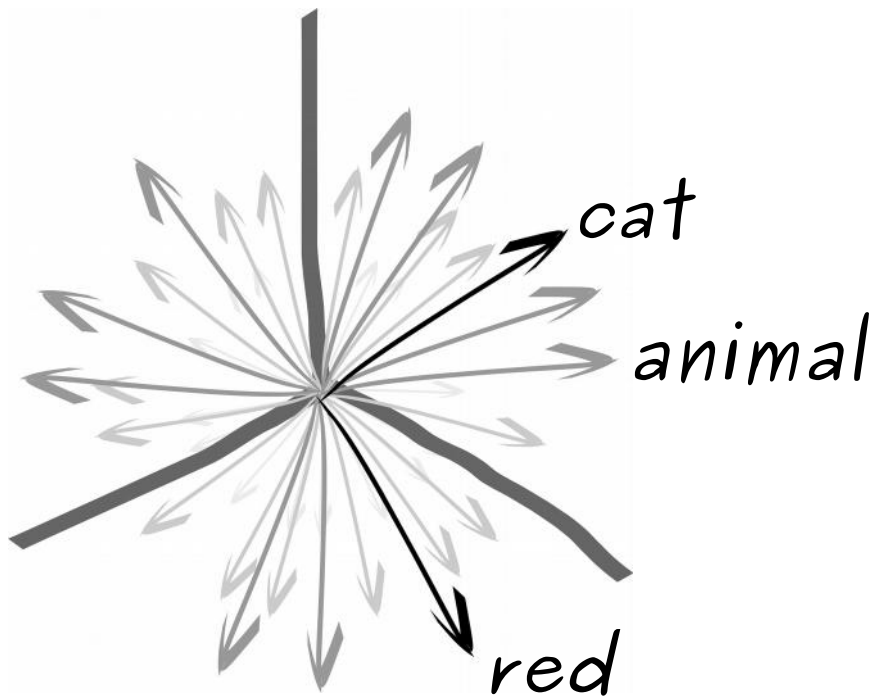
# **Distributional & formal semantics**

# Distributional & formal semantics



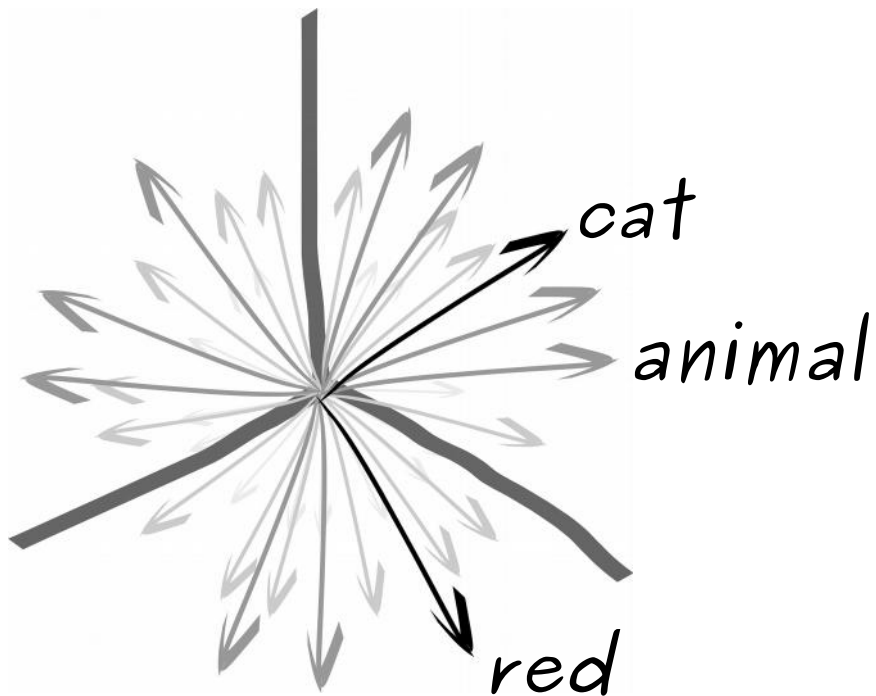
# Distributional & formal semantics

messy



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messy

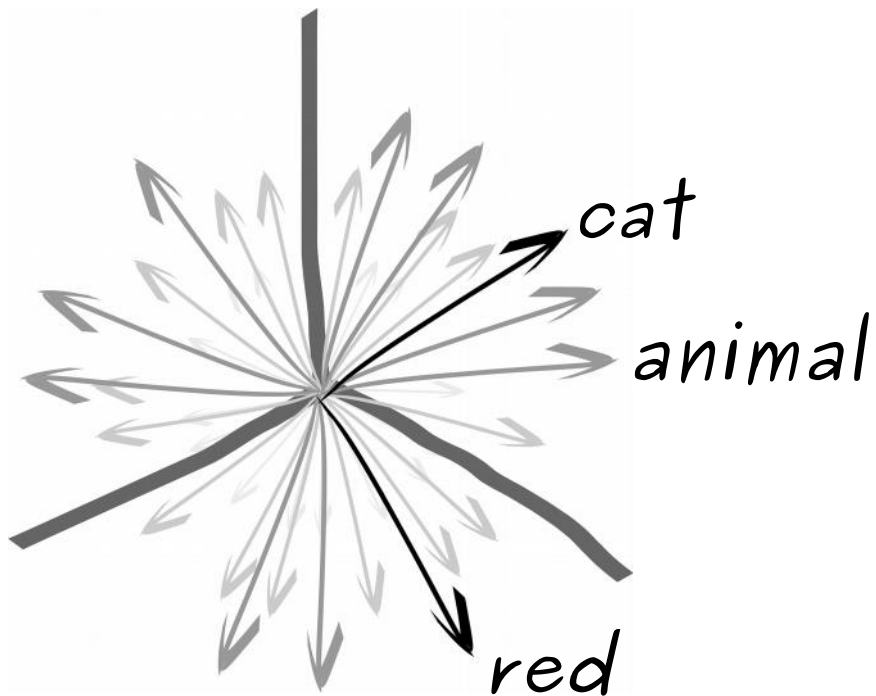


$\exists x (\text{RED}(x) \wedge \text{CAT}(x))$

# Distributional & formal semantics

messy

crisp

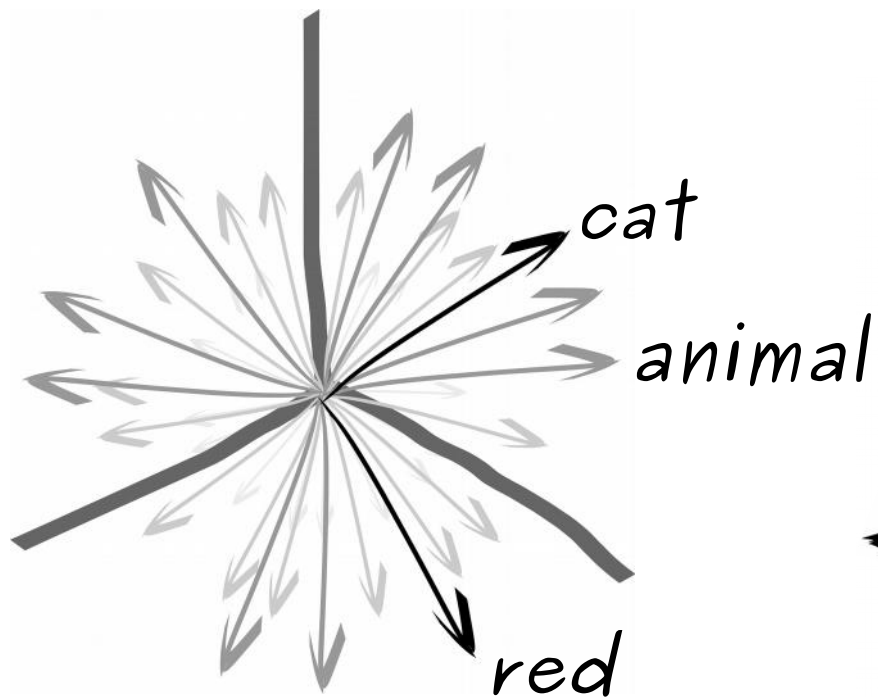


