

# Automatisches Bildverstehen

-

# Visuelle Bildnavigation

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[visual-computing.com](http://visual-computing.com)

# There are too many images

- Constantly growing number of images, thousands of results for a search
- Image search is very time consuming
- Only few images can be looked at simultaneously



# Image search: The Actual Situation as you all know it ...

gettyimages® Creative Editorial Video Musik iStock

Filtern und Sortieren **maus** Creative













Details anzeigen

11.813 Ergebnisse 1 von 119

Neuste Ergebnisse

Verwandte Suchen

maus katze elefant hase

 <p><b>RF Creative</b> Man's hand on a computer mouse Von: Westend61 Westend61 530074061</p>	 <p><b>RM Creative</b> House Mouse (<i>Mus musculus</i>), Nieuwegein, Netherlands Von: Jelger Herder/ Buiten-beeld Minden Pictures 537006613</p>	 <p><b>RF Creative</b> Computer Keyboard And Mouse With Colored Pencil Von: Benedetta Riccardi / EyeEm EyeEm 548325757</p>	 <p><b>RM Creative</b> A female Alabama beach mouse, <i>Peromyscus polionotus ammobates</i>. Von: Joel Sartore National Geographic 463034353</p>	 <p><b>RF Creative</b> Man using computer mouse, close-up of hand Von: Walker and Walker Digital Vision 102416352</p>	 <p><b>RM Creative</b> Grass Mouse (<i>Rhabdomys</i> sp) pair in desert, Sossusvlei, Namibia Von: Alexander Koenders/ NIS Minden Pictures 537009695</p>
 <p><b>RF Creative</b></p>	 <p><b>RM Creative</b></p>	 <p><b>RF Creative</b></p>	 <p><b>RM Creative</b></p>	 <p><b>RM Creative</b></p>	 <p><b>RF Creative</b></p>

# Keyword search

- Good keywording is expensive, keywords often are incomplete, overloaded or wrongly translated
- Exact keyword matching leads to finding everything or nothing

"meadow"

826,951

results:



"meadow blue sky apple tree  
clouds flowers family"

3 results:



# Low-Level Content based Image Search

- Low-level image search finds similar looking images.
- Does not understand the meaning of the images.
- Cannot find similar images that look different



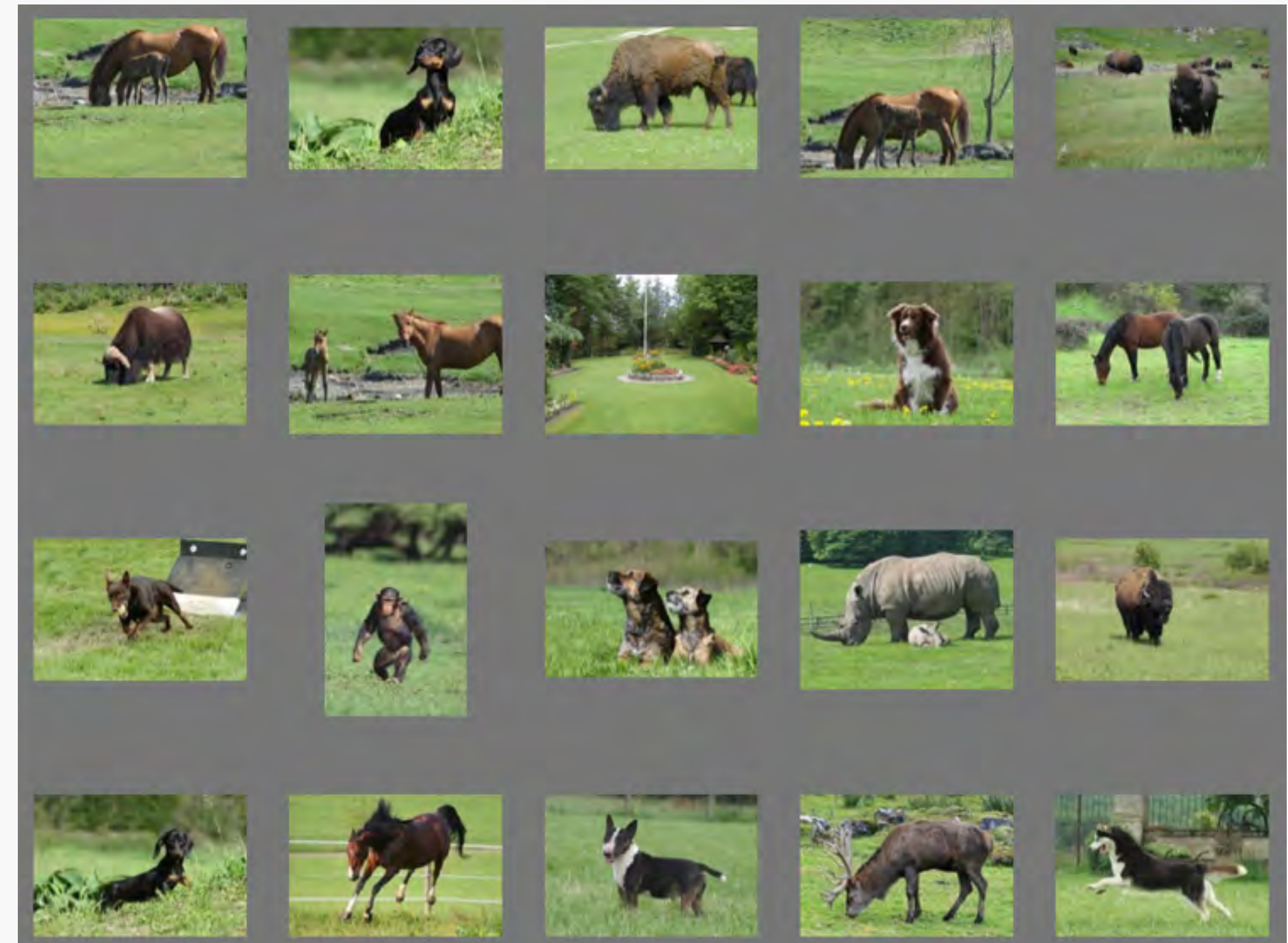
# Problem of visual image search

Visual search finds similar looking images, but does not "understand" the meaning of the image.

Query:



Result:



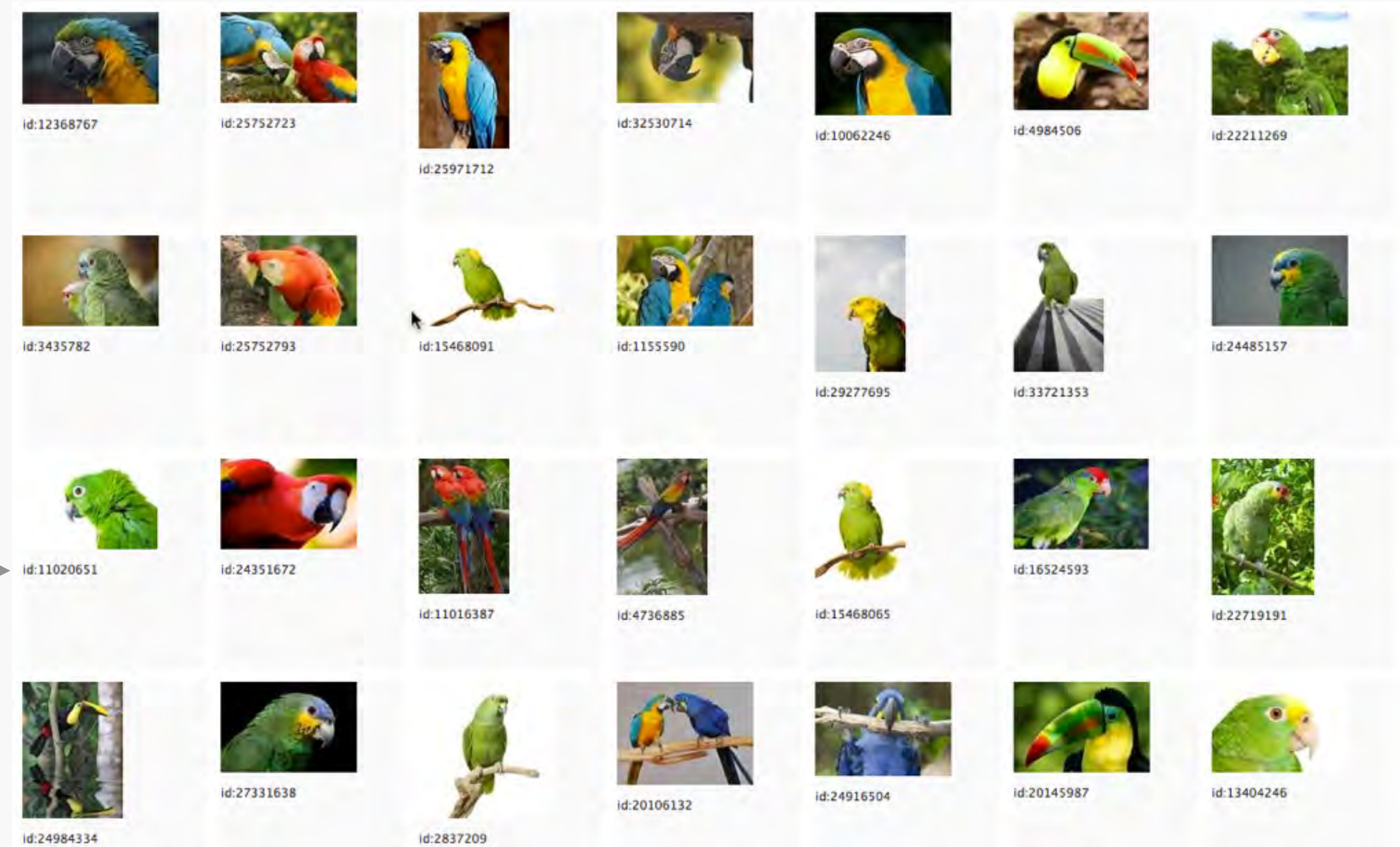
Visually similar images, context may be different

# "More like this" search using image keywords

## Query:

(The keywords of the query image)  
america amazon animal beak bird brazil era  
eye feather fuss parrot portrait yellow ...

