



WALC 2023 Applied AI

Introduction to Convolutions

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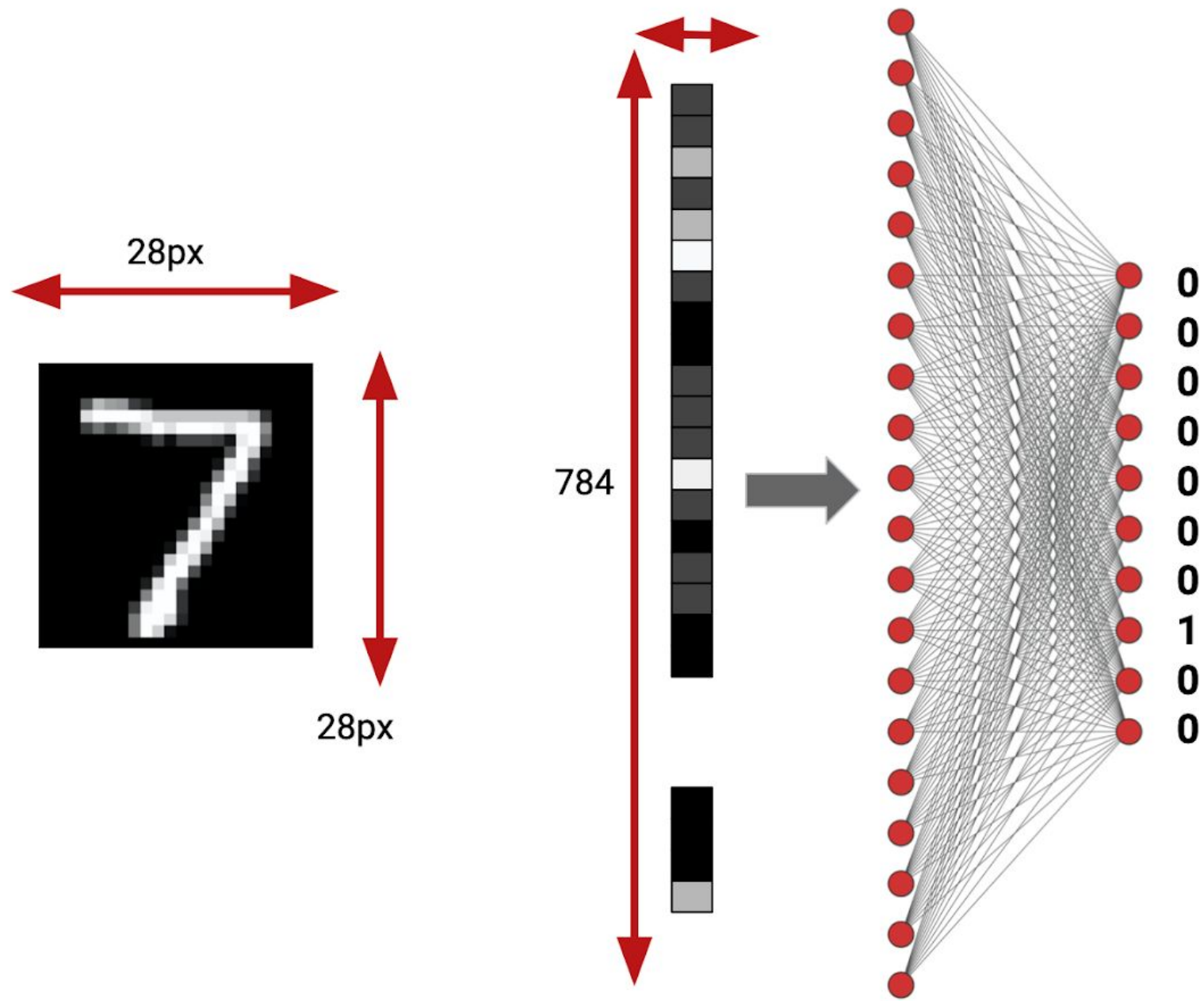
TinyML4D Academic Network Co-Chair



TINYML4D

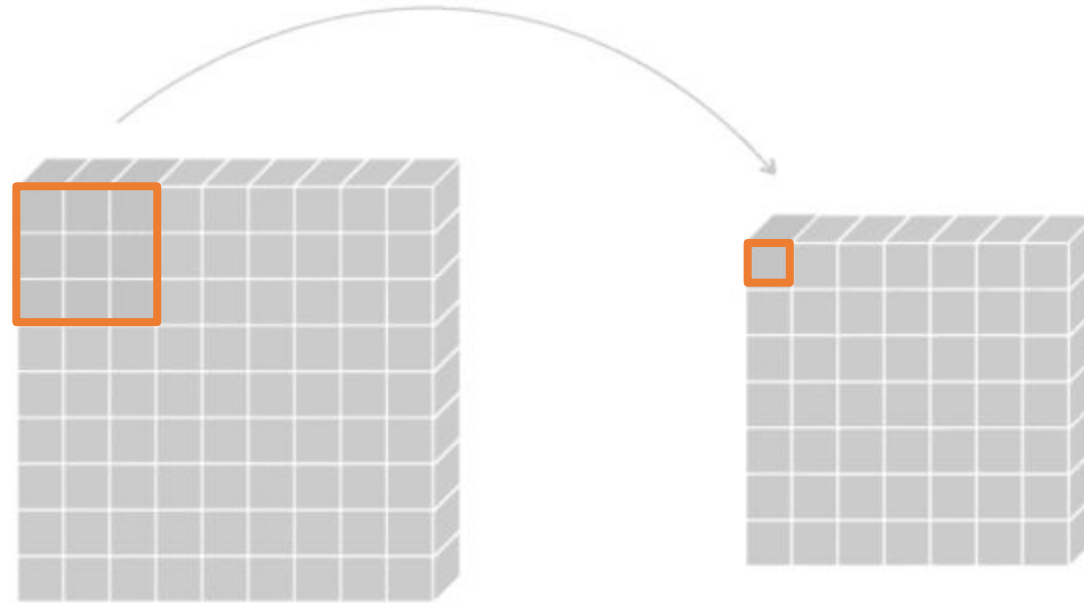
Introducing Convolutions

Beyond weights and biases...