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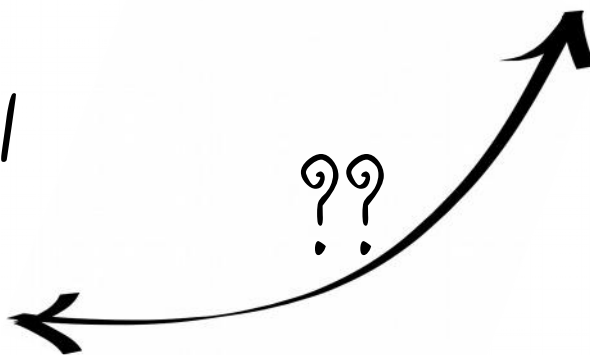
# Distributional & formal semantics

messy

crisp



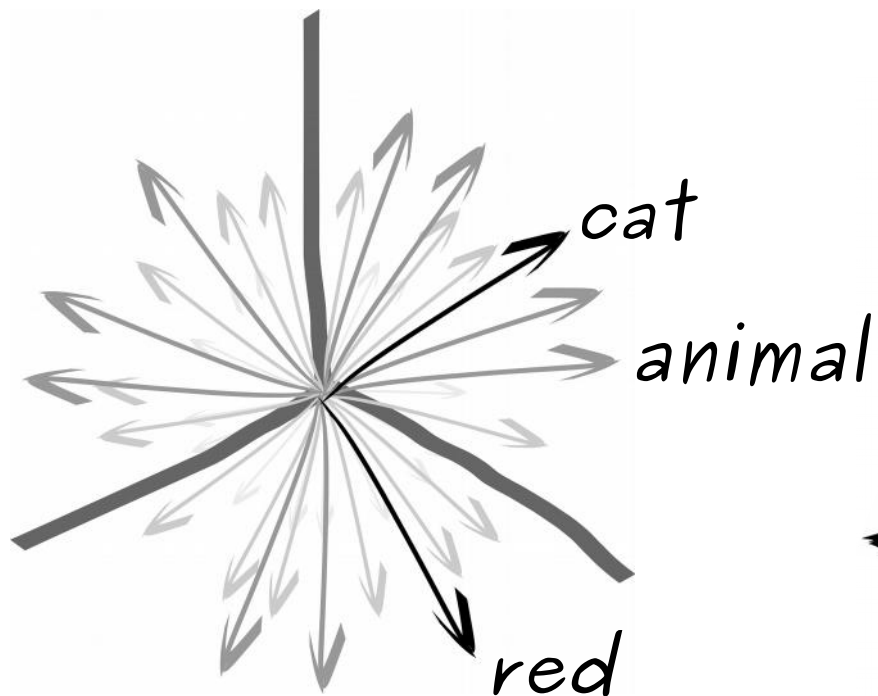
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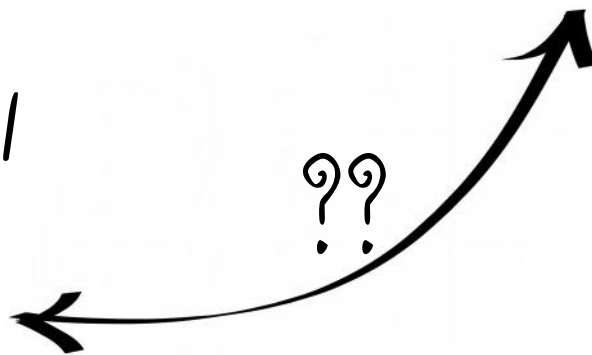
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messy

crisp



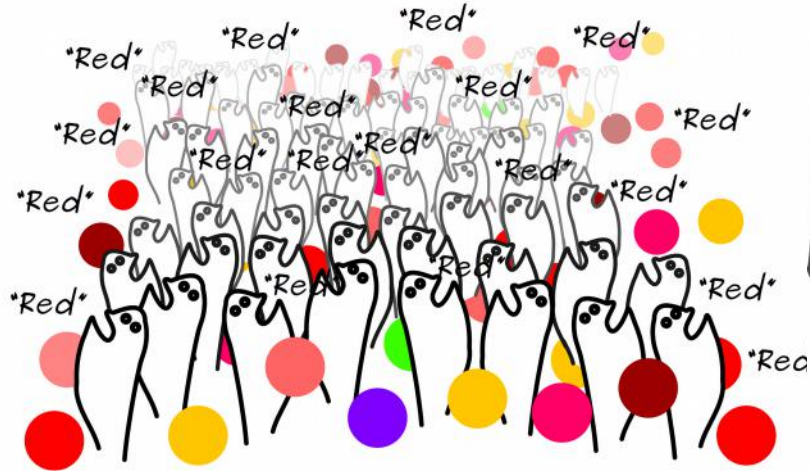
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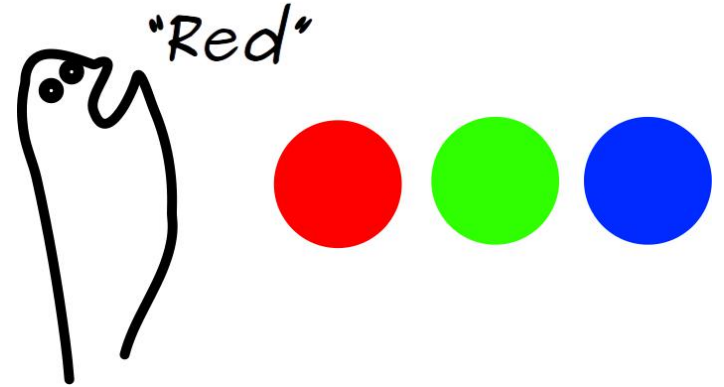
Westera & Boleda (under review)