Result: →



Similar image content, large appearance variations

# Fusing visual and keyword search

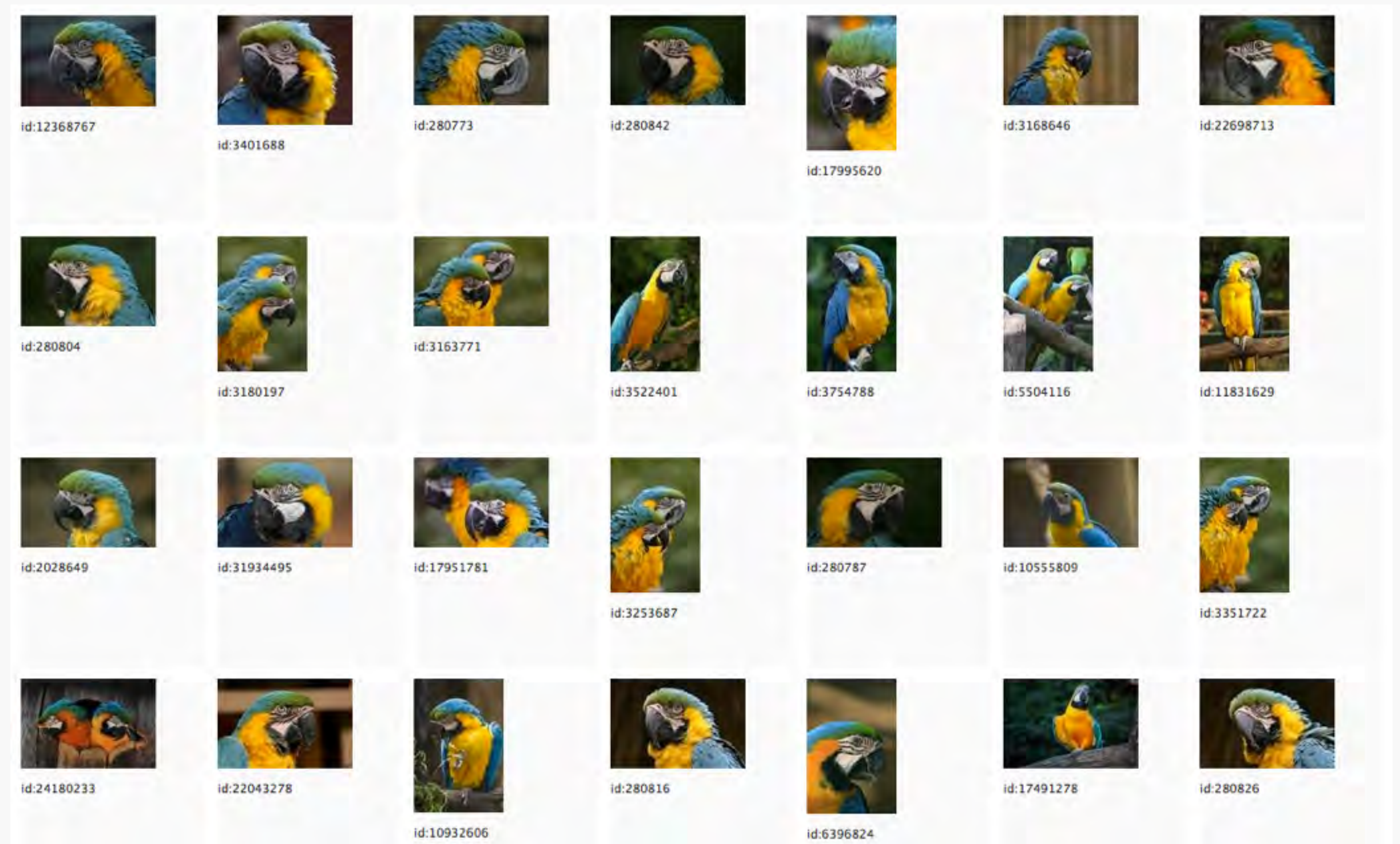
Query:



+

america amazon  
animal beak bird  
brazil era eye  
feather fuss parrot  
portrait yellow ...

Result: →



+ Visually similar images and (!) + Similar content

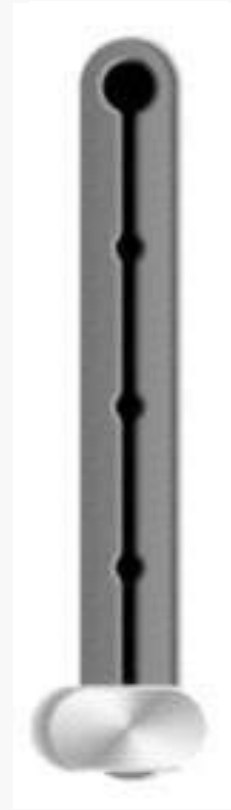


# Similarity Weighting



query:  
image  
+  
keywords

keywords



visual



# What can we do with this?

A fused search allows a unified similarity measure. This paves the way to:

- Improved image search results
- Automatic clustering of images
- But: No solution for untagged images (images without keywords)!

Enter keyword here



 pixolution

Images found

ms

by keywords

visually

What's the magic?




fusing visual and keyword search


**pixolution**



# Clustering Image Search Results

swiss

pixolution 26 773 Images found 0 ms ... by keywords ... visually What's the magic? 



Too many different images make it difficult to find images to start a similarity search

# Clustering Image Search Results

palm

s

Search

Welcome to

**palm**

From 15 million to 1.  
Find your image!

# What do we need to find image more easily?

Most images are untagged!

→ We need **automatic image understanding**

There are far too many images!

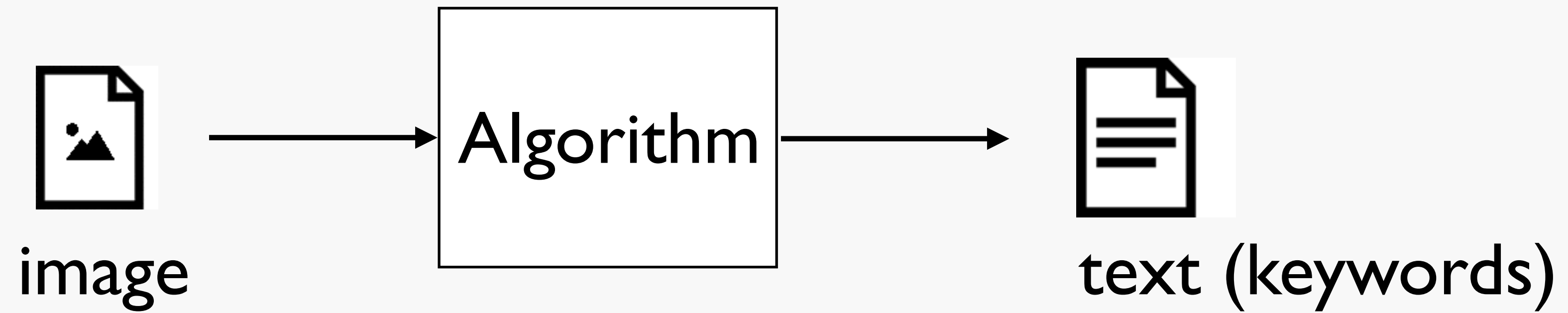
→ We need **visual image browsing**

# Automatic Image Understanding



# Image Understanding

What is shown in this image?