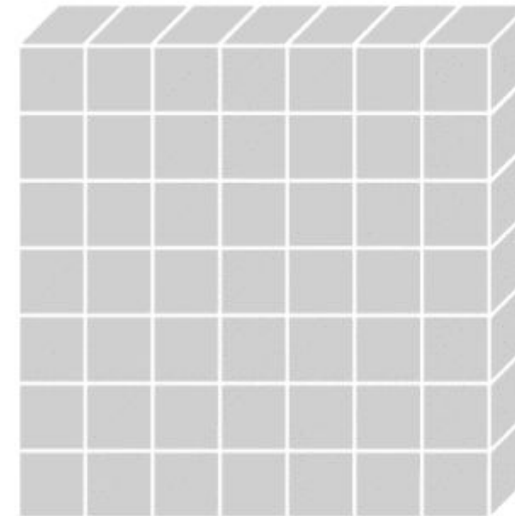
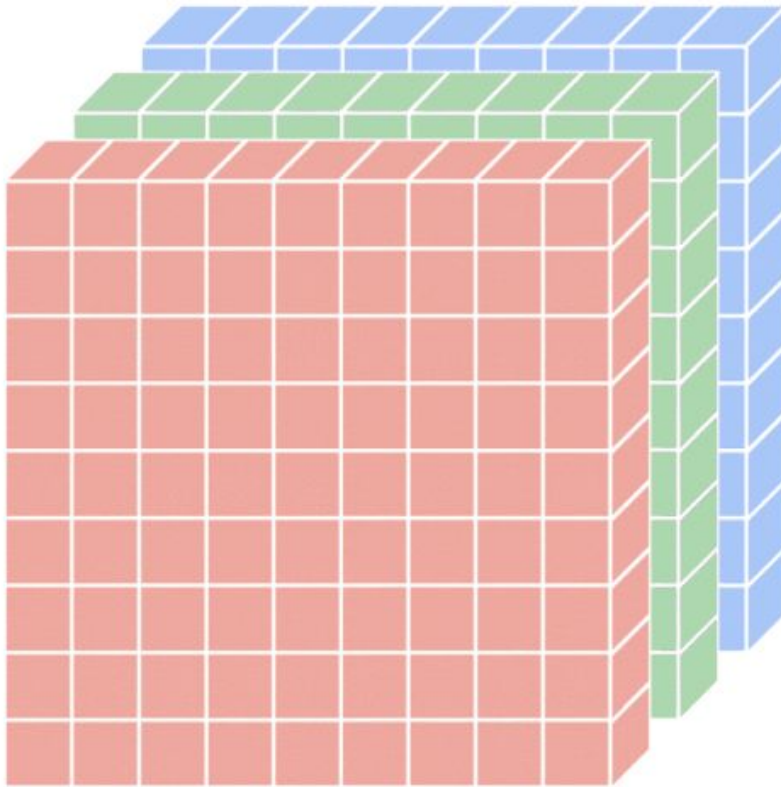




Standard Convolution (1 Channel)

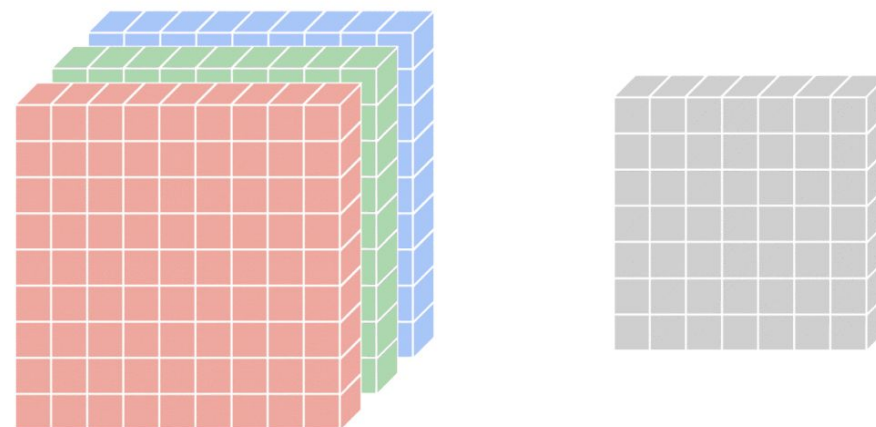


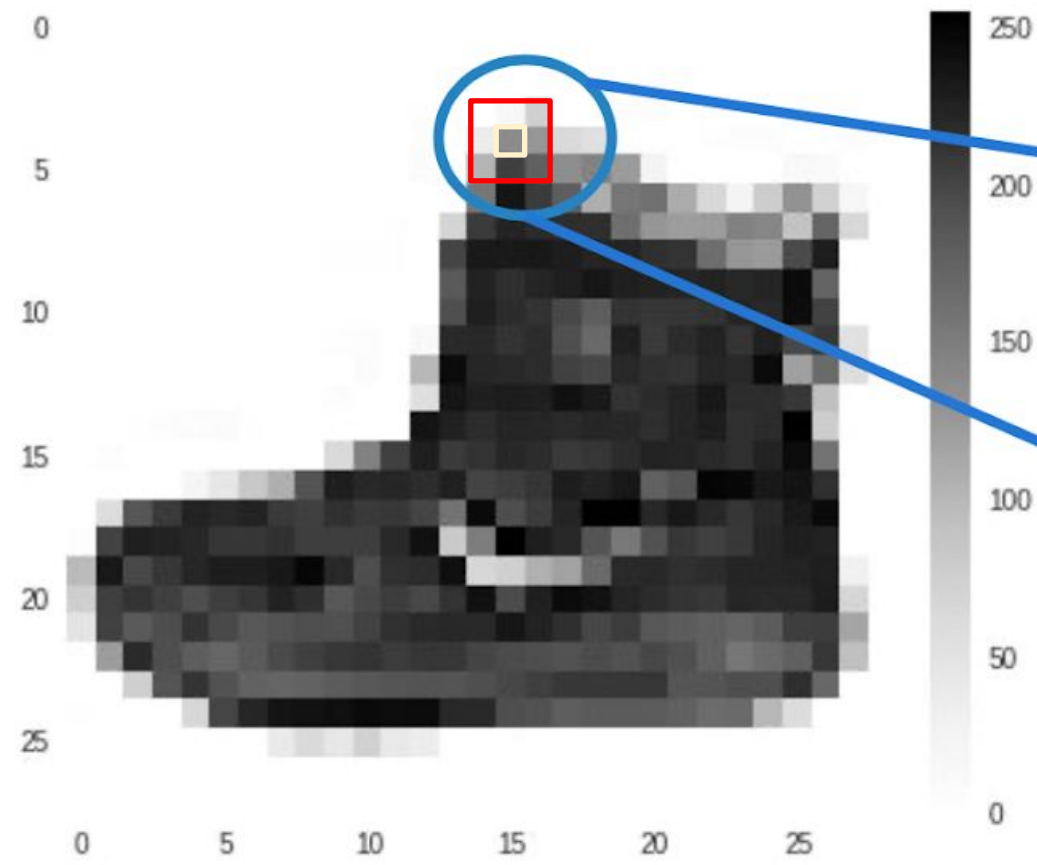
Standard Convolution (**3 Channel**—e.g., *RGB*)



Standard Convolution (**3 Channel**—e.g., *RGB*)

- Input Feature Map
 - $8 \times 8 \times 3$
 - Width \times Height \times Channels
- Kernel (*1 Filter*)
 - $3 \times 3 \times 3$