# Main interest

messy



crisp



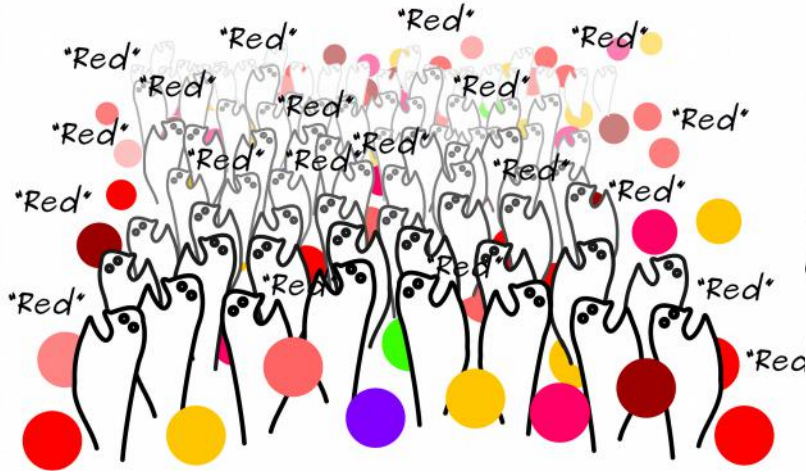
enables

How?

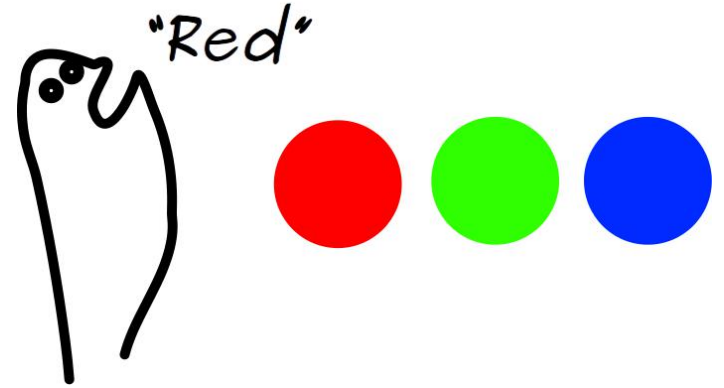


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messy



crisp

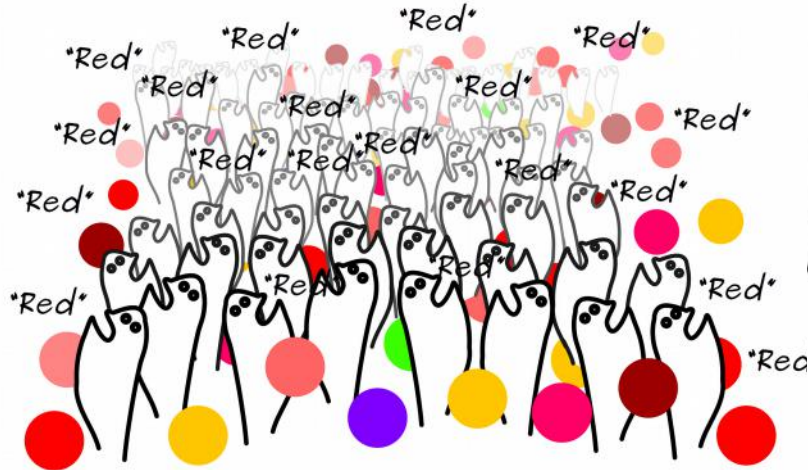


enables

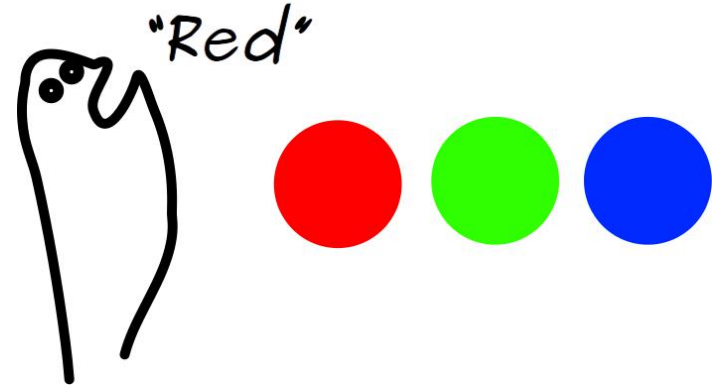
How? - how do NN models do it?

# Main interest

messy



crisp



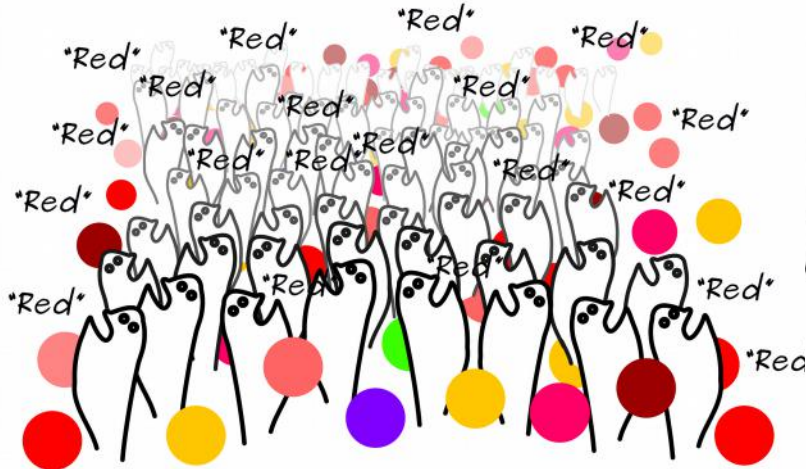
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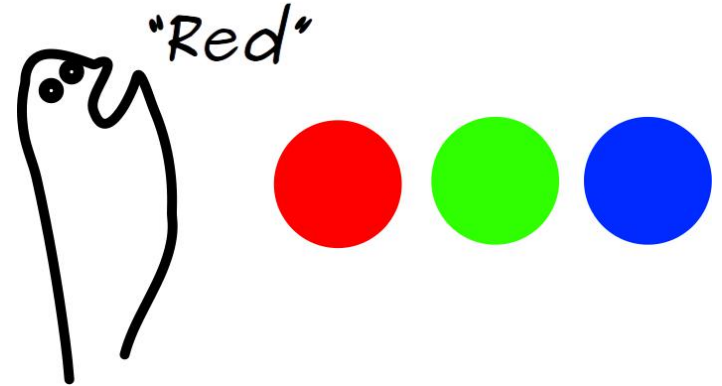
- how do NN models do it?
- how do DS and FS relate?