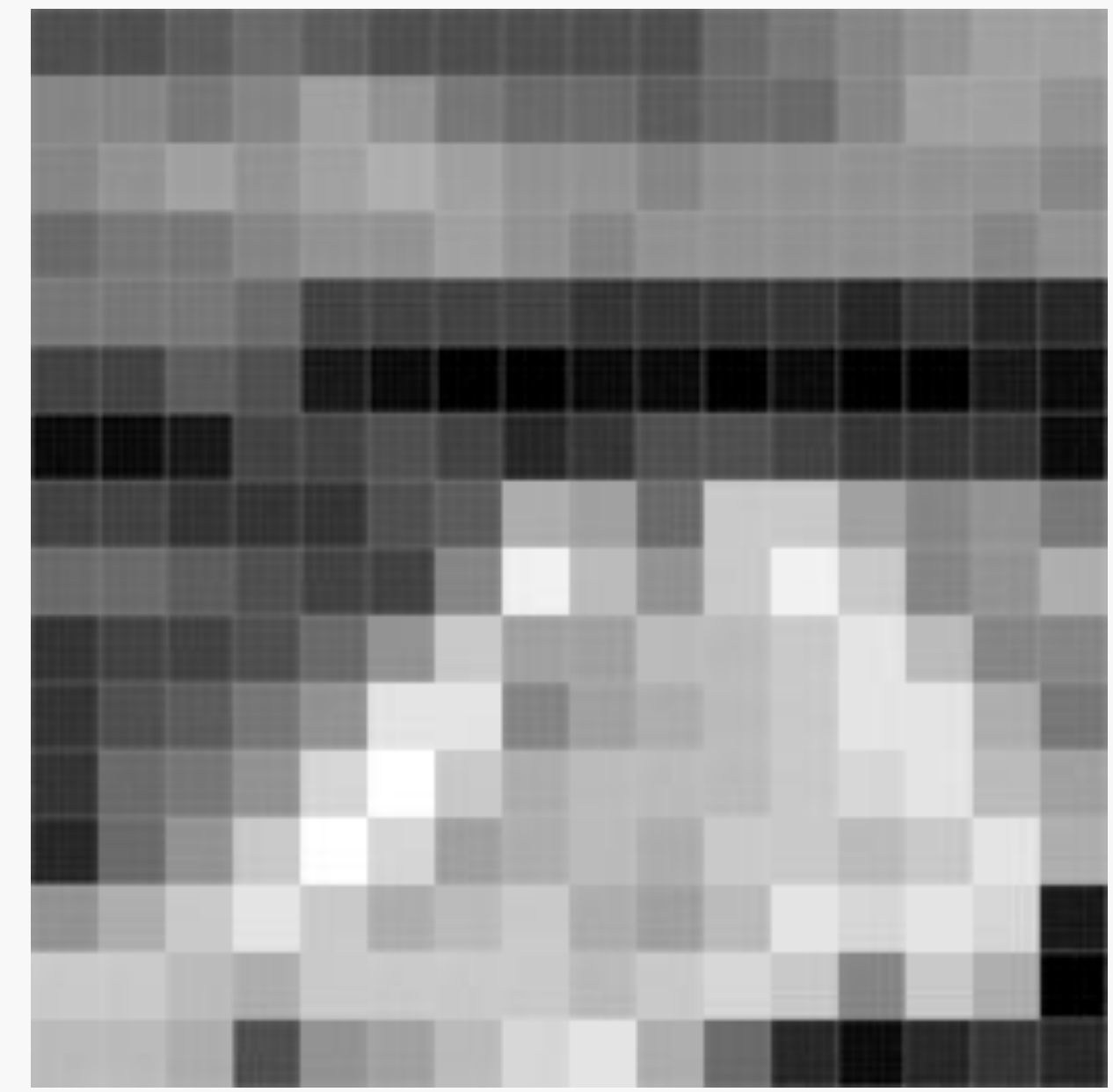
# Automatic Image Understanding



3264x2448 pixels  
16.7 million colors



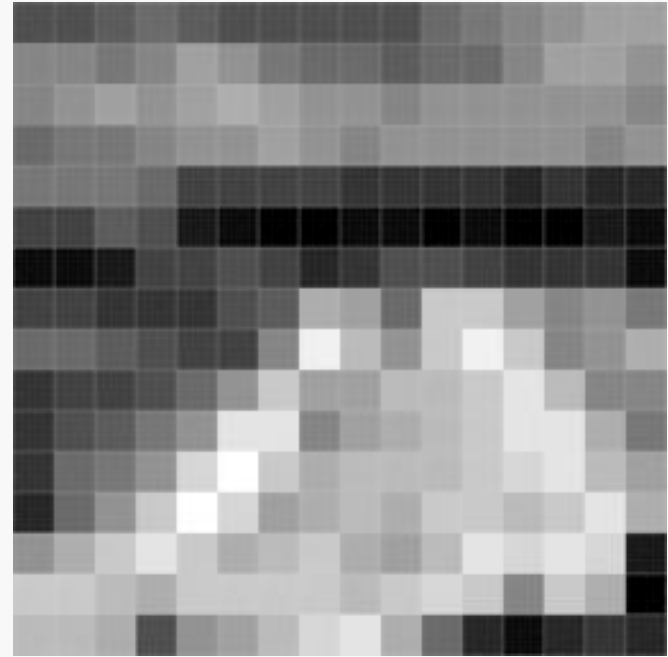
16x16 pixels



16x16 pixels  
16 brightness levels

164	229	229	224	219	214	199	192	185	160	77	33	24	28	30	26
170	235	226	209	197	185	170	159	155	138	68	29	25	29	30	29
165	220	213	200	187	173	164	158	161	134	74	62	67	73	79	82
154	189	193	203	207	201	197	187	182	141	104	151	175	177	177	173
184	210	209	215	218	213	208	198	188	140	128	180	202	195	189	185
225	221	221	214	215	214	208	206	199	148	115	158	190	193	189	185
227	221	217	217	213	218	206	203	209	144	113	152	190	193	189	186
221	218	215	215	213	213	209	211	202	146	119	163	196	197	193	189
216	220	219	219	215	216	214	218	186	106	83	131	181	202	198	191
216	214	214	216	215	218	214	186	122	57	49	55	132	185	190	186
218	215	214	217	218	214	200	141	78	47	39	63	118	161	177	180
215	218	217	216	218	220	207	125	73	52	70	152	189	188	191	187

# Automatic Image Understanding



16x16 pixels, 16 brightness levels

Number of possible images:

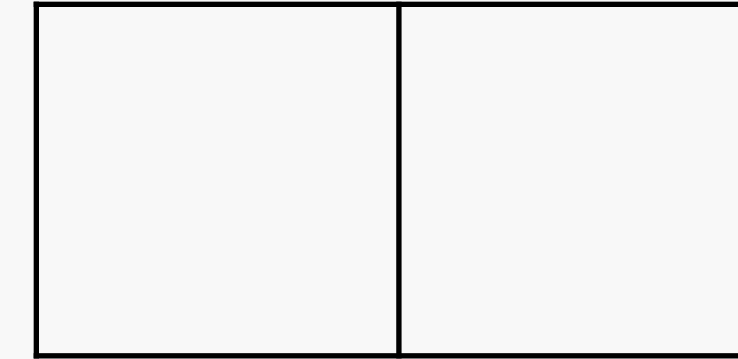
$$16^{16 \times 16} = 1.79 \cdot 10^{308} =$$

```
179 769 313 486 231 590 772 930 519 078 902 473 361 797 697 894 230 657 273 430 \.  
081 157 732 675 805 500 963 132 708 477 322 407 536 021 120 113 879 871 393 357 \.  
658 789 768 814 416 622 492 847 430 639 474 124 377 767 893 424 865 485 276 302 \.  
219 601 246 094 119 453 082 952 085 005 768 838 150 682 342 462 881 473 913 110 \.  
540 827 237 163 350 510 684 586 298 239 947 245 938 479 716 304 835 356 329 624 \.  
224 137 216
```

More than the number of atoms in the universe:  $10^{80}$

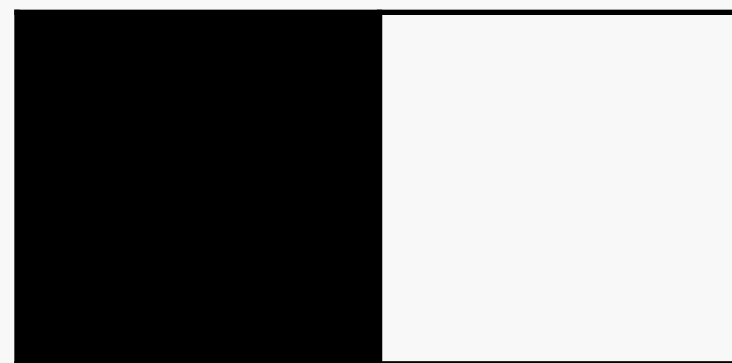
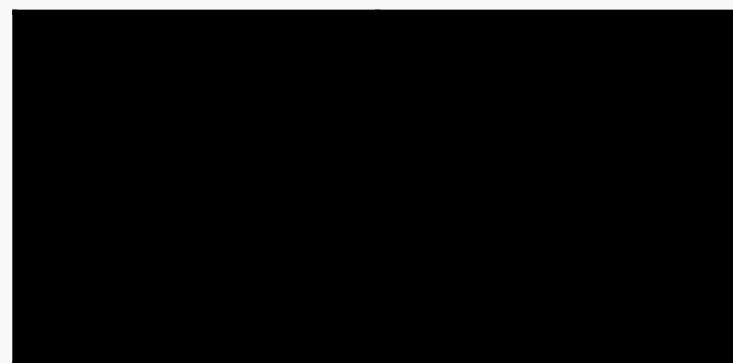
# Simple Case

- Image with only 2 pixels






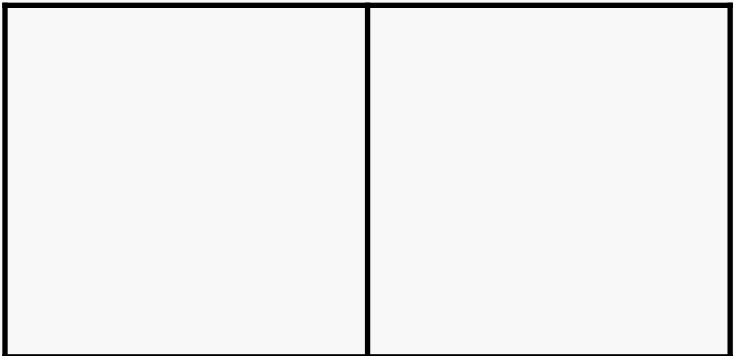
- Only black or white colors

- For possible images:

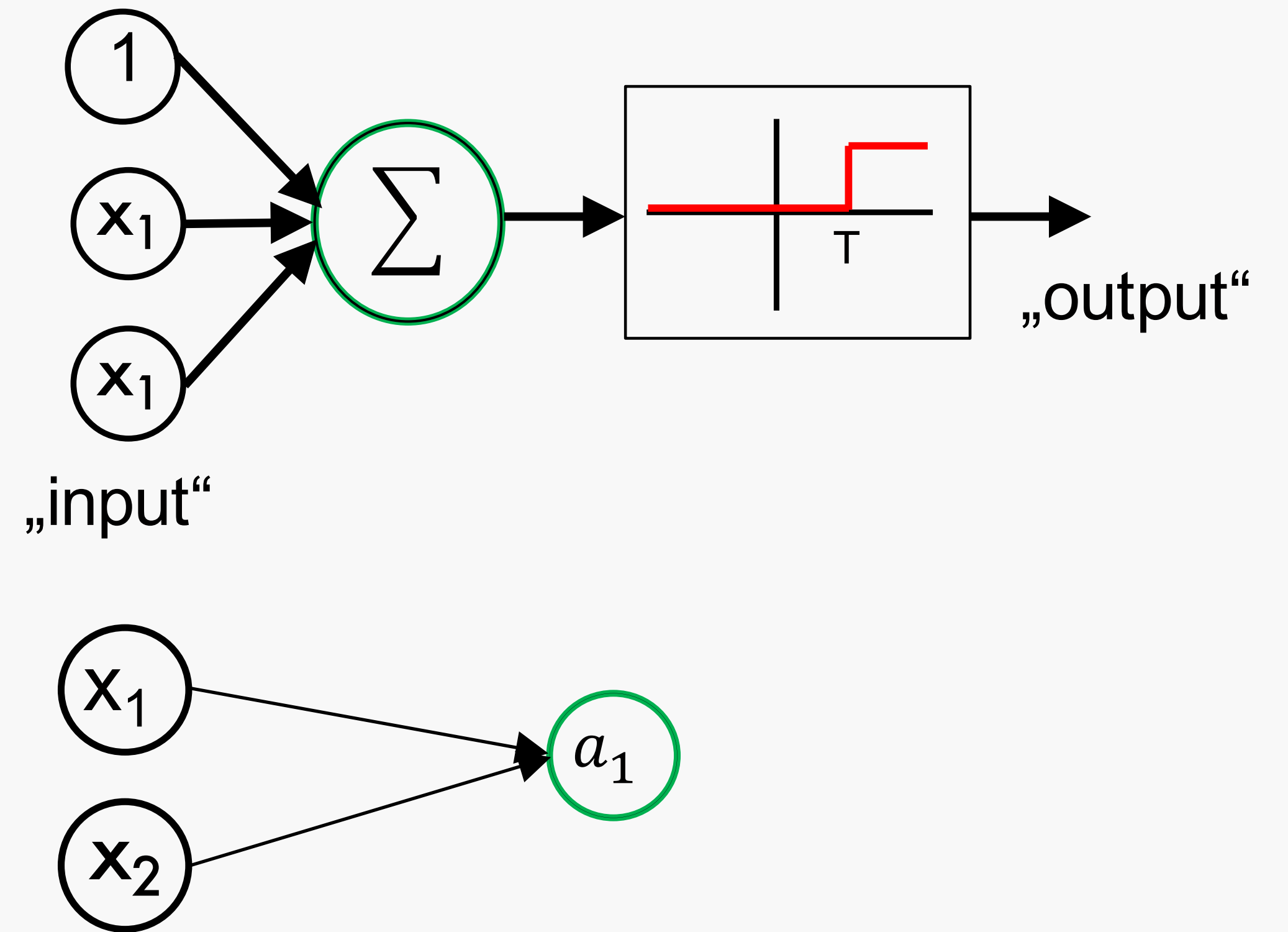
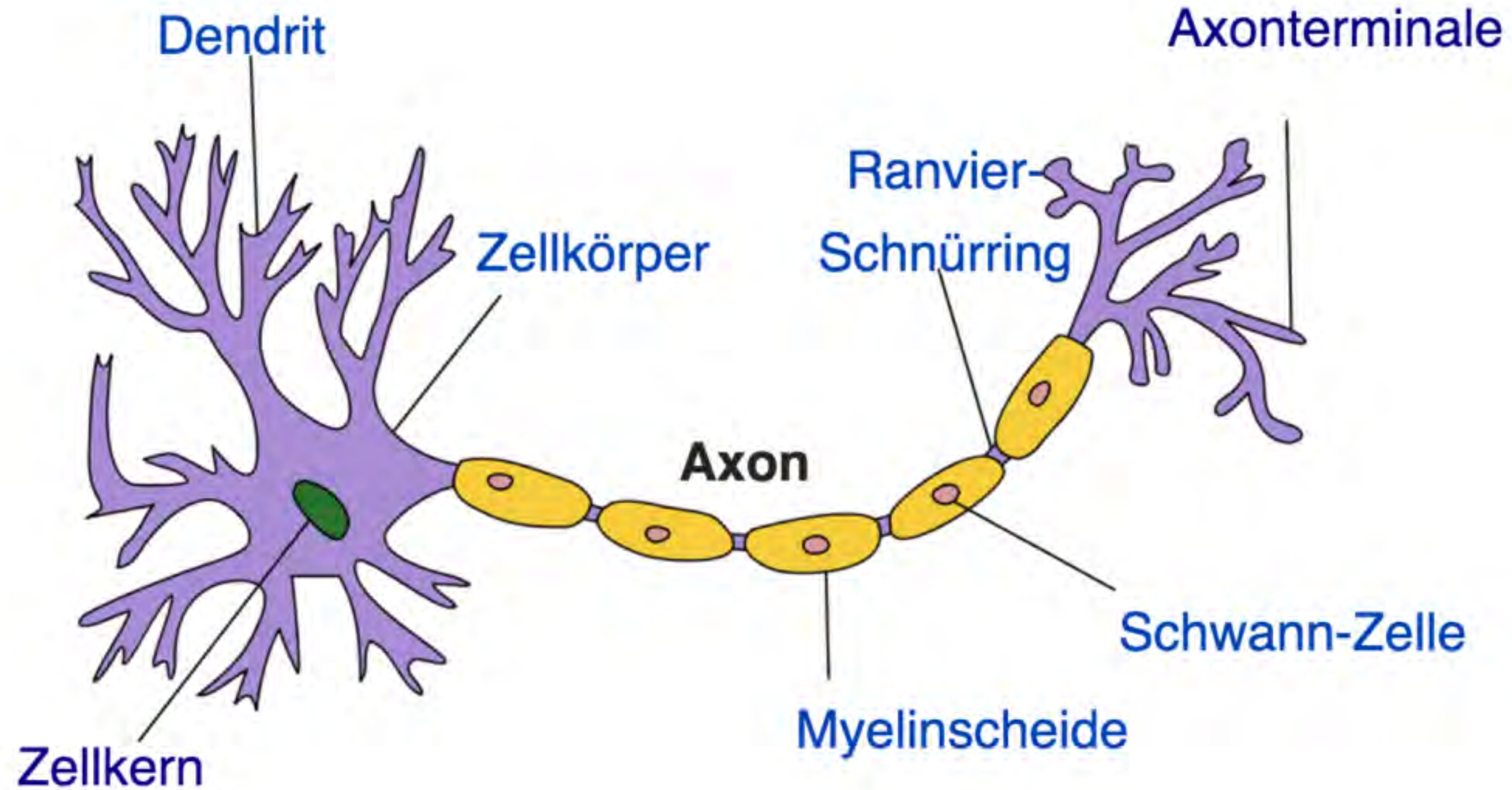