0	64	128
48	192	144
142	226	168

Current Pixel Value is 192
Consider neighbor Values

-1	0	-2
.5	4.5	-1.5
1.5	2	-3

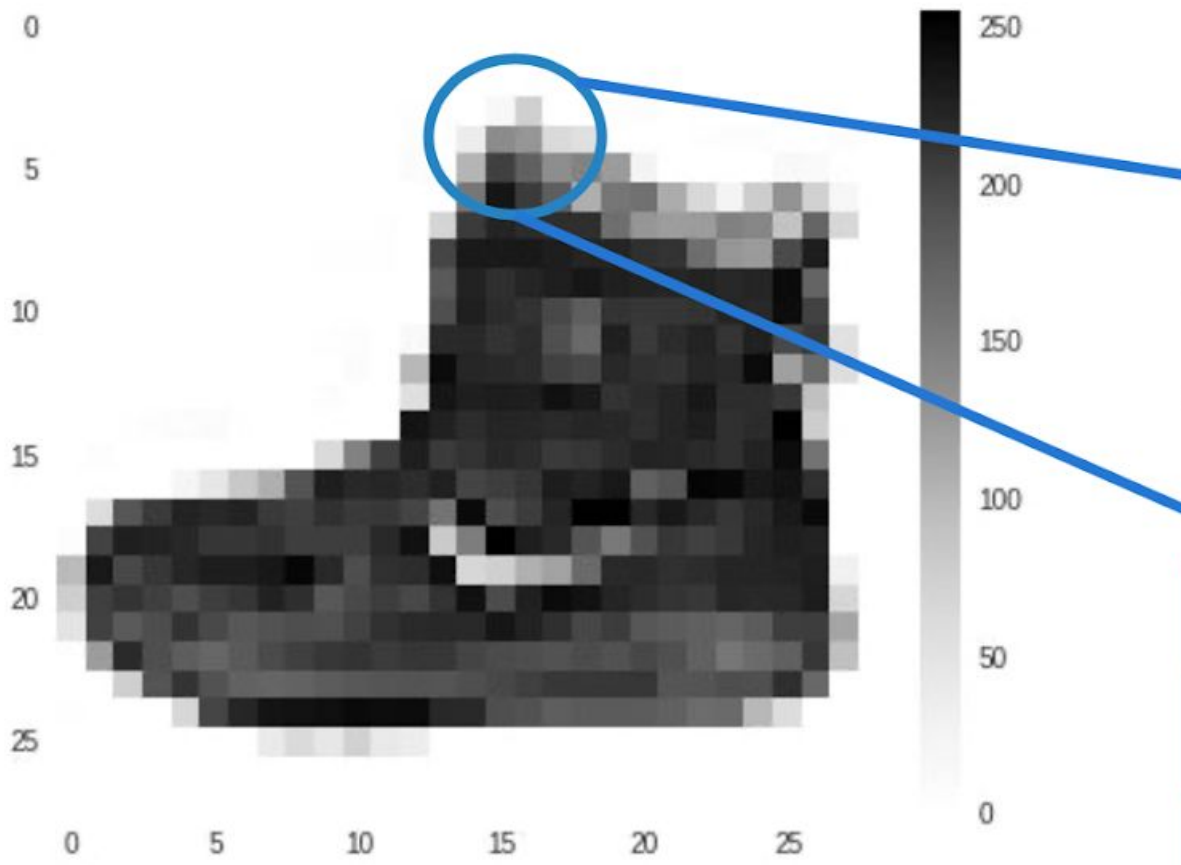
Filter Definition

CURRENT_PIXEL_VALUE = 192

$$\begin{aligned} \text{NEW_PIXEL_VALUE} = & (-1 * 0) + (0 * 64) + (-2 * 128) + \\ & (.5 * 48) + (4.5 * 192) + (-1.5 * 144) + \\ & (1.5 * 42) + (2 * 226) + (-3 * 168) \end{aligned}$$

