

# **Image Knowledge | Image Analysis**

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# Image Knowledge

"Image knowledge" refers to the information and insights that can be derived from analyzing and interpreting images.

This includes understanding:

- visual content
- context
- objects
- patterns
- spatial relationships, and
- sometimes even inferred meanings or cultural references

In computational software analysis, image knowledge can come from:

- trained models that analyze images and provide insights based on
- learned patterns, often enabling applications in various fields such as art, science, security, retail, and more.

## Examples

**Scene Understanding:** Understanding the general context of a scene, like recognizing a beach, forest, or urban setting.

**Image Complexity Appreciation:** Creative explorations in constructing an image based on the configuration of forms, texture, screen subdivision, visual elements suggesting direction, movement, balance between chaos and order, challenges to formal rules.

**Sentiment and Expression Analysis:** Determining emotions or moods in images, especially those with human faces or social contexts.

**Pattern Recognition:** Identifying patterns, such as color schemes or recurring shapes, which can be important in fields like medical imaging or fashion.

**Object Recognition:** Identifying objects in an image, like cars, animals, people, etc.

**Facial Recognition:** Recognizing or matching faces, often used in security and tagging applications.

**Text Recognition (OCR):** Detecting and interpreting any text within an image.

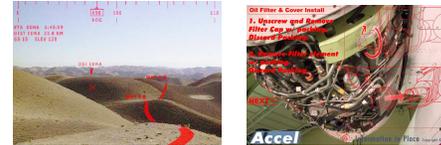
## Abstract

*Images play an important role in visualization. As users are more willing to adopt a product if it evokes pleasurable feelings the aesthetic appeal of interfaces becomes more important. Thus, there is a growing need to generate also images which appear aesthetically to the user. Starting with the modularities of the human visual system, we derive six dimensions of visual aesthetics. For each dimension we explore, inspired by principles of the visual arts and insights of cognitive neuroscience, which peculiarities of the dimensions are particularly adequate for an aesthetic impression. Accompanied by a fair number of image examples, these considerations result in an easy to understand guideline for computer scientists and interface designers how to deal with images in terms of aesthetics.*

## 1. Introduction

The roles of images<sup>1</sup> in visualization are manifold. Stone et al. [1] name four main benefits. Images motivate and attract the attention of the user and have the function to persuade her. They communicate information, which is often exploited in computer-based learning. Furthermore, they have the great power to overcome language barriers, and they support interaction. Images are especially powerful whenever it is difficult to describe the depicted information by words or numbers. This is the paradigm for most human-computer interaction applications. For example, in web design images are utilized mainly for two different purposes. They can have the function to attract the user and may be used as anticipation of the overall topic of the website. On the other hand, small thumbnails promote interaction. In e-learning images usually are the support of the information, that should be conveyed by the course. Other examples of interfaces from several applications of augmented reality (geovisualization, navigation, maintenance and repair, and a museum guide) where images are the key components of

<sup>1</sup>The term "images" is used here in the sense of pictures, i.e., photographs or drawings. It does not denote diagrams or charts.



**Figure 1. Images as key components of visualization: navigation and maintenance.**

the visualization, are shown in figures 1 and 2. The left picture of figure 1 shows an image of the environment which is augmented by data indicating a possible path for a vehicle. One could be of the opinion that such a real-time navigation system has to show "just the image the camera captures". But the interface designer has to decide for the specification of numerous variables that determine how the captured image is presented in the user interface. To name but a few, she has to choose color space, contrast, dynamic range, spatial arrangement of the image components (e.g., the position of the horizon), depth of field, and focal length. The right part of figure 1 shows an example for maintenance instructions for an engine. The previous statements hold true for this example, as well. The last example is given in figure 2. A virtual guide for the Guggenheim Museum Bilbao refers the visitor to architectural features of the building or gives explanations of exhibits. Two screenshots from the user interface are shown. In the context of information visualization and human-computer interaction topics such as the importance of aesthetic qualities of graphical elements of user interfaces [2] or the aesthetics of interaction [3] have frequently been addressed. Also the relation between visual and verbal information in presentations has been dealt with [4]. What is underrepresented in the literature is the role of image aesthetics in visualization. This paper is an attempt to fill this gap. To identify aesthetic dimensions that, on the one hand, allow for the evaluation of the aesthetic qualities of an image and, on the other hand, enable an interface designer to adapt her tools to the needs of the