# Simple Case

Possible questions: Are the pixels ...

	both black?	both white?	both different?
	yes	no	no
	no	no	yes
	no	no	yes
	no	yes	no

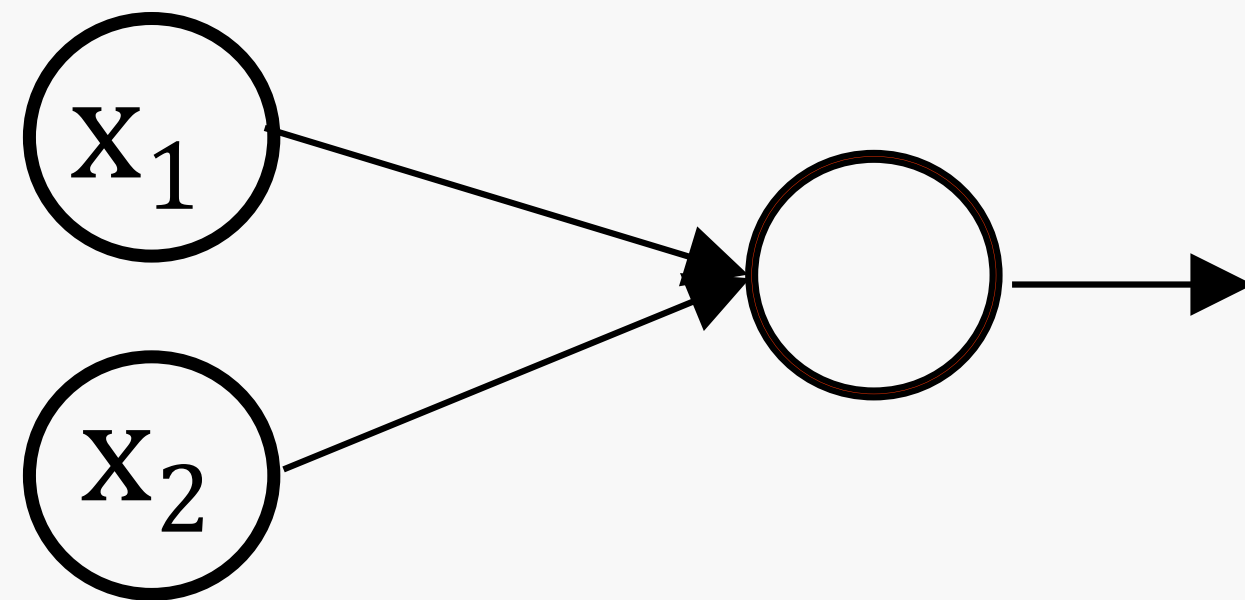
# (Artificial) Neural Network



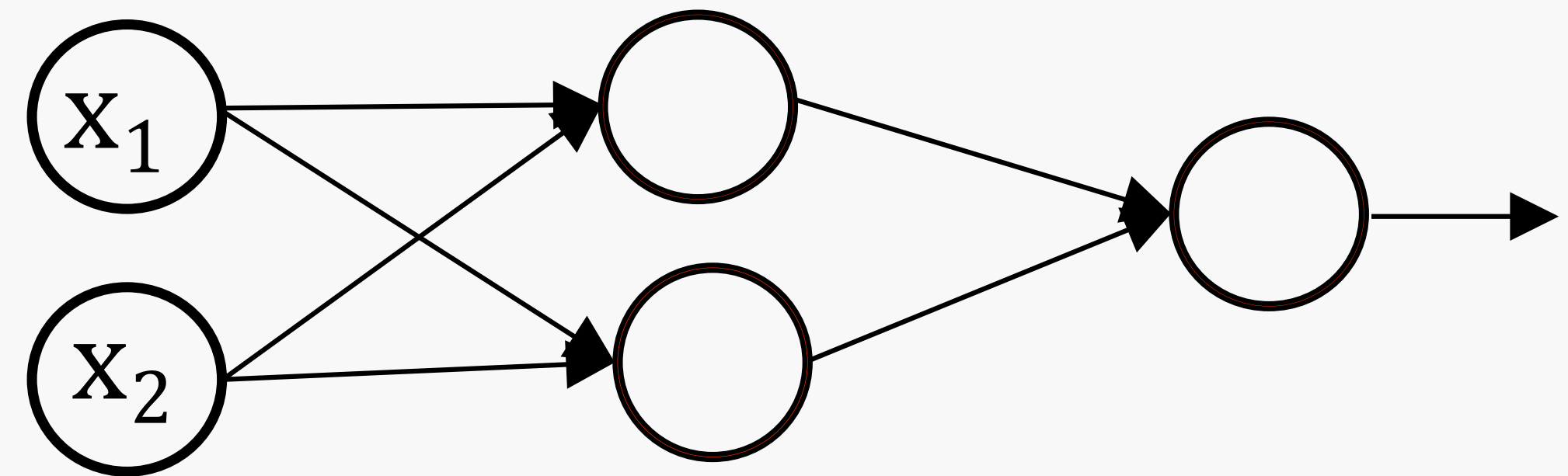
# Neural Networks

... can be trained to answer these questions:

Are the pixels all white?