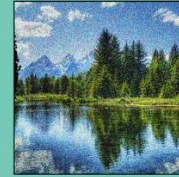
-256
672
11

427 ← New Pixel Value



Kernels = Filters

Different Filters



Noise



Gaussian Blur



Sharpen More



Fragment



Facet



Pointillize



Mosaic



Tiles



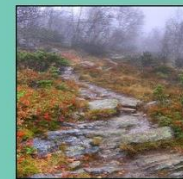
Mezzotint



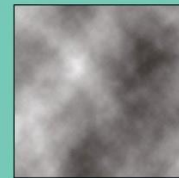
Solarize



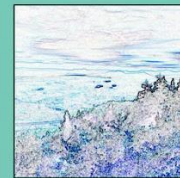
Trace Contour



Wind



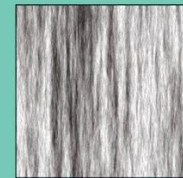
Clouds



Find Edges



Shape Blur



Fibers

Image Kernels

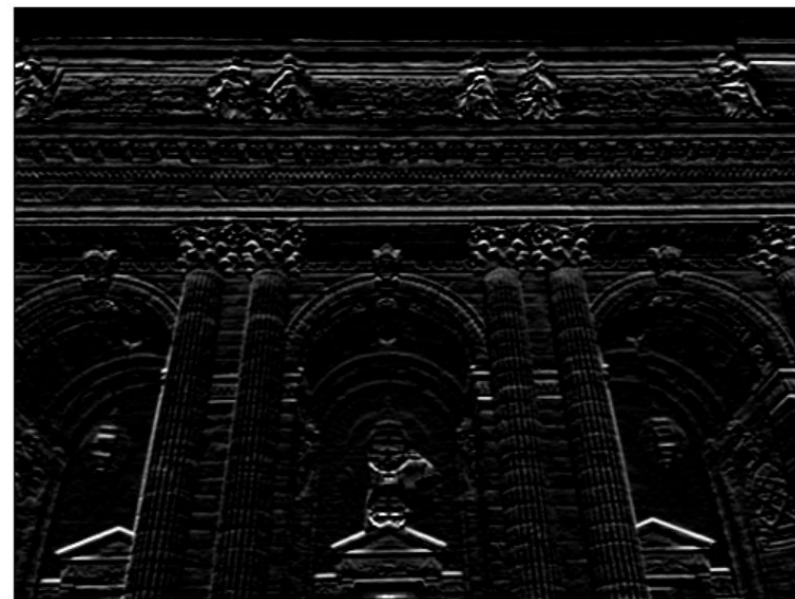


-1	0	1
-2	0	2
-1	0	1

custom

-1	-2	-1
0	0	0
1	2	1

custom



<https://setosa.io/ev/image-kernels/>

0	64	128	128
48	192	144	144
142	226	168	0
255	0	0	64

0	64
48	192

192

128	128
144	144

144

142	226
255	0

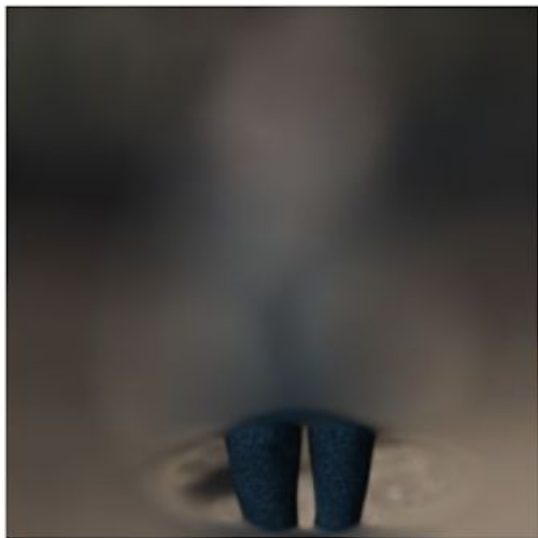
255

168	0
0	64

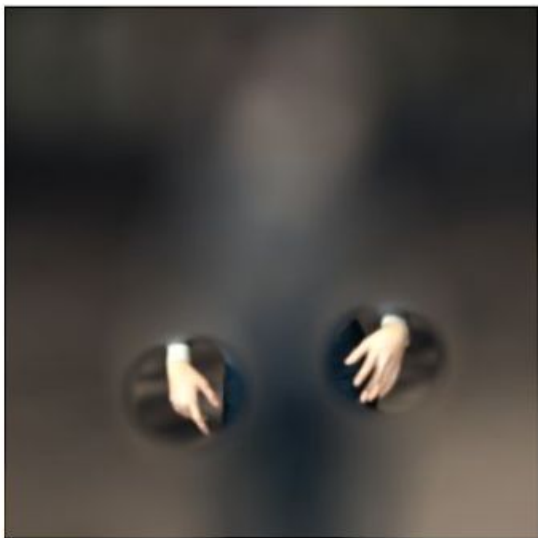
168

192	144
255	168

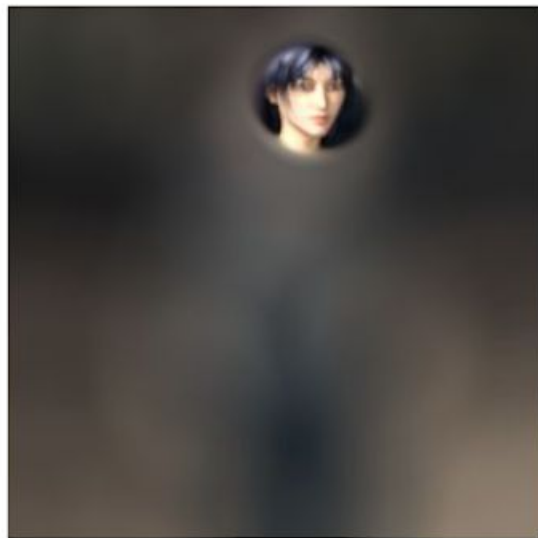
Max Pooling



+

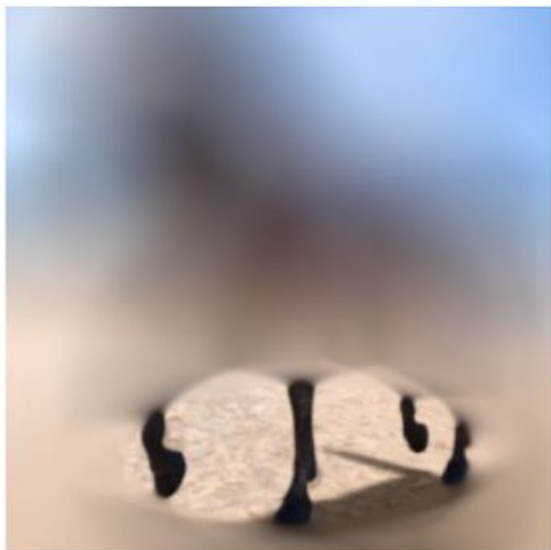


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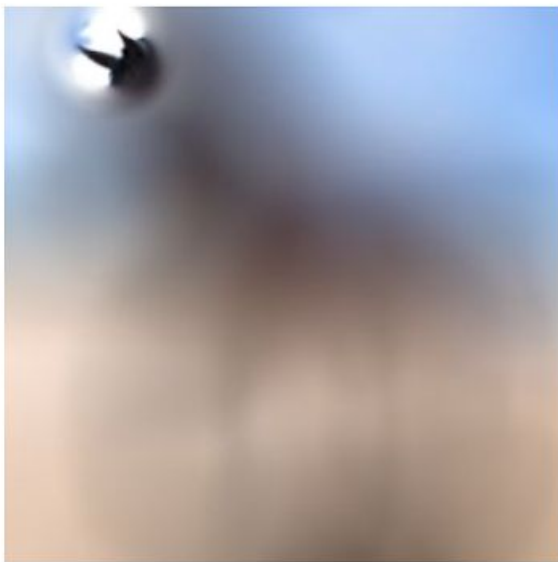


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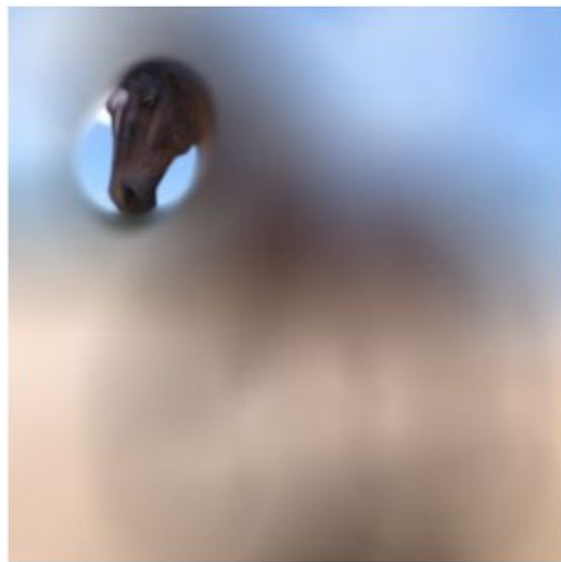
HUMAN



+

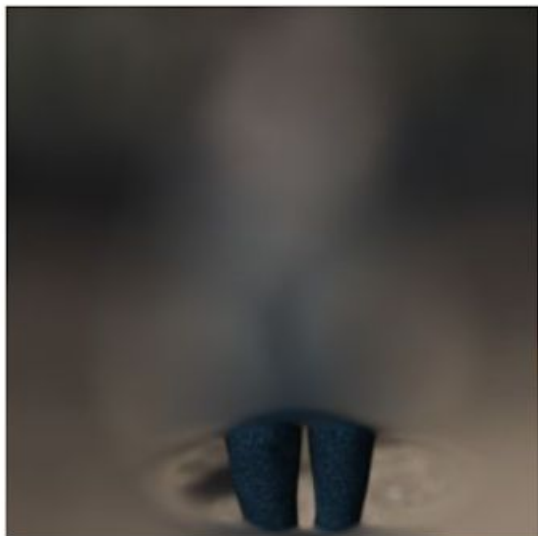


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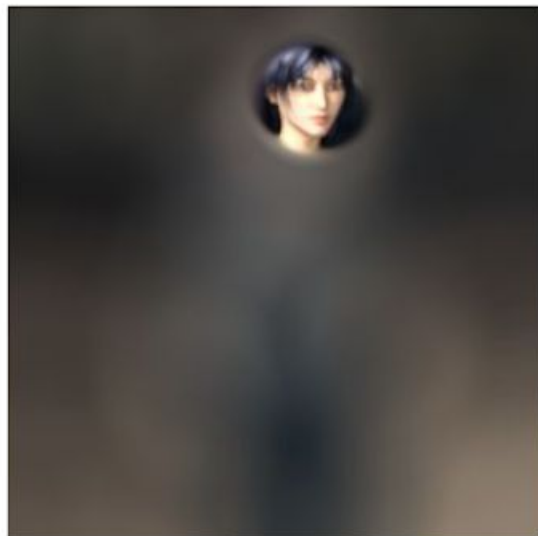
HORSE