# Effective Complexity & Formal Organizational Control

*Something almost entirely random, with practically no regularities, would have effective complexity near zero. So would something completely regular, such as a bit string consisting entirely of zeroes. **Effective complexity can be high only in a region intermediate between total order and complete disorder***

## **Spatial Organization**

The sub-division of the image  
Visual tension between forms  
Simple to complex structures  
Balanced / imbalanced spatial grouping of forms

## **Texture**

Light / dark tones for subsections  
Color range, color hue(s), color saturation  
Darkness / brightness  
Complementary color contrast  
Complex to simple texture

## **Formal Relationships**

Foreground / background  
Depth perspective  
Regular to irregular forms (repetition / variation)  
Blur value between visual elements

## **Direction / Movement**

Angle of forms and lines  
Rhythmic variation  
Clustered groupings to suggest movement

## Joseph Kosuth: (artist)

"*One and Three Chairs*" is a conceptual artwork created in 1965 that features a physical chair, a photograph of that chair, and an enlarged dictionary definition of the word "chair."



[https://en.wikipedia.org/wiki/One\\_and\\_Three\\_Chairs](https://en.wikipedia.org/wiki/One_and_Three_Chairs)

## Garry Winogrand (photographer)

*"I photograph to find out what something looks like photographed"*





*Ricking the Reed*(1886) Peter Henry Emerson, UK, [https://en.wikipedia.org/wiki/Peter\\_Henry\\_Emerson](https://en.wikipedia.org/wiki/Peter_Henry_Emerson)



*Ricking the Reed*(1886) Peter Henry Emerson, UK, [https://en.wikipedia.org/wiki/Peter\\_Henry\\_Emerson](https://en.wikipedia.org/wiki/Peter_Henry_Emerson)



*Ricking the Reed*(1886) Peter Henry Emerson, UK, [https://en.wikipedia.org/wiki/Peter\\_Henry\\_Emerson](https://en.wikipedia.org/wiki/Peter_Henry_Emerson)



*1976*  
**Tones** (1976) Michael Bishop, Chicago Center for Contemporary Photography



**Girl with Leica (1934)** Alexander Rodchenko, Moscow



Laszlo Moholy-Nagy (1924), Berlin



*Self-Portrait* (1924) Laszlo Moholy-Nagy



*Self-Portrait with Leica* (1931), Ilse Bing [www.eastman.org/node/6733](http://www.eastman.org/node/6733)