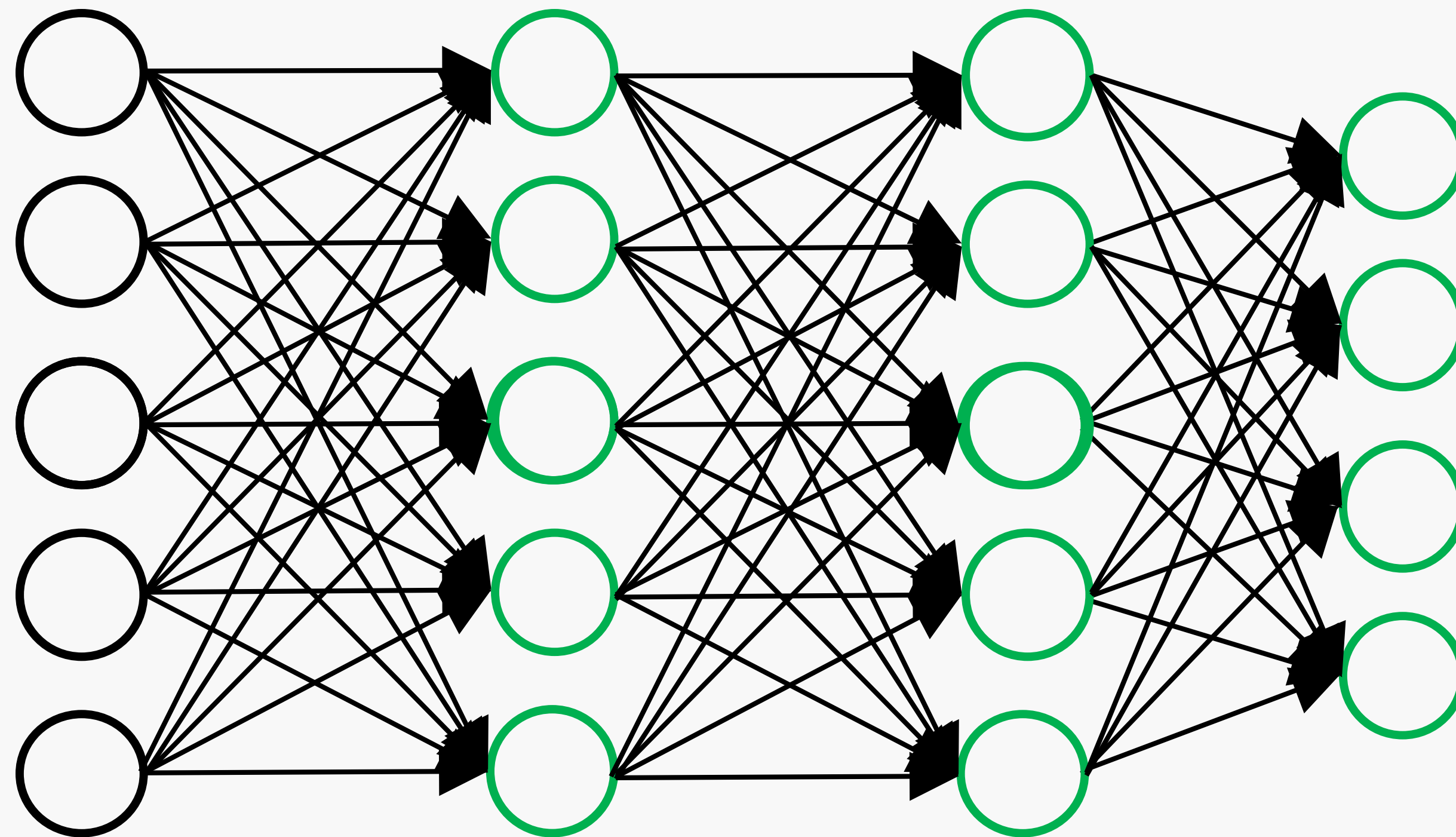


Are the pixels different?



# Neural Networks

Extension to automatic image understanding



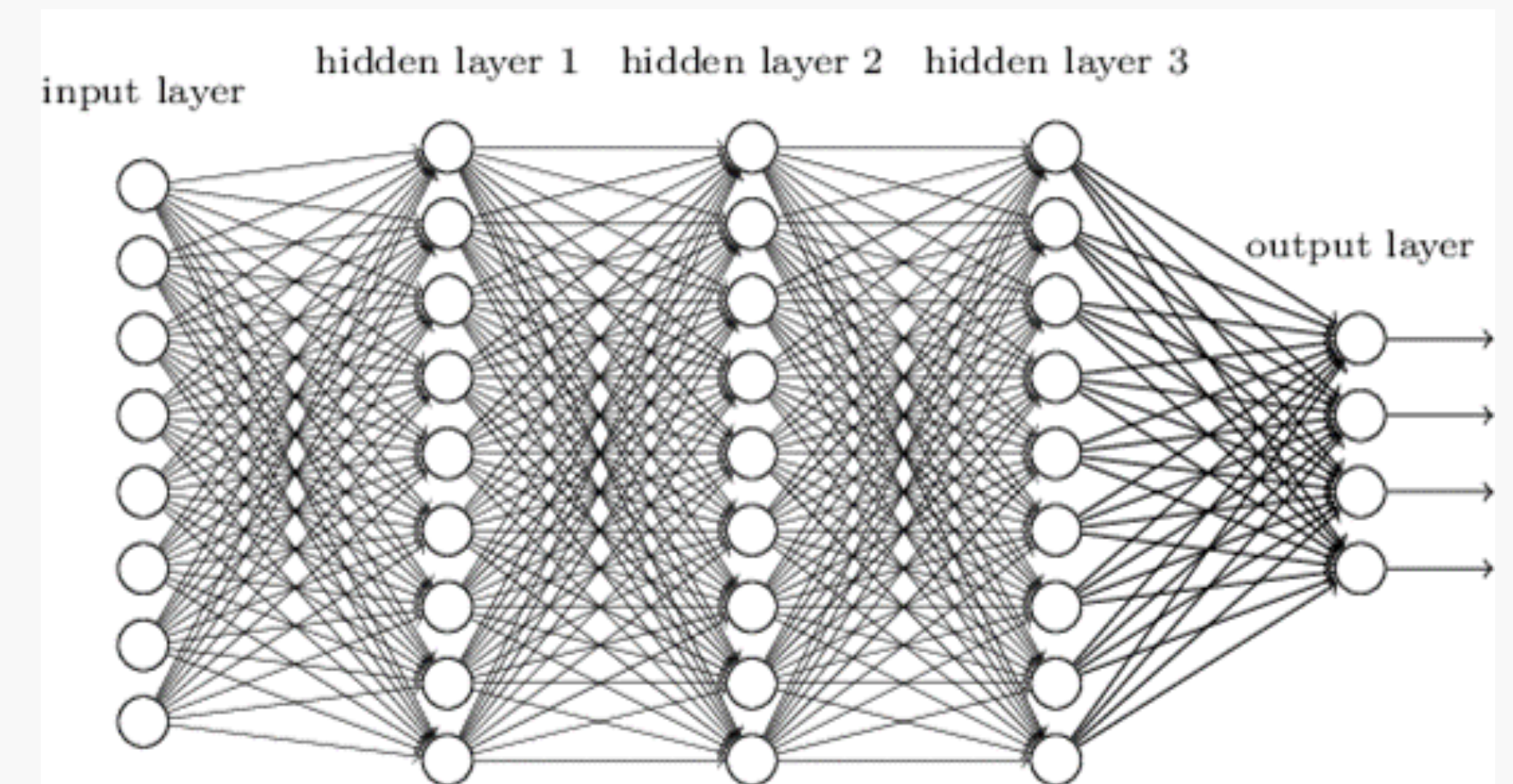
# Neural Networks for Image Understanding

## Problems:

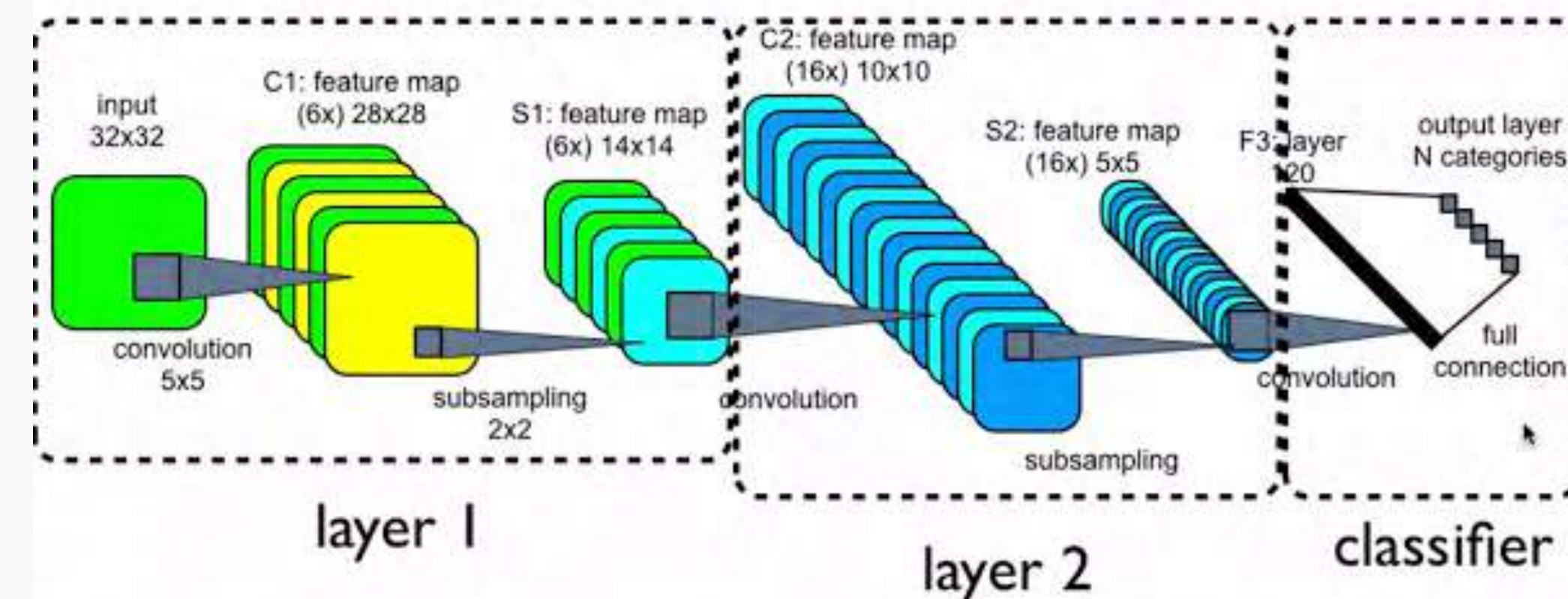
- Not enough example images
- Computers were too slow
- Too many parameters

All these problems were solved in the last years.

→ Deep Learning /  
Convolutional Neural Networks



## Convolutional Neural Networks





# Semi-automatic keywording



*akiwi*

a keywording tool v2

new

drop image  
or  
click here

akiwi finds keywords for your images.