# Main interest

messy



crisp



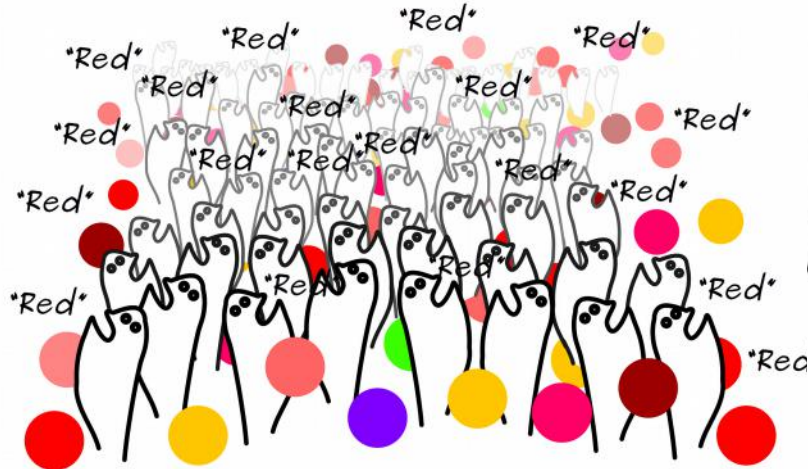
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How?

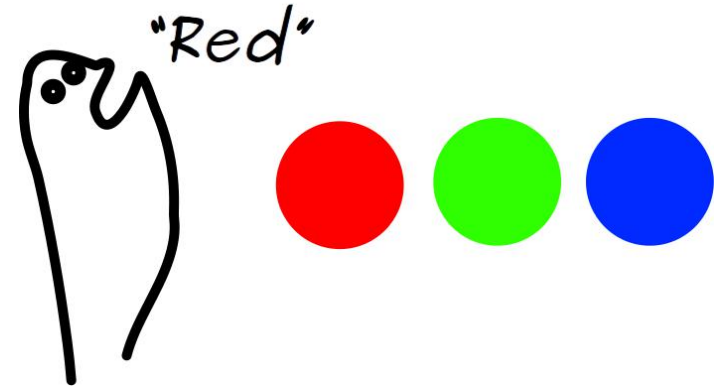
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# Main interest

messy



crisp

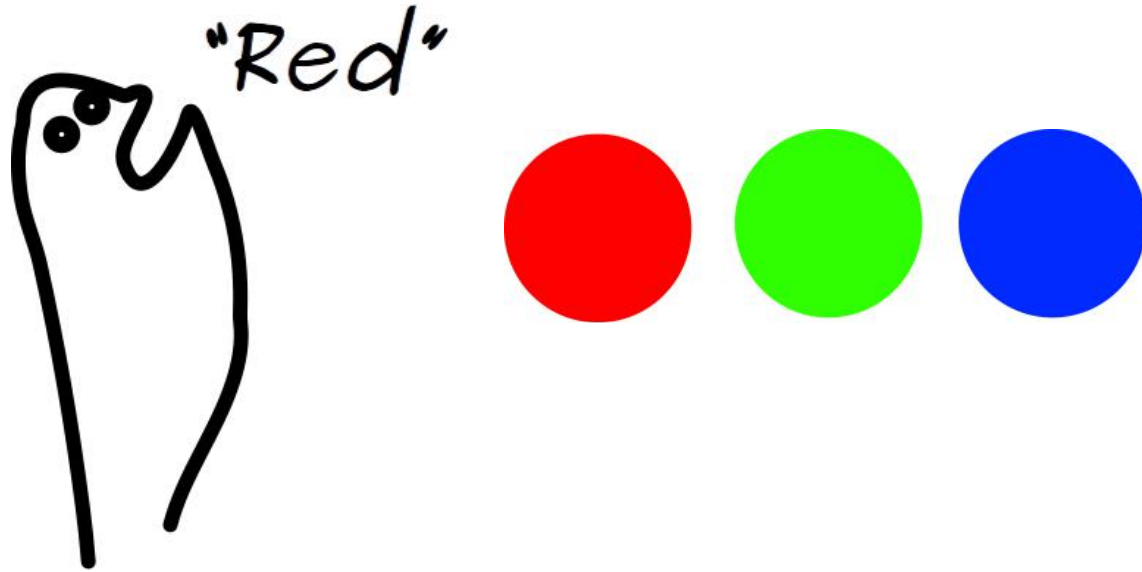


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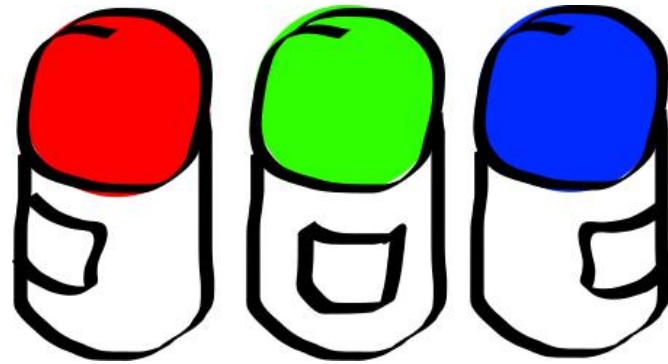
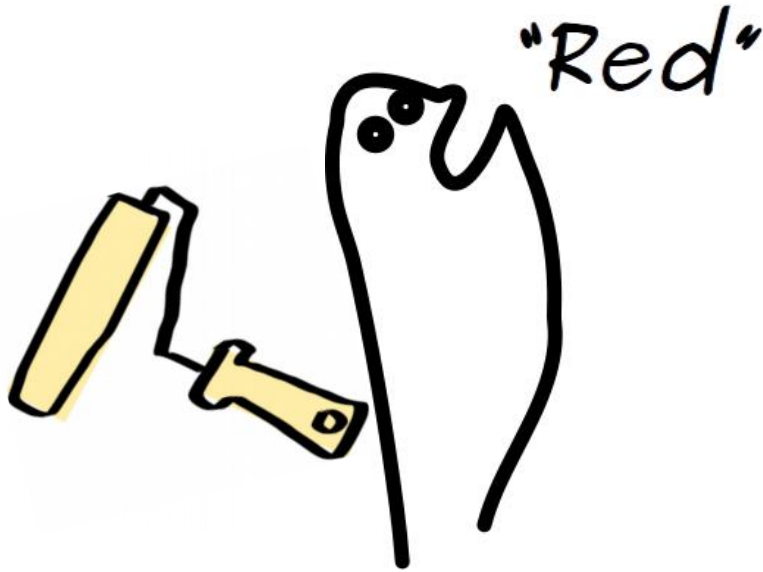
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# Pragmatics