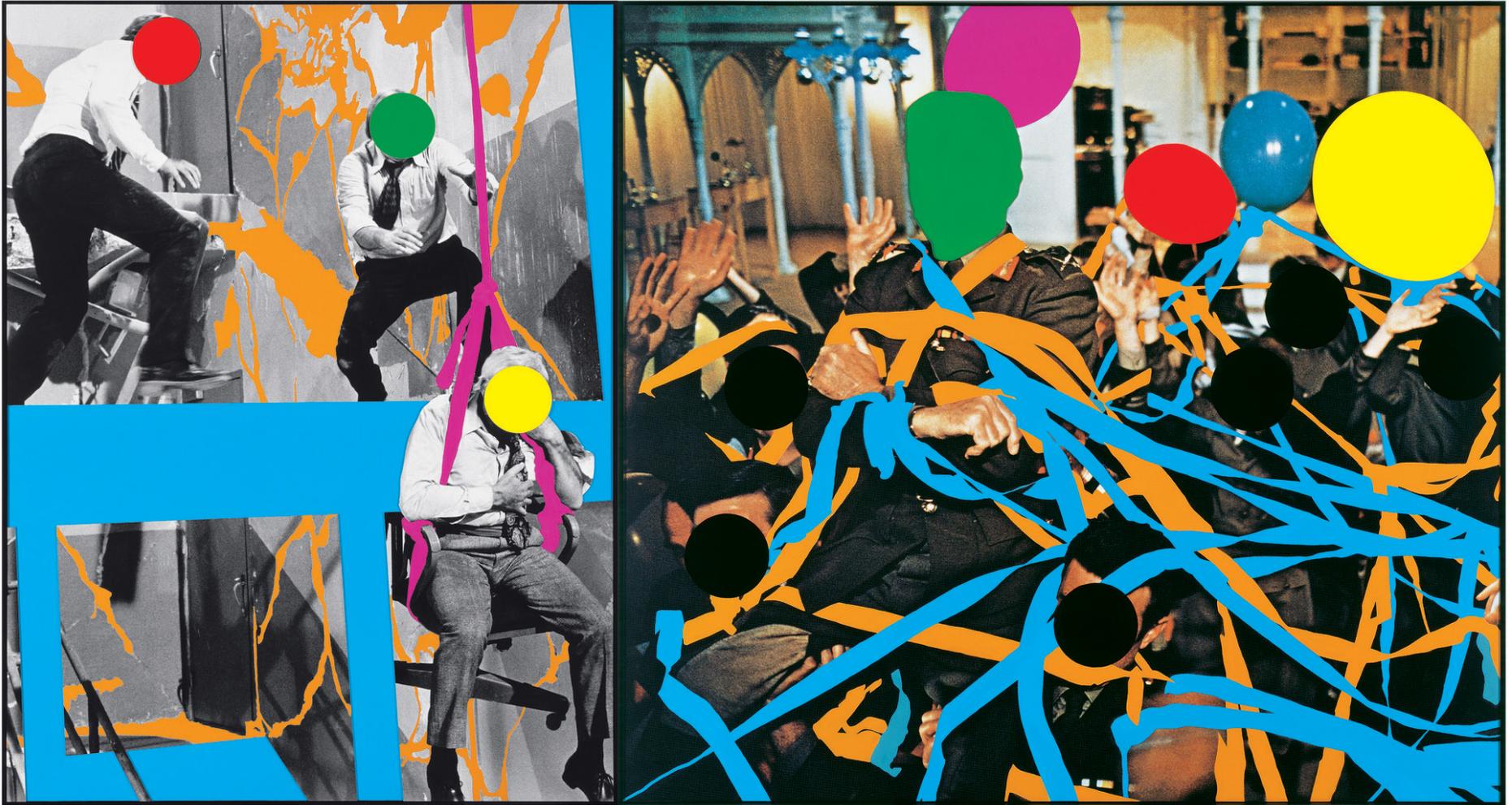
*Street Photography* (2019) Camilo Jose Vergara