+

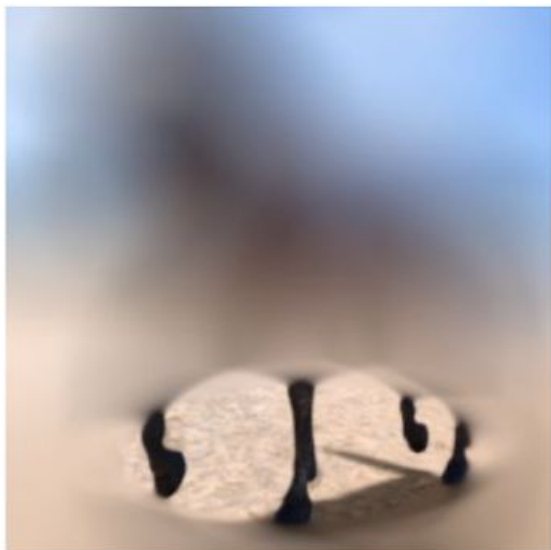


+



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HUMAN

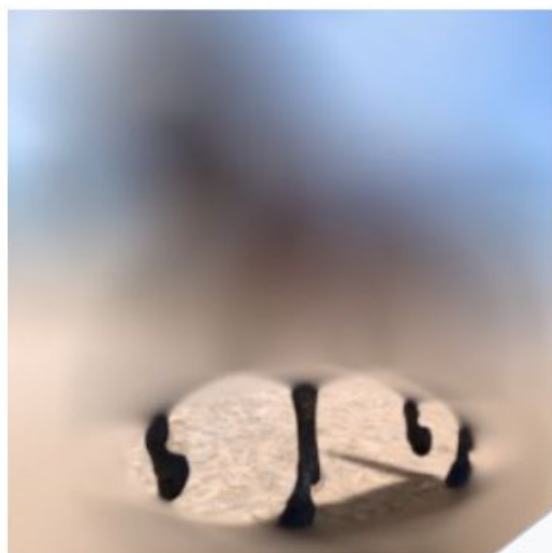


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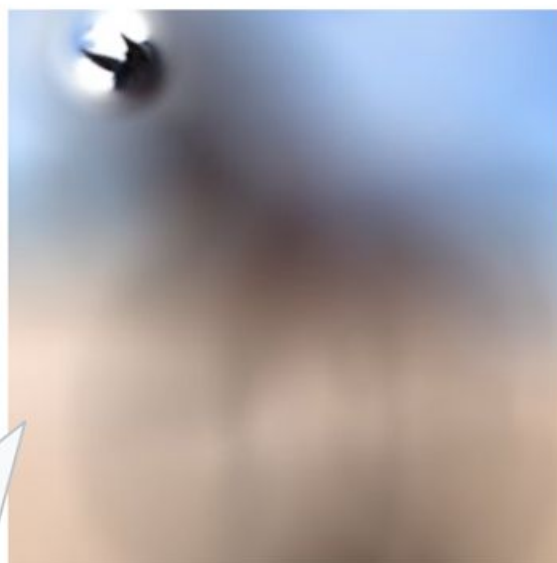


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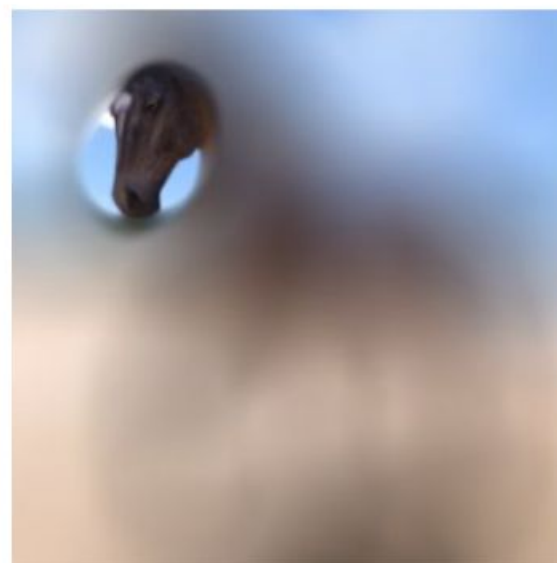
HORSE