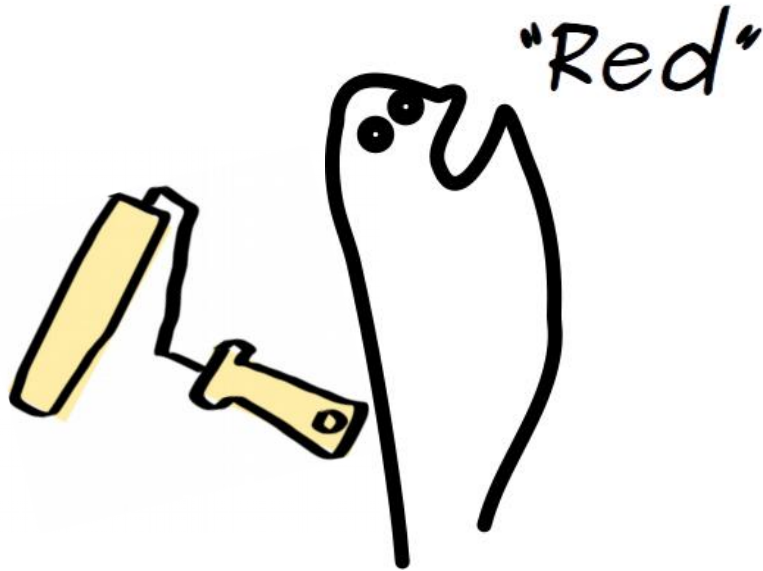
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€ PAINT

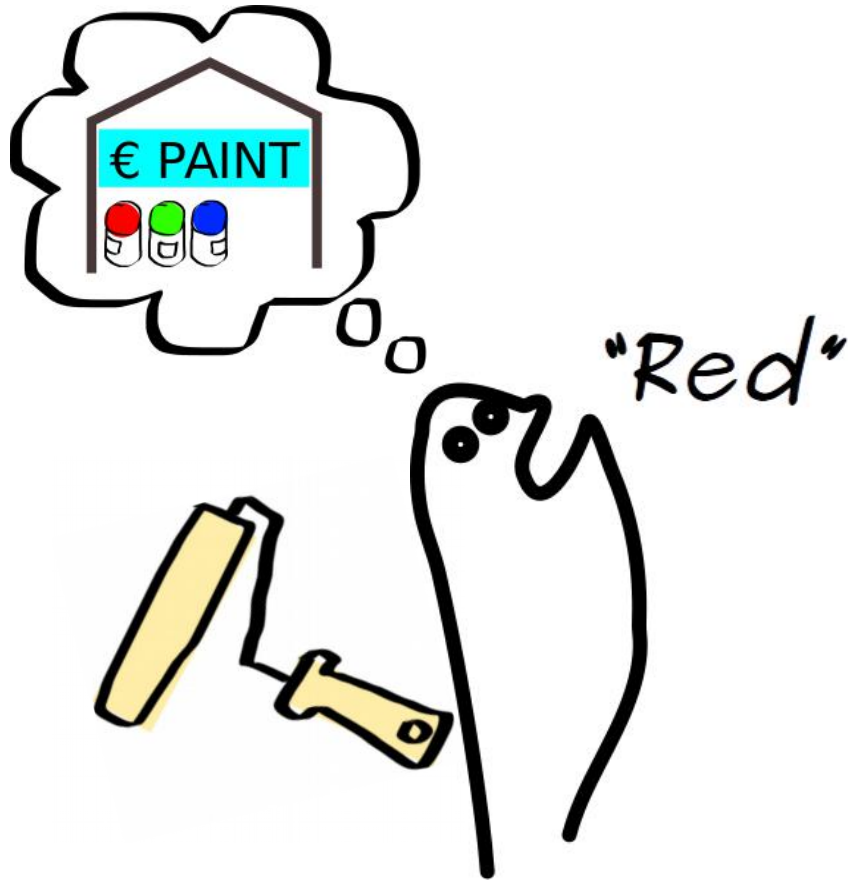


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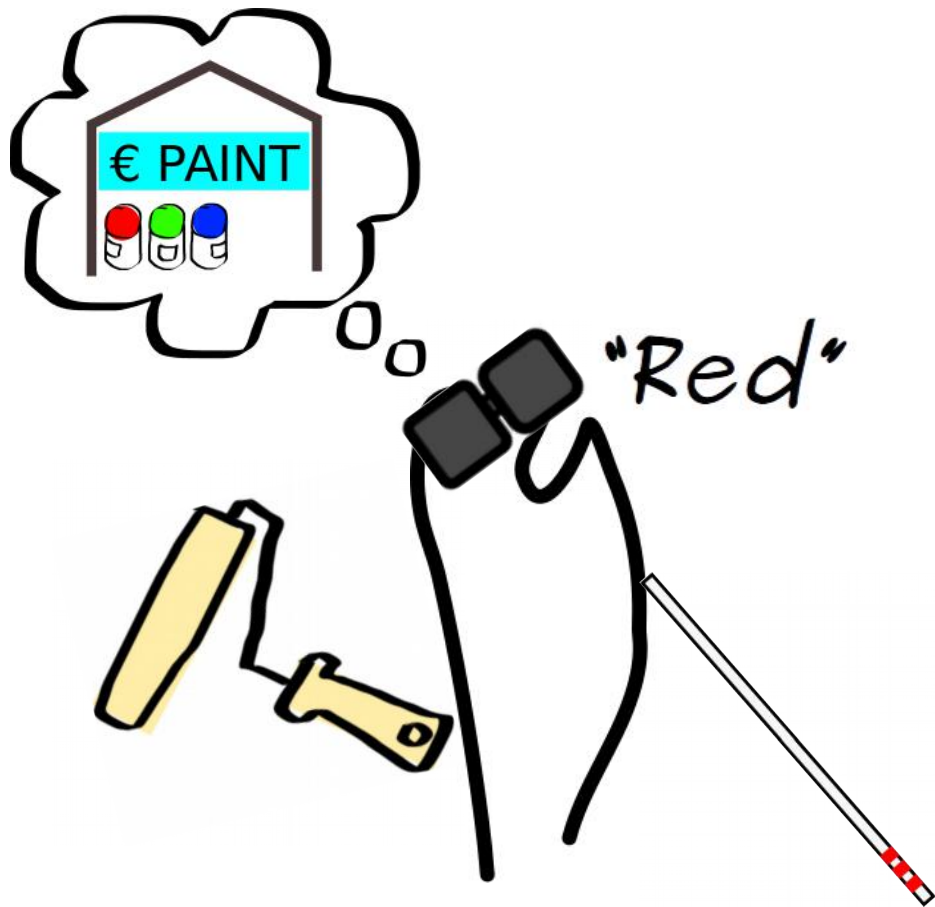