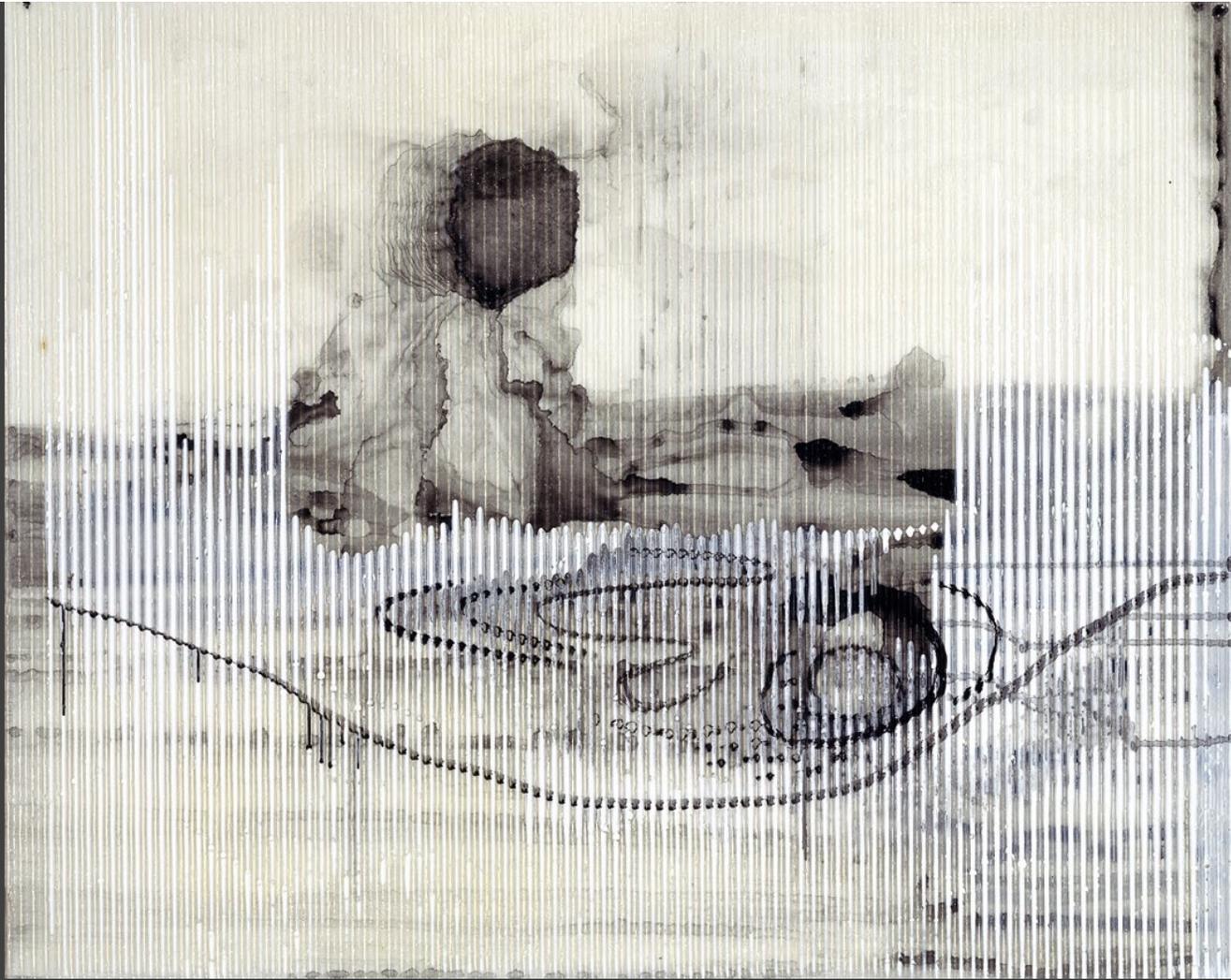
Gaza (2023) News photo



*Prisoners Sleeping in a Phillipines jail (2023) News photo*



*Fissures and Ribbons* (2004) John Baldessari, <https://eastofborneo.org/articles/john-baldessari-cut-to-the-chase/>



Sigmar Polke

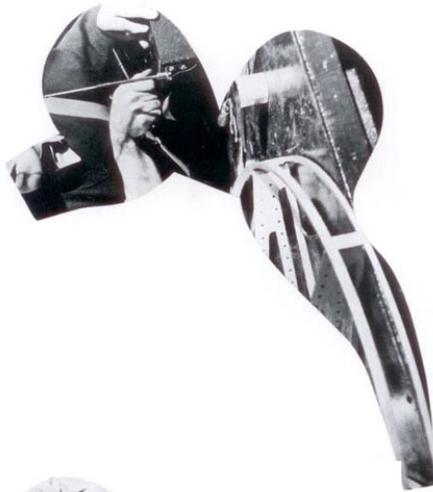


Sigmar Polke, [https://www.artistdatabase.com/sites/default/files/top\\_artist\\_works/Sigmar%20POLKE.jpg](https://www.artistdatabase.com/sites/default/files/top_artist_works/Sigmar%20POLKE.jpg)



Sigmar polke

## John Baldessari Non-Rectangular Framing



<https://www.mat.ucsb.edu/g.legrady/rsc/bald/index.html>

# LARRY SULTAN

Evidence: Larry Sultan and Mike Mandel / Statement + History



WORK  
BOOKS  
ABOUT LARRY  
EXHIBITIONS  
NEWS & REVIEWS  
CONTACT

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Newly Released

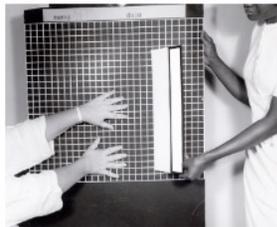
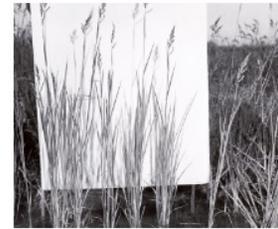
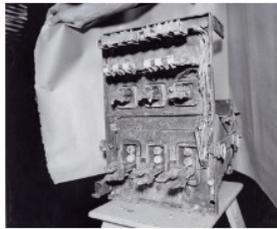