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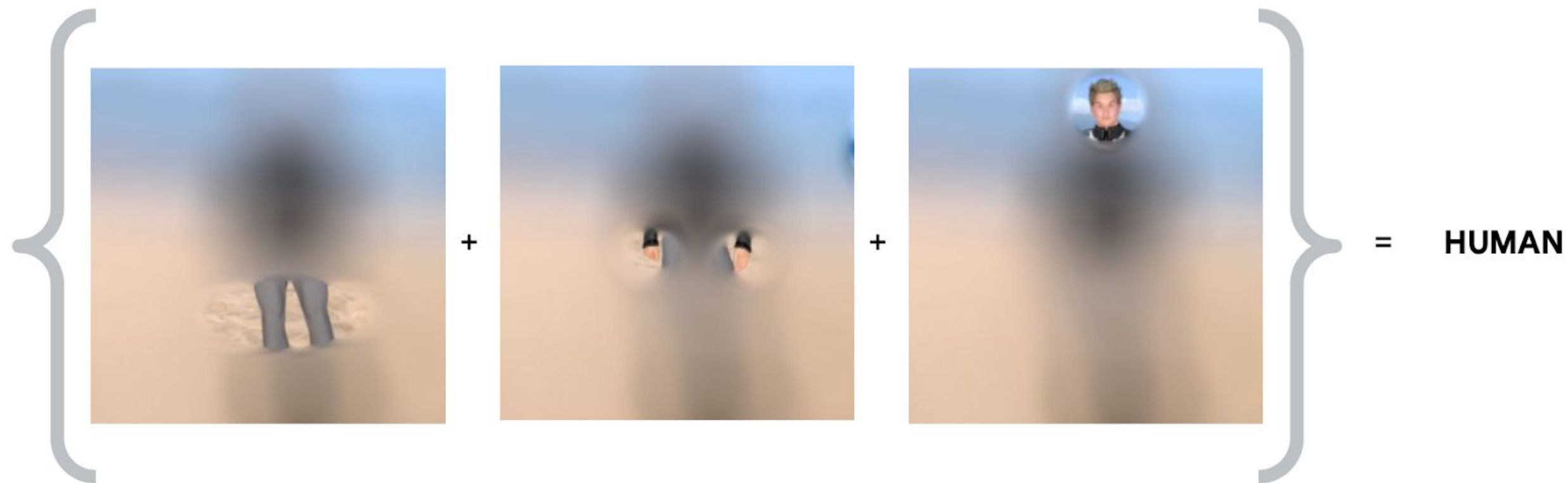
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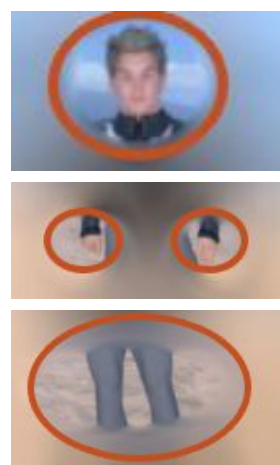
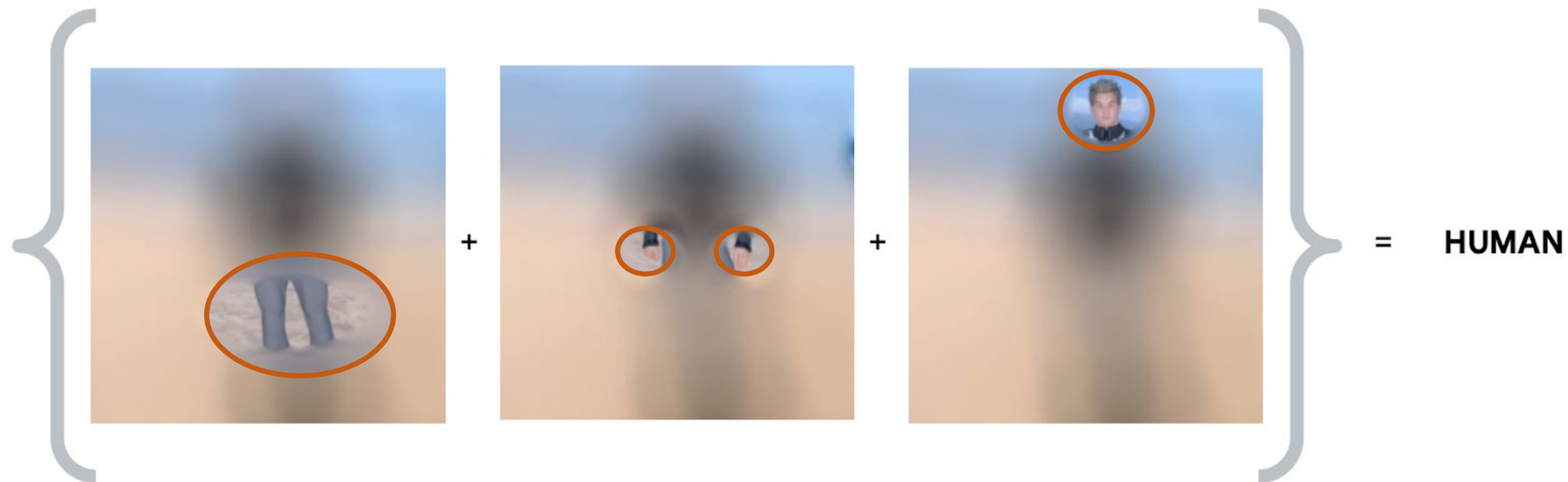


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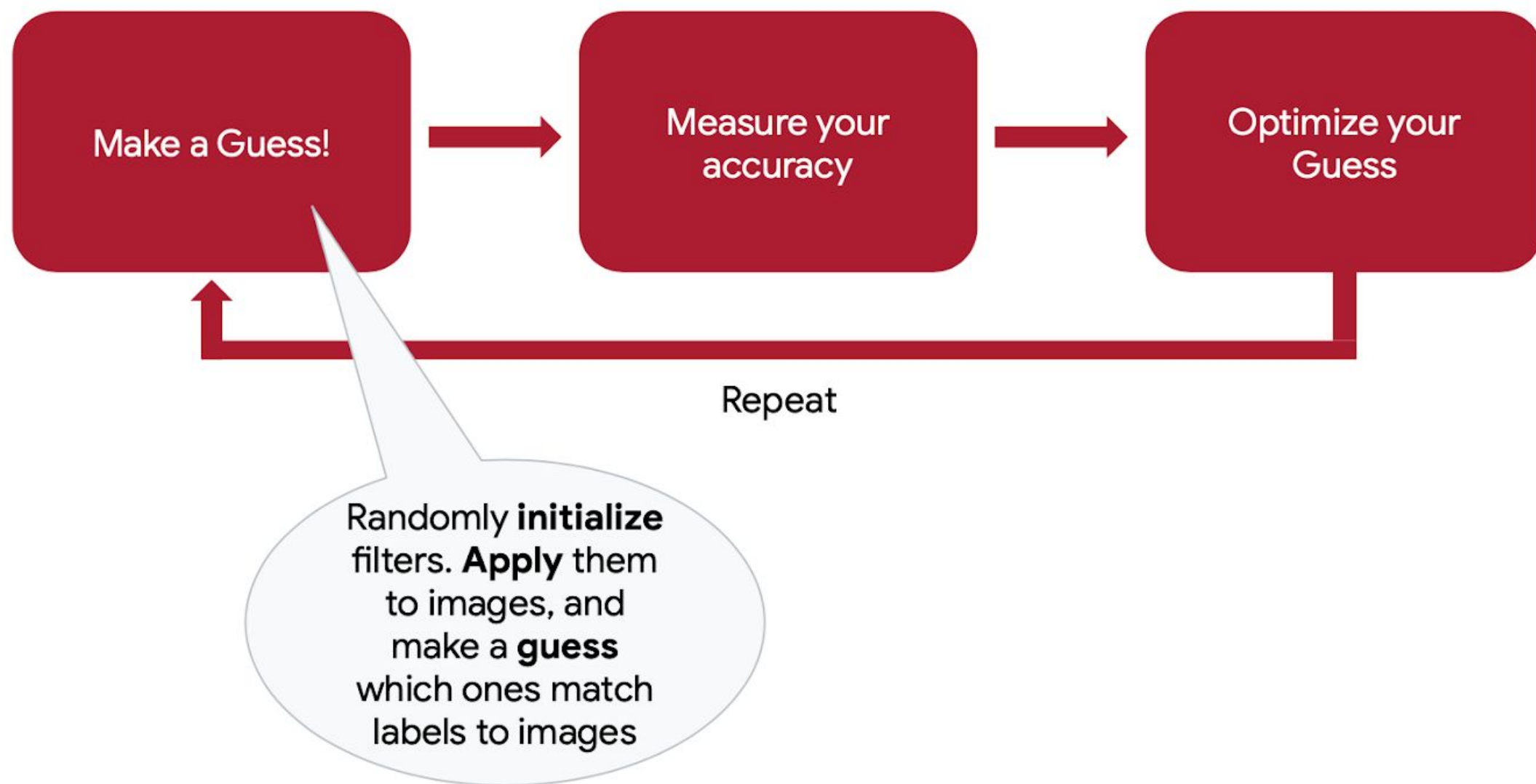
HORSE

Filters can then be combined with **labels** to make a **prediction** of the image contents...