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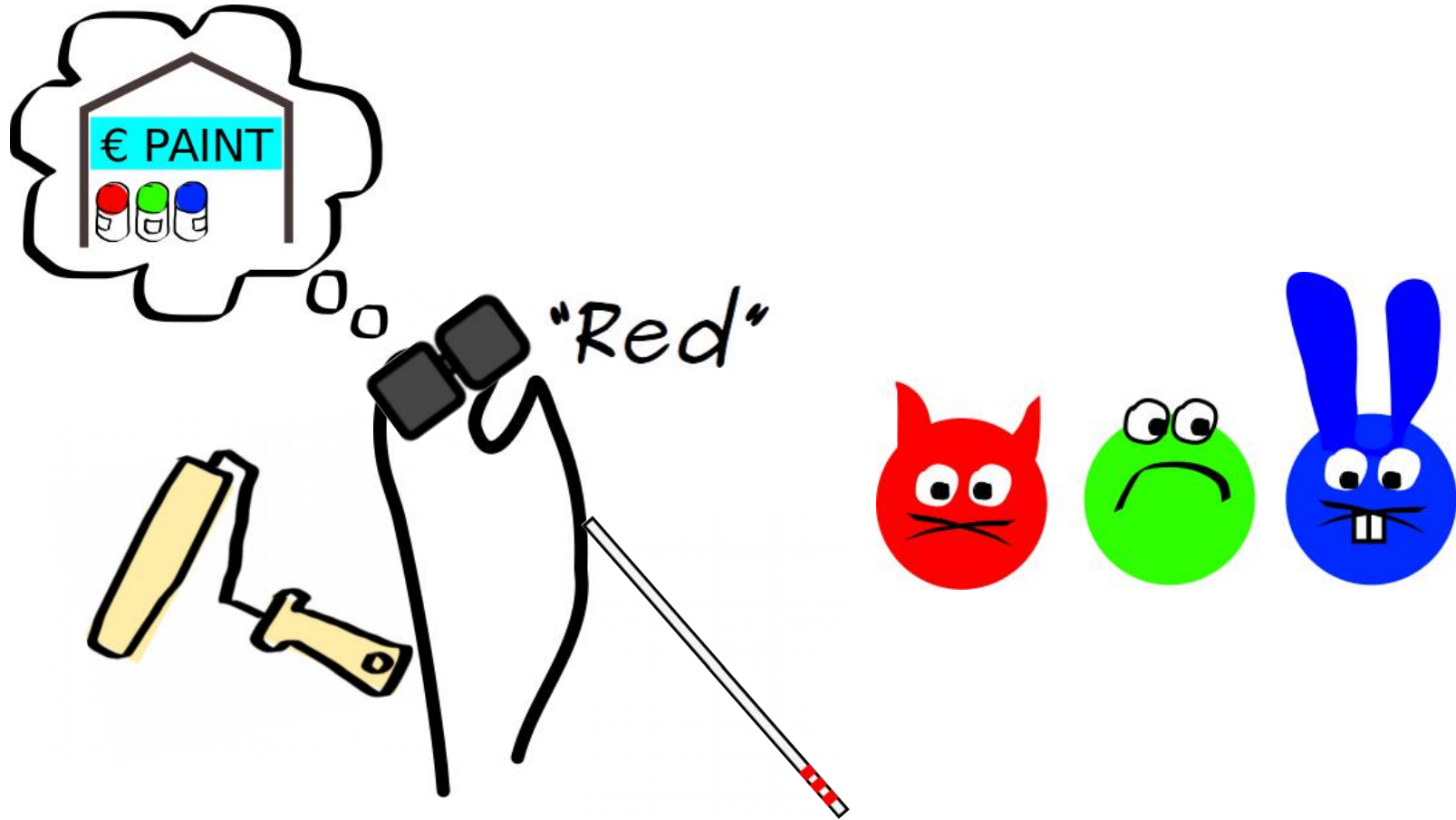




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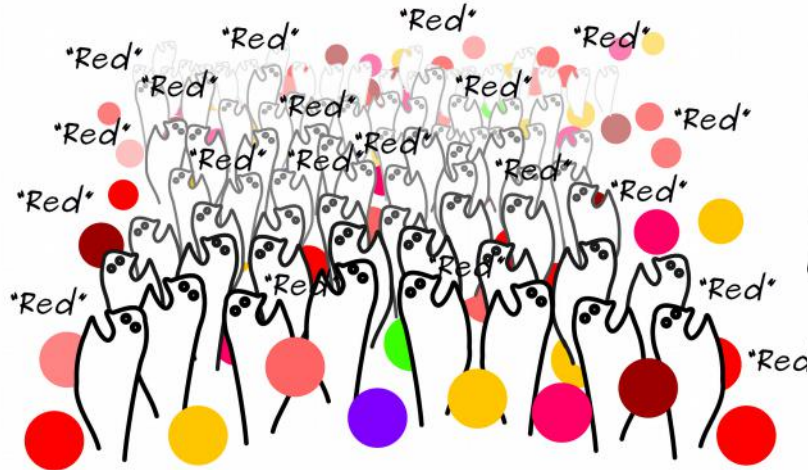


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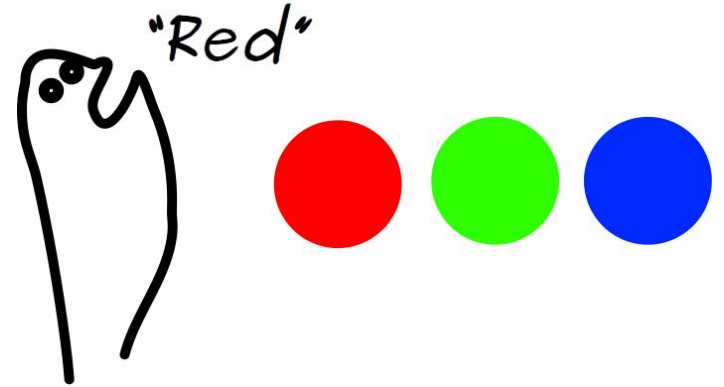