SWIMMERS

Available from MACK



PICTURES FROM HOME



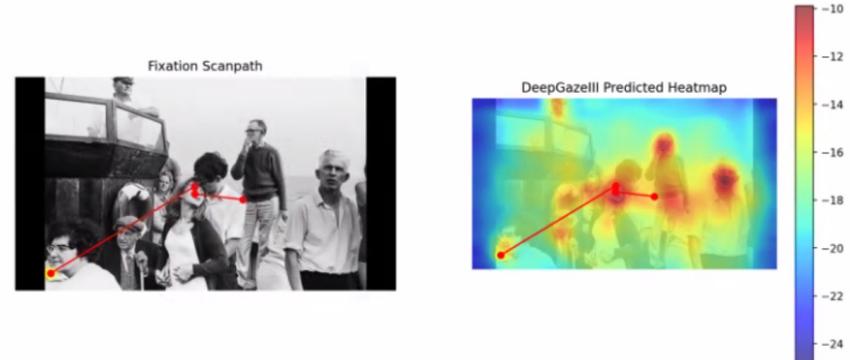


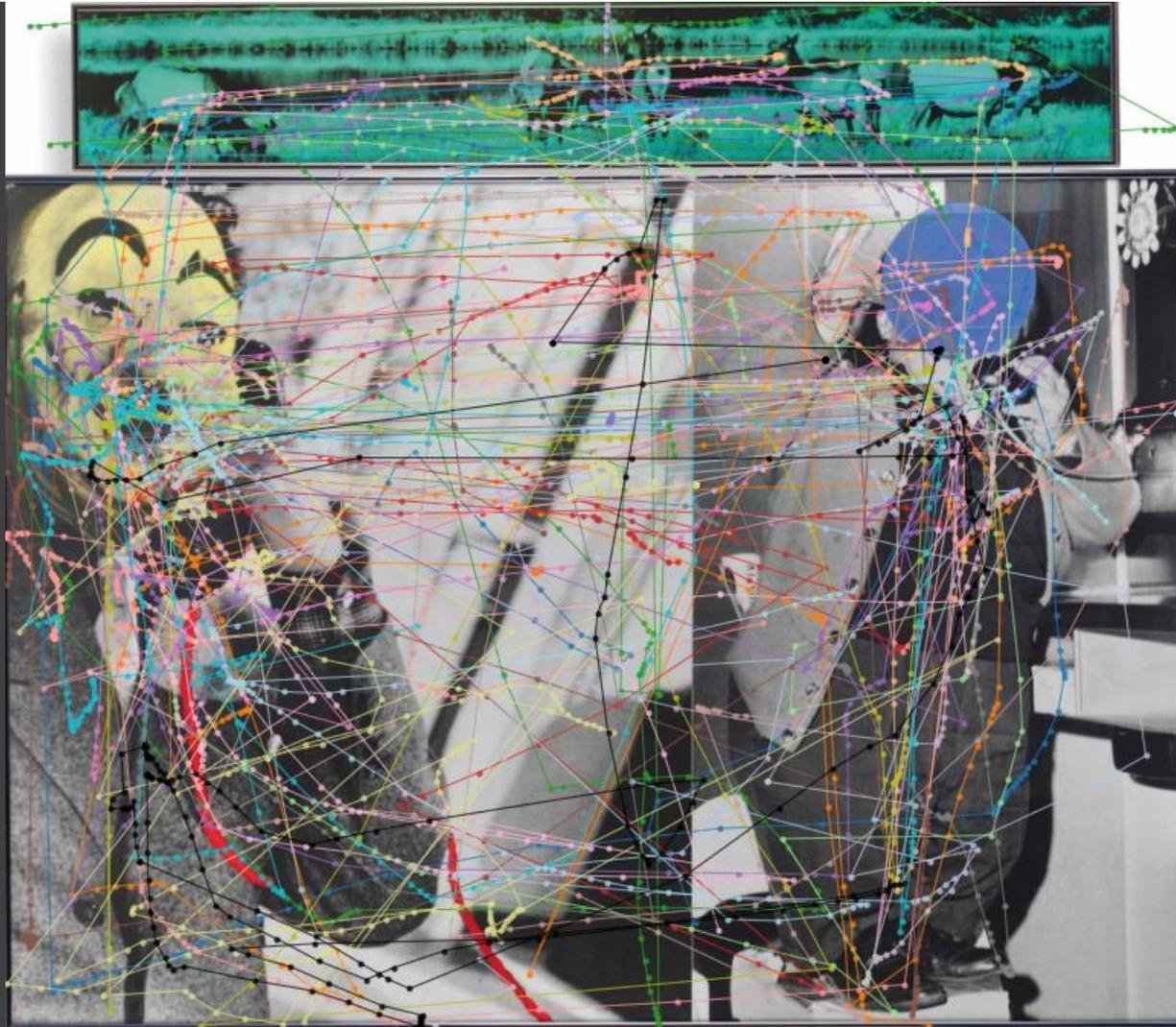
*Tones* (1968) Tony Ray-Jones, <https://americansuburbx.com/2012/06/tony-ray-jones-photographs-of-america-and-england-1968.html>