[about](#) | [help](#)

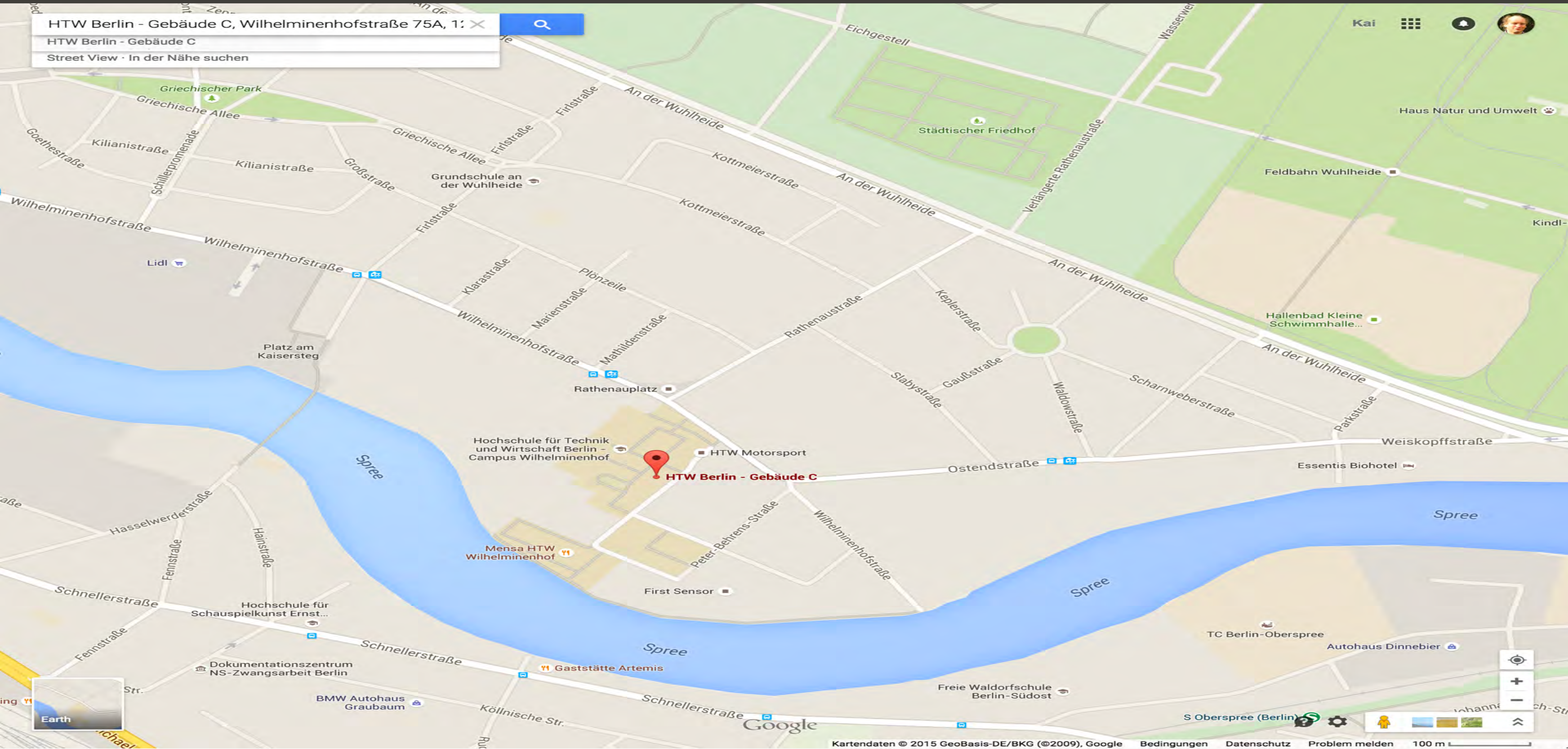
# Image Browsing / Image Navigation

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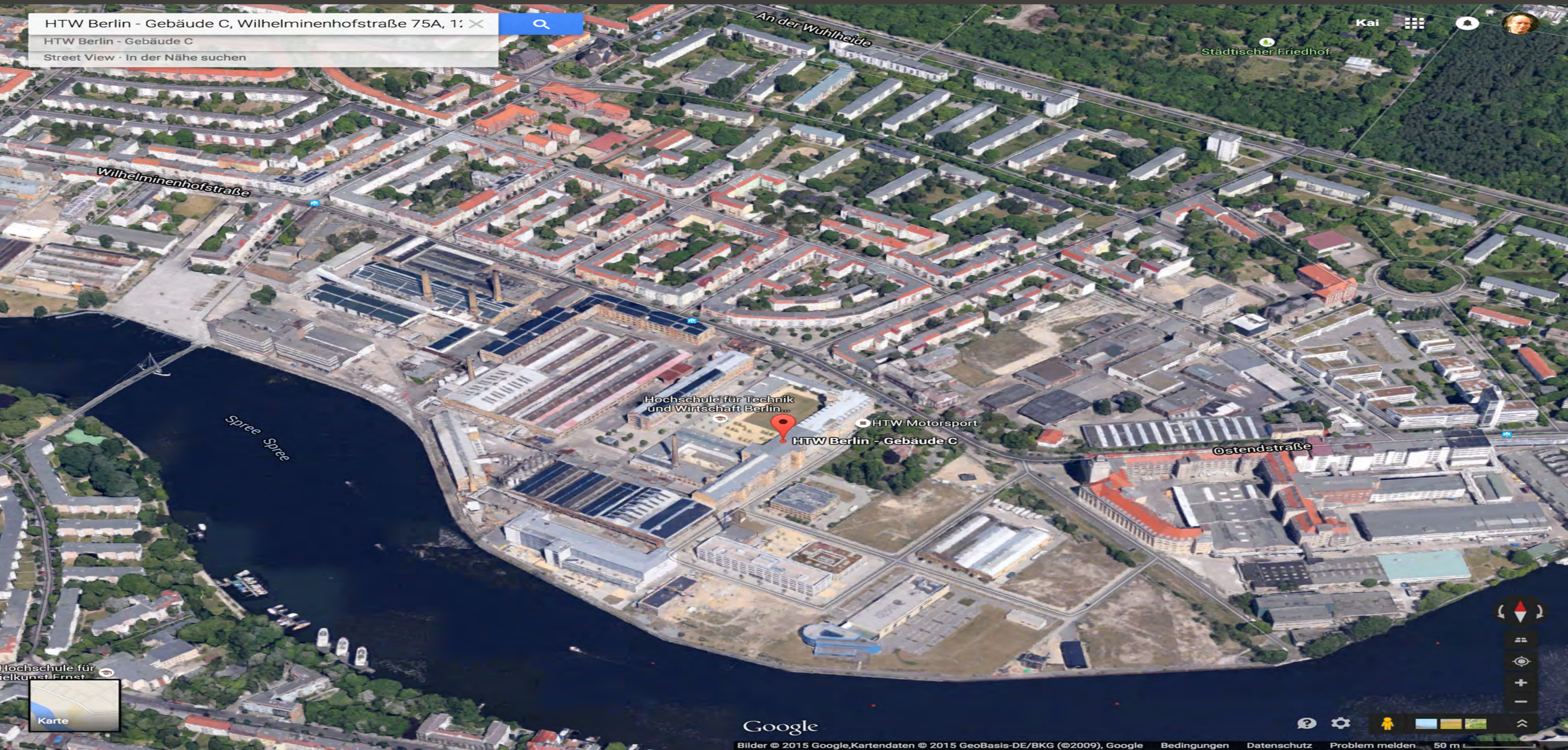
Instead of scrolling endless image lists:

Explore images!

# Google Maps



# Google Earth



HTW Berlin - Gebäude C, Wilhelminenhofstraße 75A, 1: X

HTW Berlin - Gebäude C

Street View · In der Nähe suchen



Kai



Städtischer Friedhof

Wilhelminenhofstraße

An der Wuhlheide

Hochschule für Technik und Wirtschaft Berlin...

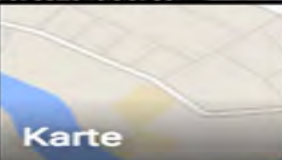
HTW Motorsport

HTW Berlin - Gebäude C

Ostendstraße

Spree Spree

Hochschule für  
Kunst Ernst



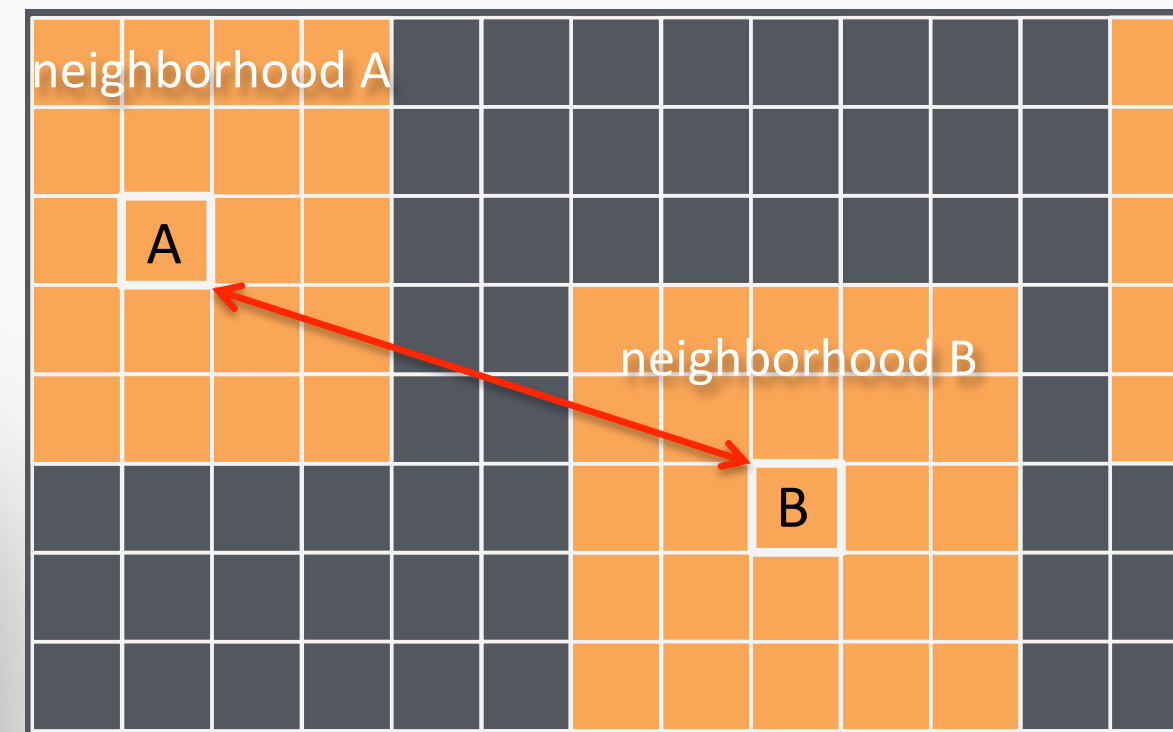
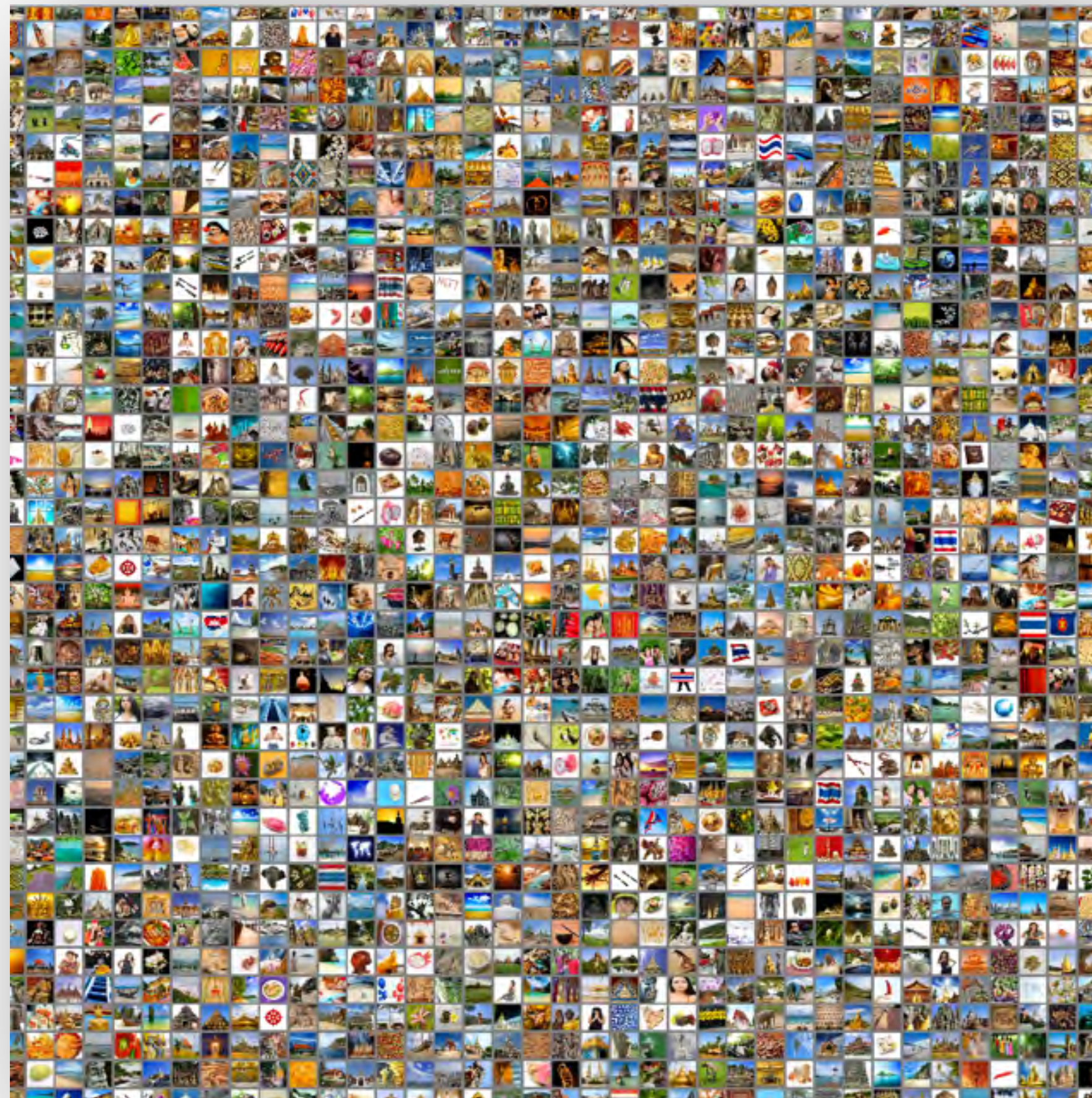
Karte