# Main interest

messy



crisp



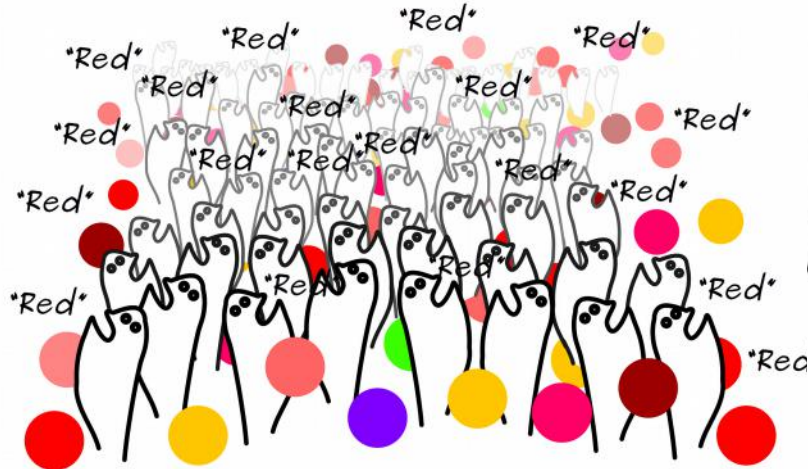
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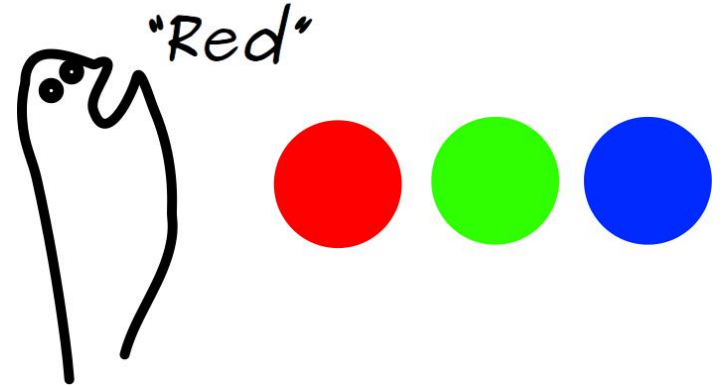
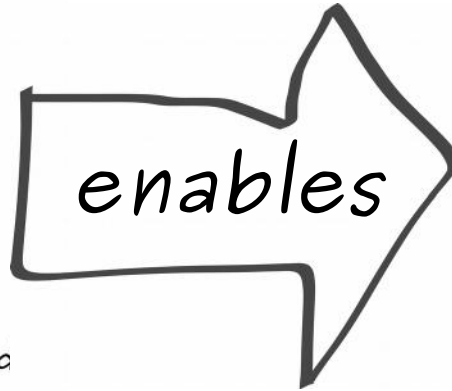
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crisp

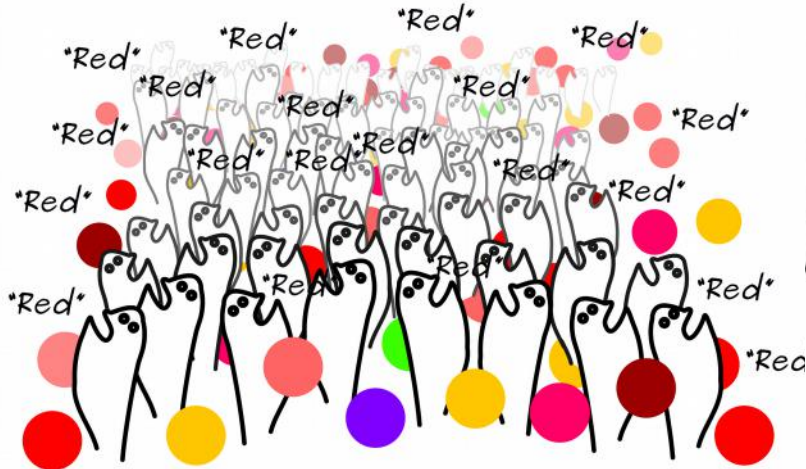


How?

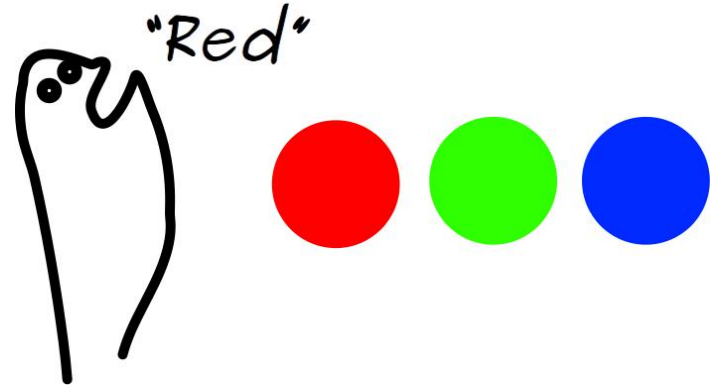
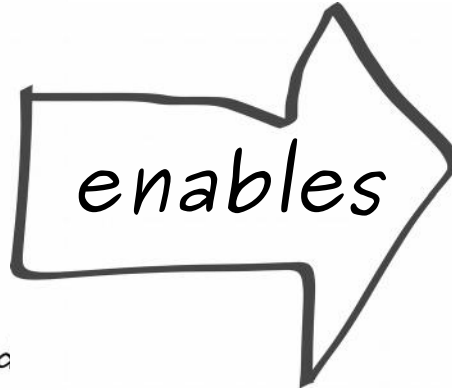
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# Main interest

messy



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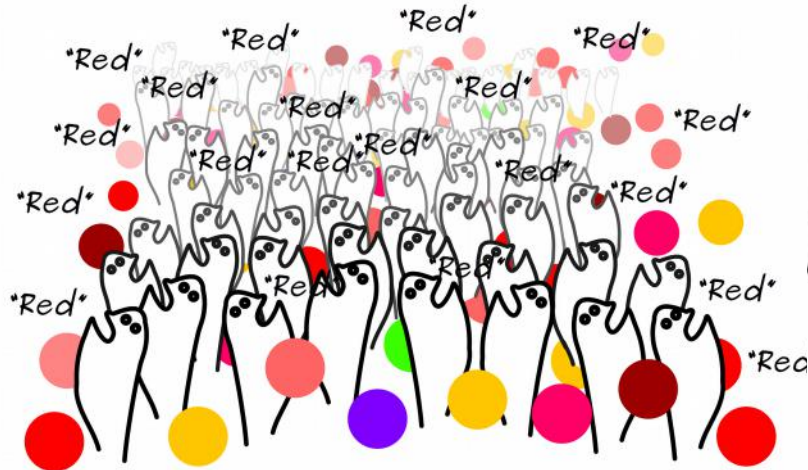