# Research: Visual Study thru Eye-Tracking to Guide AI Image Generation, Weihao Qiu, Shaw Xiao

The interface displays a grid of image thumbnails. The first row contains five thumbnails with buttons labeled 'Select 0' through 'Select 4'. The second row contains five thumbnails with buttons labeled 'Select 5' through 'Select 9'. Below the grid, the text 'Selected Image: 10\_jones\_1.jpeg' is shown. A 'Select All Subjects' button is present. Under 'Select Subject Folders', a dropdown menu shows 'Lydia\_EOYS\_ima...'. The 'Selected Subjects' list contains ['Lydia\_EOYS\_images']. There are three checkboxes: 'Show Map' (unchecked), 'Compute Fixations' (checked), and 'Compute Fixation Crops' (unchecked). The 'Algorithm Mode' is set to 'AND'. There is a 'Fixation Detection Parameters' dropdown. At the bottom, 'Select a Subject for DeepGazeIII Prediction' is set to 'Lydia\_EOYS\_images'.

## Selected Image: 10\_jones\_1.jpeg





*Two Men and Telephone (with Animals)* (1988) John Baldessari, <https://www.christies.com/en/lot/lot-5944715>



Bruce Gilden



*Hyeres* (1932) Cartier-Bresson

## Problem Statement

The great challenge of current generative AI image synthesis is to understand *what degree the input* (image or text prompts) can result in outcomes that *align with the image maker's intentions*

## ExpVisLab Research

Implement a feedback model into the Stable Diffusion pipeline to evaluate *interestingness level* to adjust image generation to increase *evaluation results*

## Guiding Perspective

*Technologies* leave an imprint on the data content they process and therefore the *meaning of an image to a great degree is a consequence of its construction and the technologies used*

Seed: 1

Seed: 2

Seed: 5

Seed: 10

Seed: 100

CFG Scale: 1.0



CFG Scale: 3.0



CFG Scale: 5.0



CFG Scale: 10.0



CFG Scale: 20.0



**Autumn Smith:** Rainy day in Paris, man standing on corner holding a violin and a bottle of wine, with a dalmatian by his side  
 Steps: 34, Sampler: DPM++ 2M Karras, CFG scale: 1.0, Seed: 1, Size: 800x510, Model hash: 6ce0161689, Model: v1-5-pruned-emaonly, Script: X/Y/Z plot, X Type: Seed, X Values: "1, 2, 5, 10, 100", Fixed X Values: "1, 2, 5, 10, 100", Y Type: CFG Scale, Y Values: "1.0, 3.0, 5.0, 10.0, 20.0", Version: v1.6.0

maintain image similarity keep abstract, maintain unevenly distributed texture, imbalance.

Interrogate CLIP Generate

Interrogate DeepBooru

objects, background, centered lighting, figures, people, evenness

13/75

Generation Textual Inversion Hypernetworks Checkpoints Lora

img2img Sketch Inpaint Inpaint sketch Inpaint upload Batch

maintain image similarity keep abstract, maintain unevenly distributed texture, imbalance,  
Negative prompt: objects, background, centered lighting, figures, people, evenness  
Steps: 20, Sampler: DDIM, CFG scale: 8, Seed: 231122, Size: 800x1200, Model hash: 744042b5d, Model: sd\_v1\_refiner\_1.0, Denoising strength: 0.75, Version: v1.6.0  
Time taken: 2.6 sec. 6.9.75 GB, 11.30 GB, 13.8234504 GB (16.3%)

maintain image similarity keep abstract, maintain unevenly distributed texture, imbalance, maintain uneven coloration

Interrogate CLIP Generate

Interrogate DeepBooru

objects, background, centered lighting, figures, people, evenness, representation, trees, nature, literal, stupid, face, figure, hair, background, lighting

33/75

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Time taken: 2.8 sec. 6.9.75 GB, 11.30 GB, 13.8234504 GB (16.3%)