Google

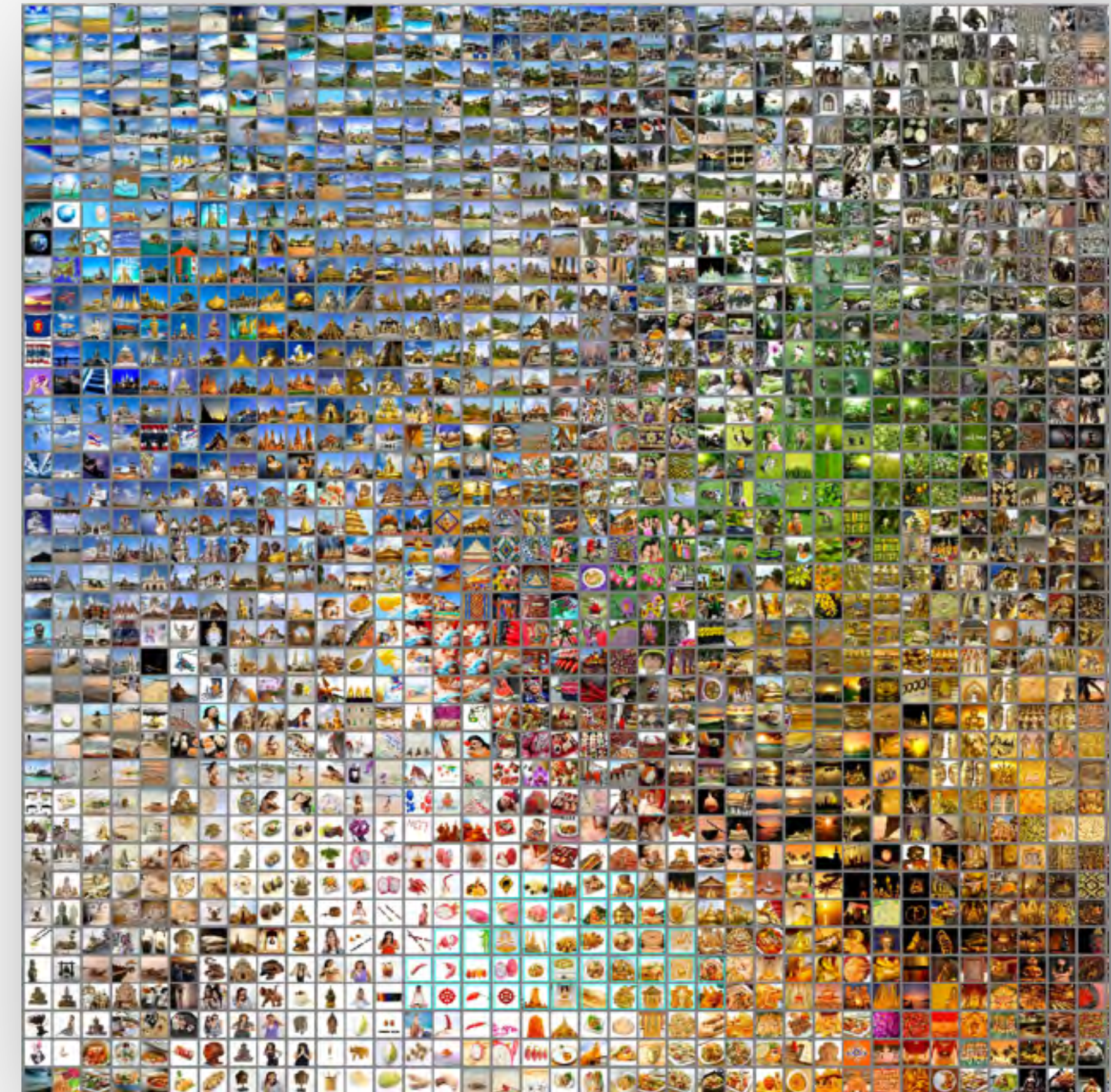


# 2D-Sorting by image swapping

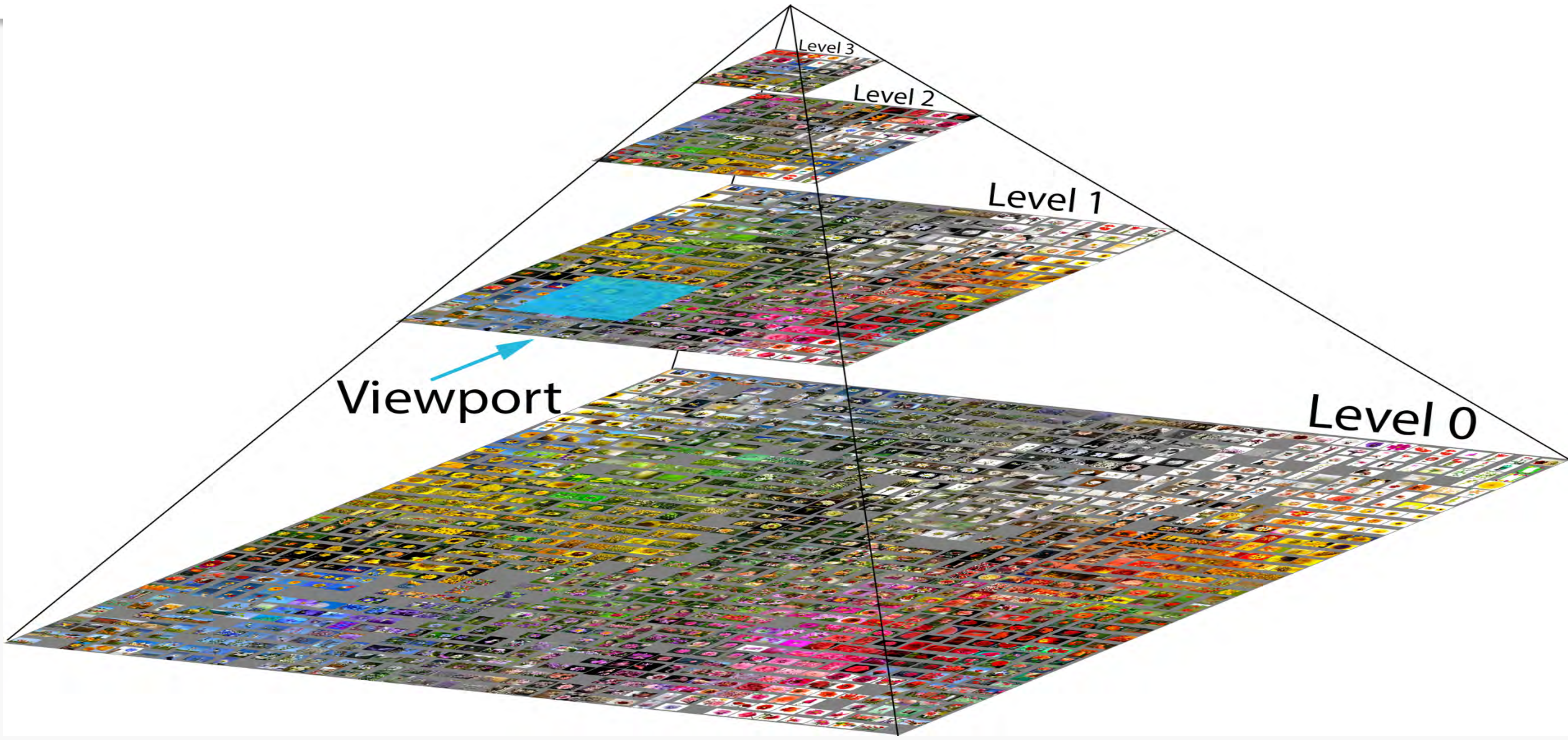
unsorted



sorted

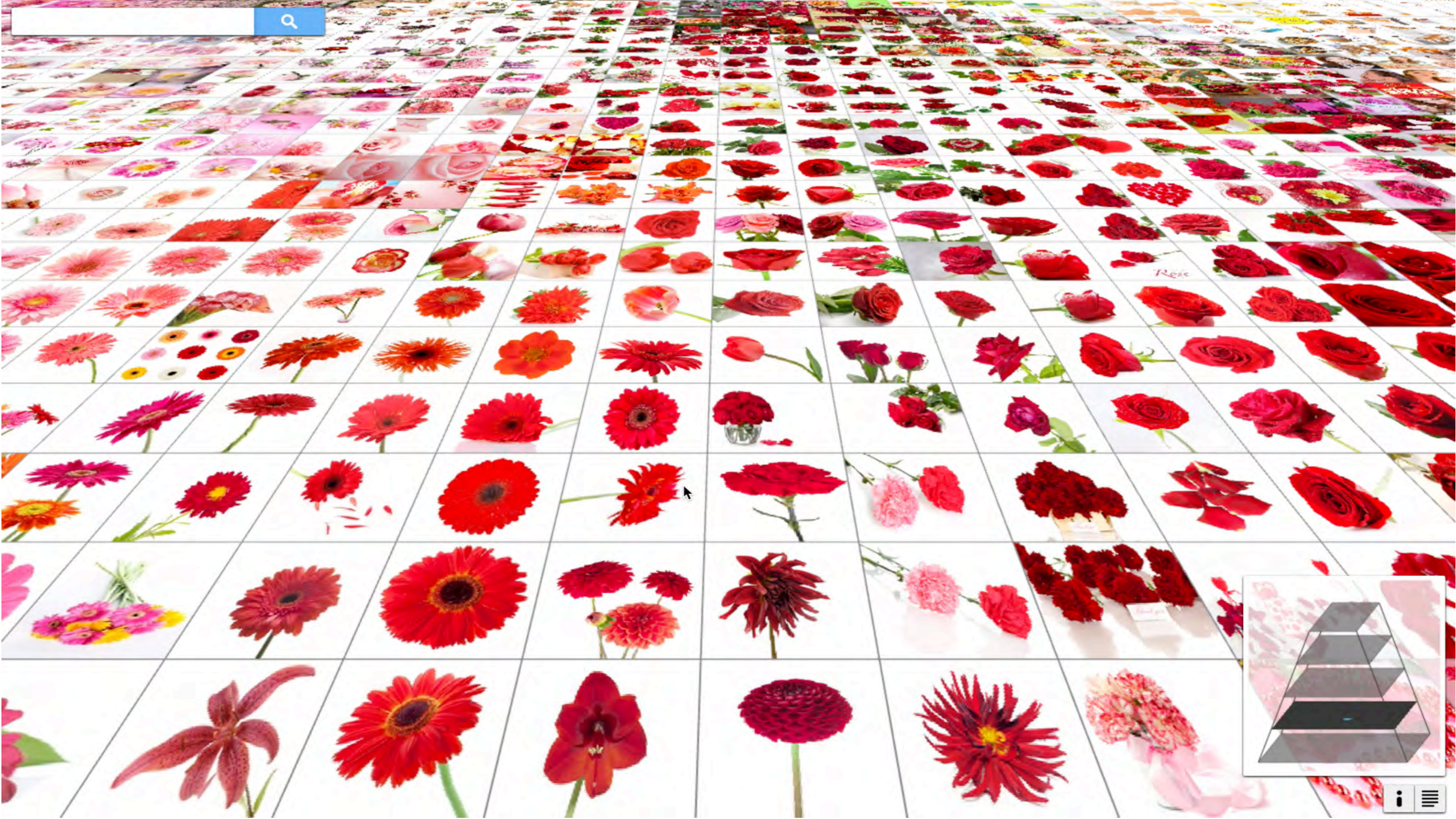
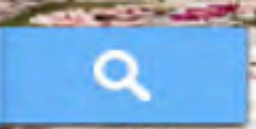


# Visual image browsing



[picsbuffet.com](http://picsbuffet.com)







picsbuffet

# Extension

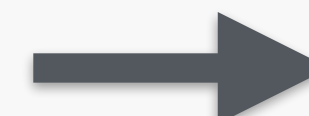
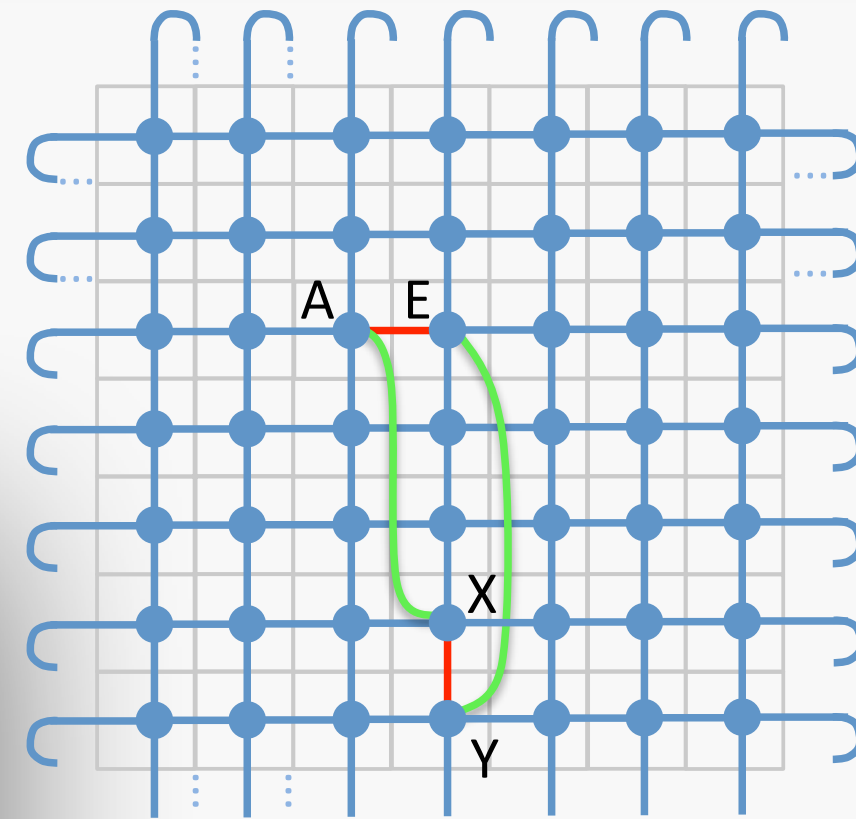
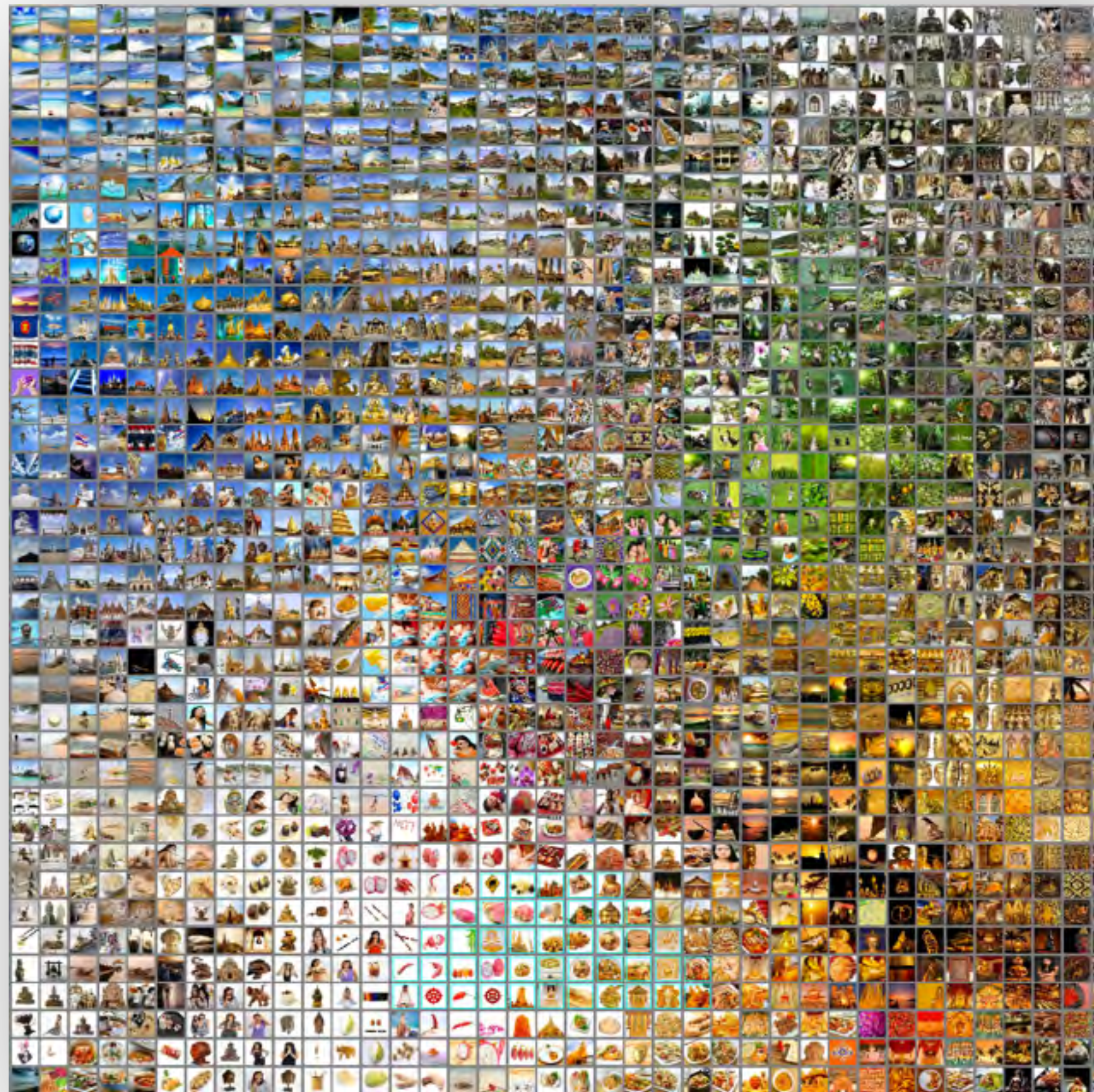
- Image relationships are too complex to be perfectly mapped on a 2D map.
- Idea: Use a high dimensional graph instead of a 2D map.
- Problems:
  1. How to construct a useful graph with millions of images?

A distance map of 1 million images has 1 trillion entries ( $10^{12}$ )

2. How to navigate the graph?

# Graph-building by edge swapping

2D sorting



Graph



# Graph Navigation

- Project fractions of the graph to a 2D map and perform instant 2D sorting
- Moving the map retrieves new images from the graph.



# Thank you

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[www.akiwi.eu](http://www.akiwi.eu)

[www.picsbuffet.com](http://www.picsbuffet.com)

[www.visual-computing.com](http://www.visual-computing.com)

[www.pixolution.de](http://www.pixolution.de)