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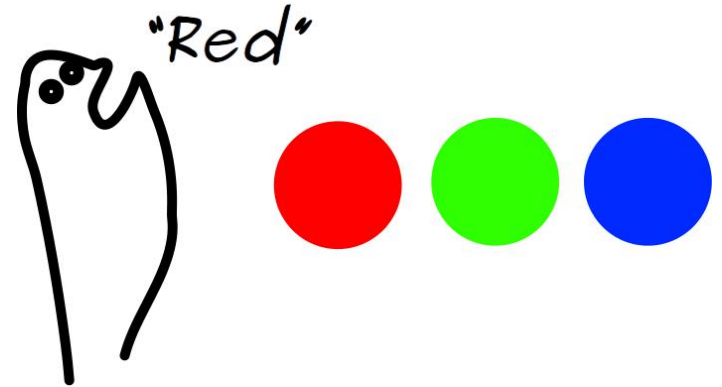
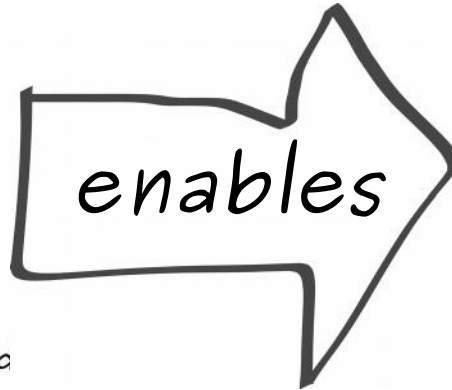
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# Main interest

messy



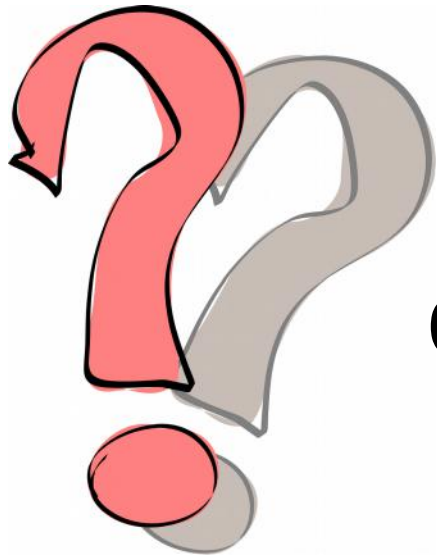
crisp



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# Predicting implicit and explicit questions



Matthijs Westera

COLT kick-off workshop



# Discourse goals

Pragmatic theory:



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Pragmatic theory: e.g., Westera 2017 (PhD thesis)

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**Models (e.g.):**

- Simple word-level RNN. (Westera 2018 [SemDial])
- Sentence-level RNN on pre-trained sent. embeddings.

# Example (aim)

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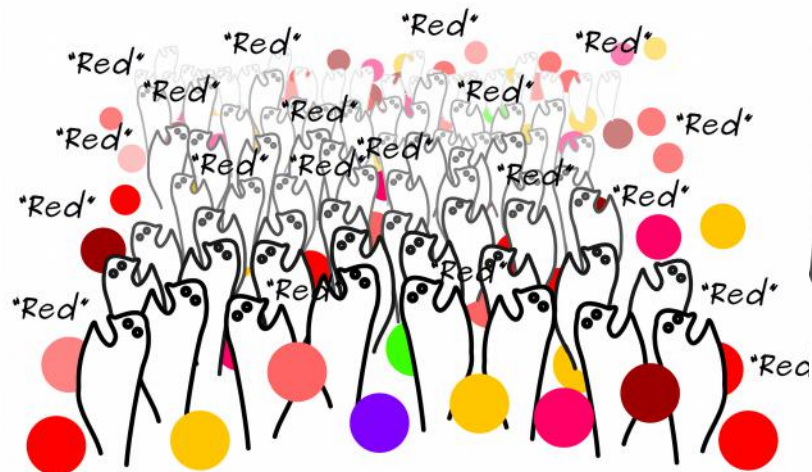
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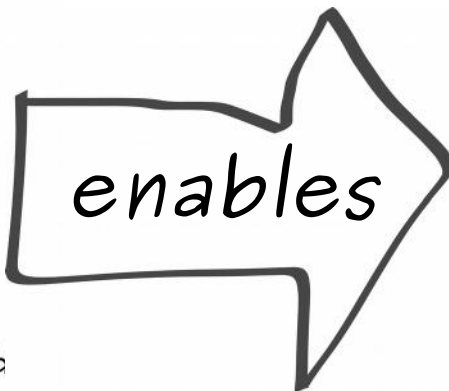
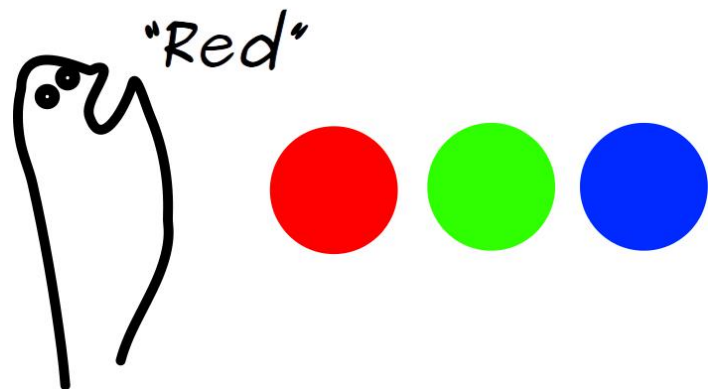
*Why can't we go?*

# Summary

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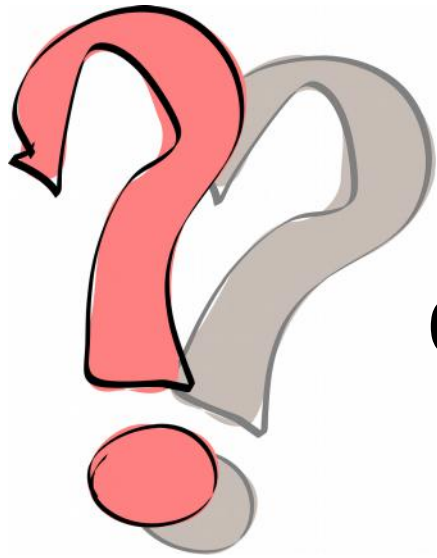
crisp



HOW?

- how do NN models do it?
- how do DS and FS relate?
- can we predict discourse goals?

# Predicting implicit and explicit questions



Matthijs Westera

COLT kick-off workshop