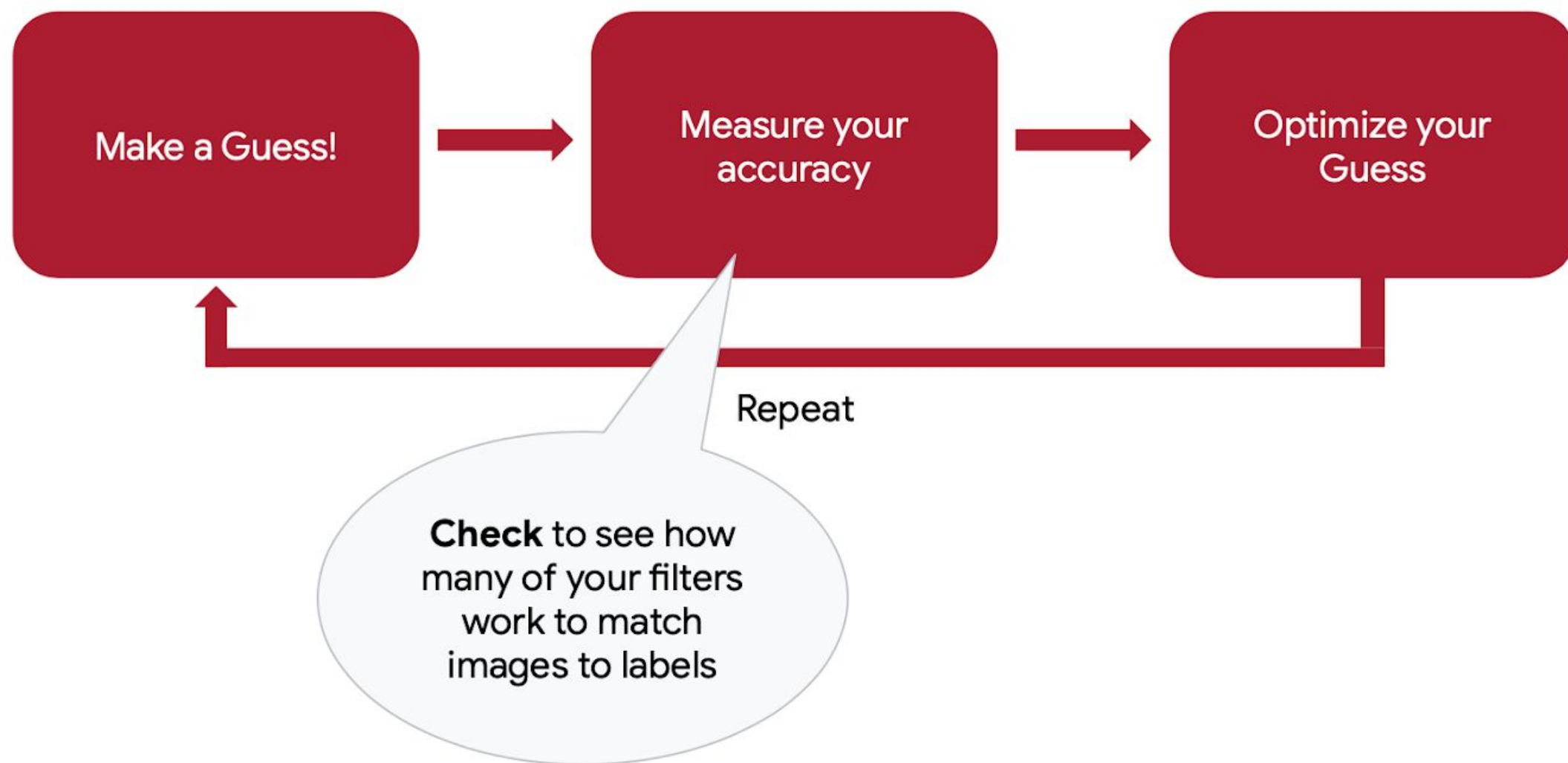




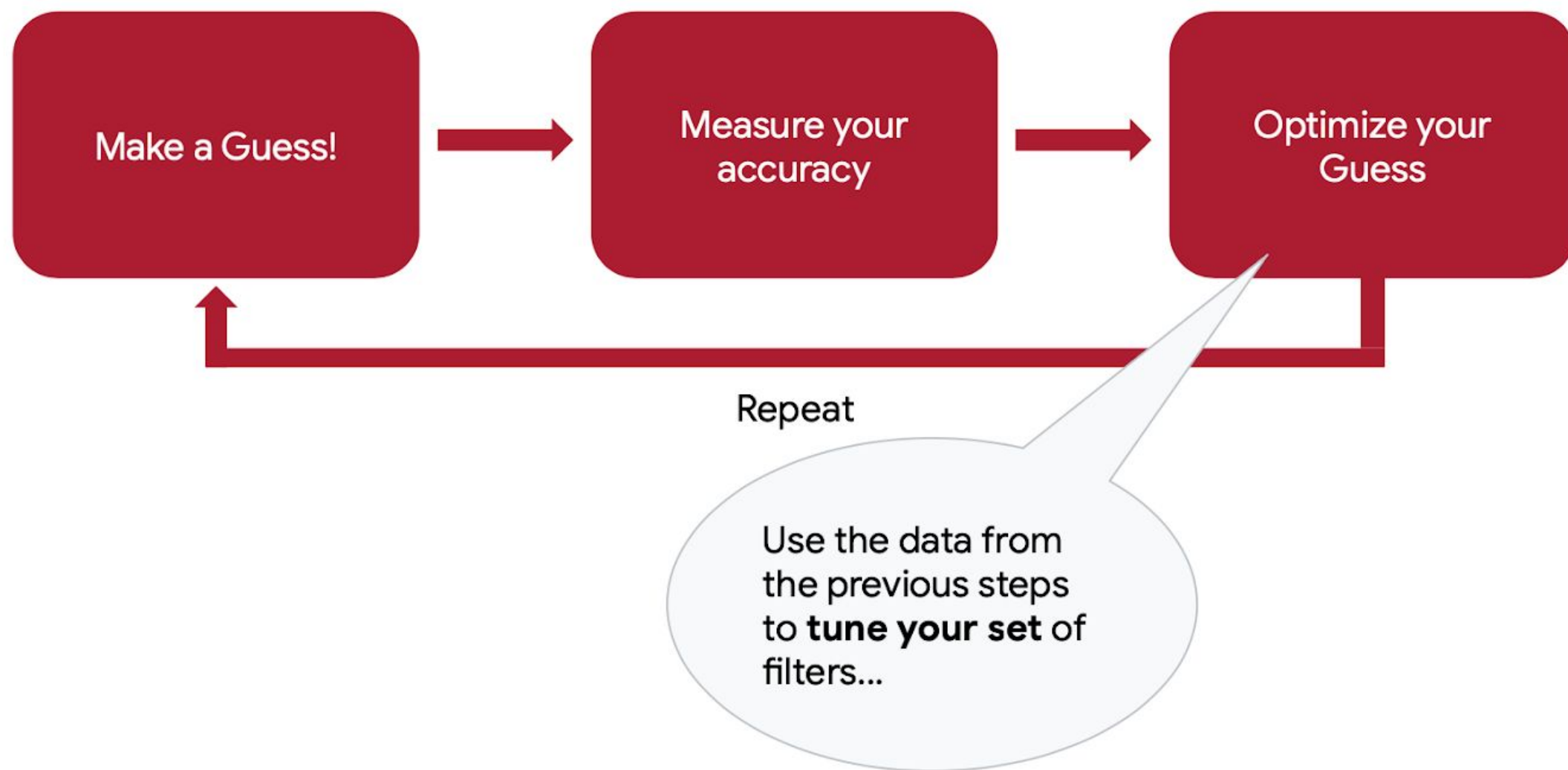
The Machine Learning Paradigm



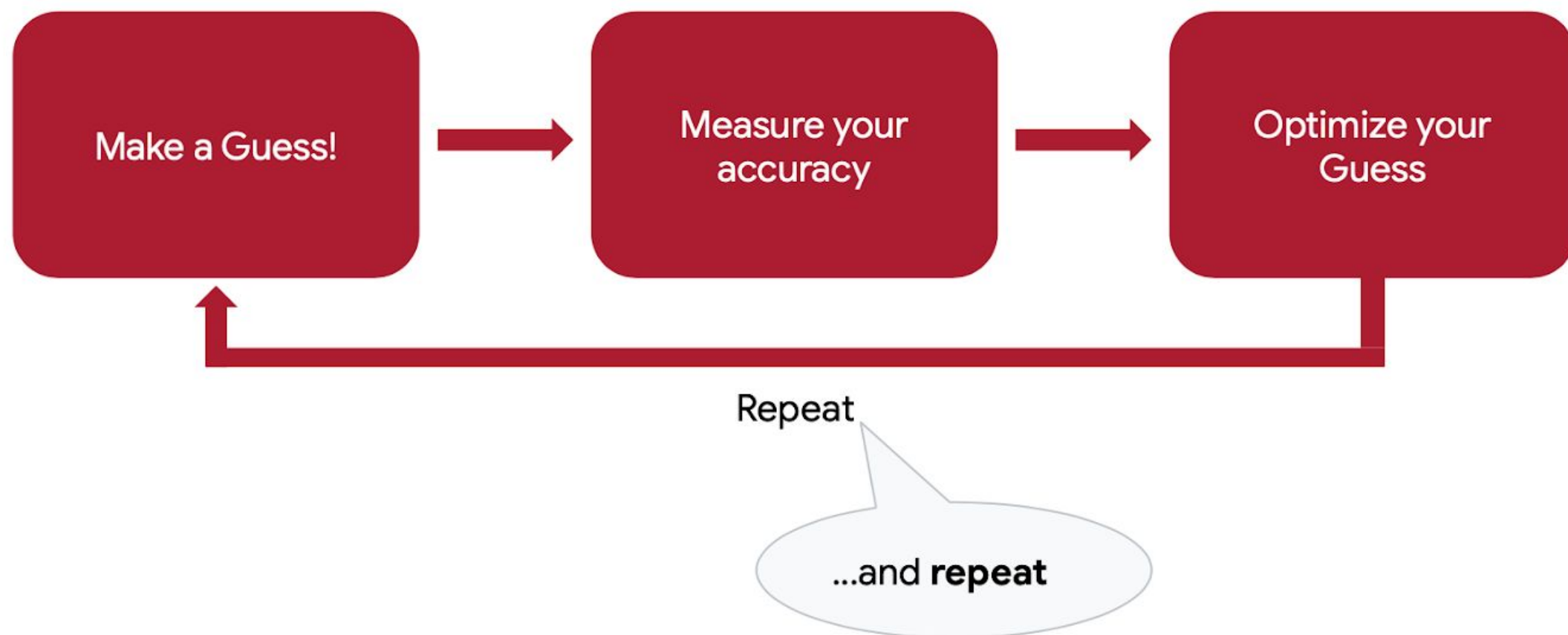
The Machine Learning Paradigm


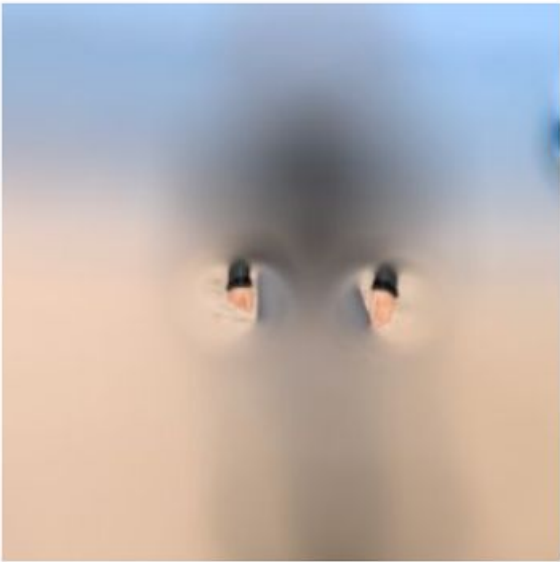
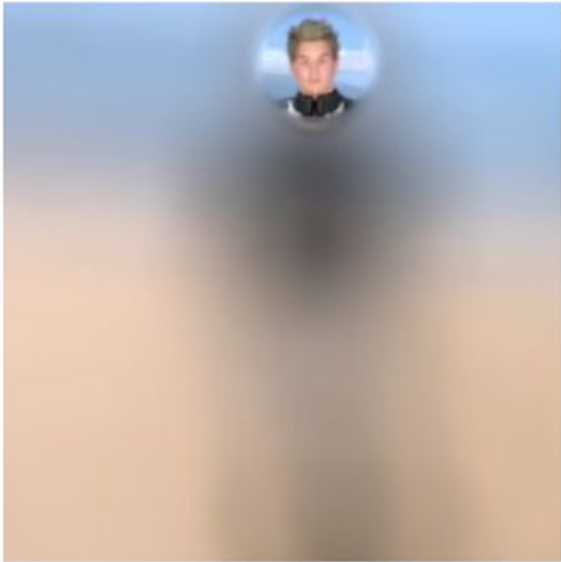


The Machine Learning Paradigm



The Machine Learning Paradigm



{  +  +  } = HUMAN



Exploring CNN

CNN Explainer

<https://poloclub.github.io/cnn-explainer/>

[ConvNetJS](#) MNIST demo

<https://cs.stanford.edu/people/karpathy/convnetjs/demo/mnist.html>

[ConvNetJS](#) CIFAR-10 demo

<https://cs.stanford.edu/people/karpathy/convnetjs/demo/cifar10.html>

Thanks