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23/75

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Time taken: 2.6 sec. 6.9.75 GB, 11.35 GB, 13.8234504 GB (16.3%)

Stable Diffusion img-to-img Results: Current challenges is how to have greater control of results

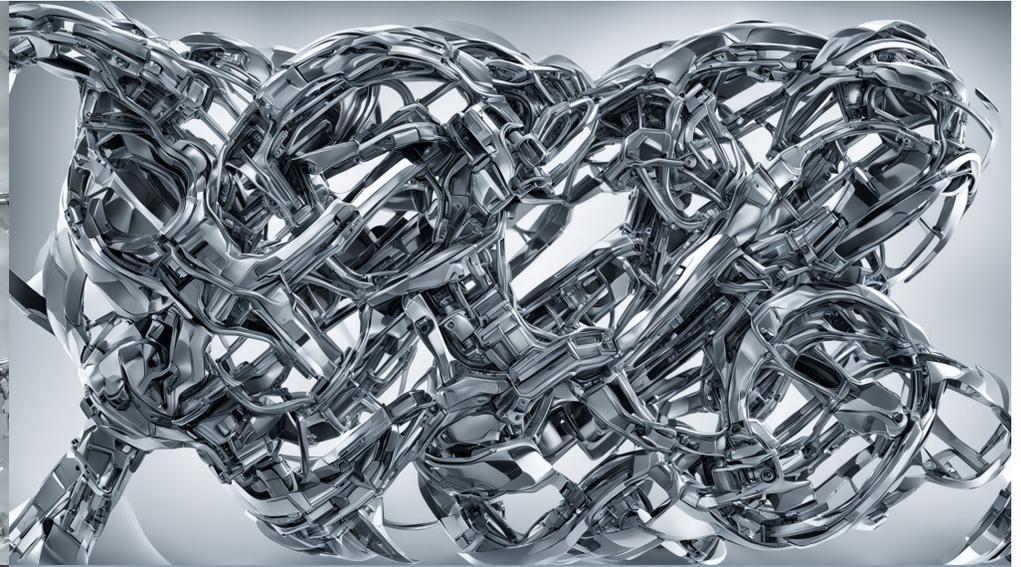


Image Composition Studies



Image Composition Studies

Stable Diffusion checkpoint: v1.5-pruned-emaonly/safetensors [6c0161689] | SD VAE: Automatic

txt2img | **img2img** | Extras | PNG Info | Checkpoint Merger | Train | Promptgen | Settings | Extensions

an irregular, complex, robotic machine placed in an enclosed lab space viewed sideways 0/75

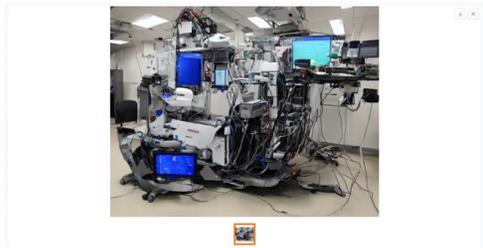
Interrogate CLIP Generate

symmetry, forward perspective 4/75

Interrogate DeepBooru

Generation | Textual Inversion | Hypernetworks | Checkpoints | Lora

img2img | Sketch | Inpaint | Inpaint sketch | Inpaint upload | Batch



an irregular, complex, robotic machine placed in an enclosed lab space viewed sideways

Negative prompt: symmetry, forward perspective,  
 Steps: 20, Sampler: DPM++ 2M Karras, CFG scale: 7, Seed: 3282235626, Size: 1024x1000, Model hash: 6c0161689, Model: v1.5-pruned-emaonly,  
 Denoising strength: 0.75, Version: v1.6.0

Time taken: 1.1 sec. | A: 5.26 GB, P: 8.43 GB, S(p): 9.223.6504 GB (38.9%)

Stable Diffusion checkpoint: v1.5-pruned-emaonly/safetensors [6c0161689] | SD VAE: Automatic

txt2img | **img2img** | Extras | PNG Info | Checkpoint Merger | Train | Promptgen | Settings | Extensions

an irregular, complex, cluttered,robotic machine made of translucent light placed in an enclosed lab space viewed sideways 22/75

Interrogate CLIP Generate

symmetry, forward perspective, cabinets 6/75

Interrogate DeepBooru

Generation | Textual Inversion | Hypernetworks | Checkpoints | Lora

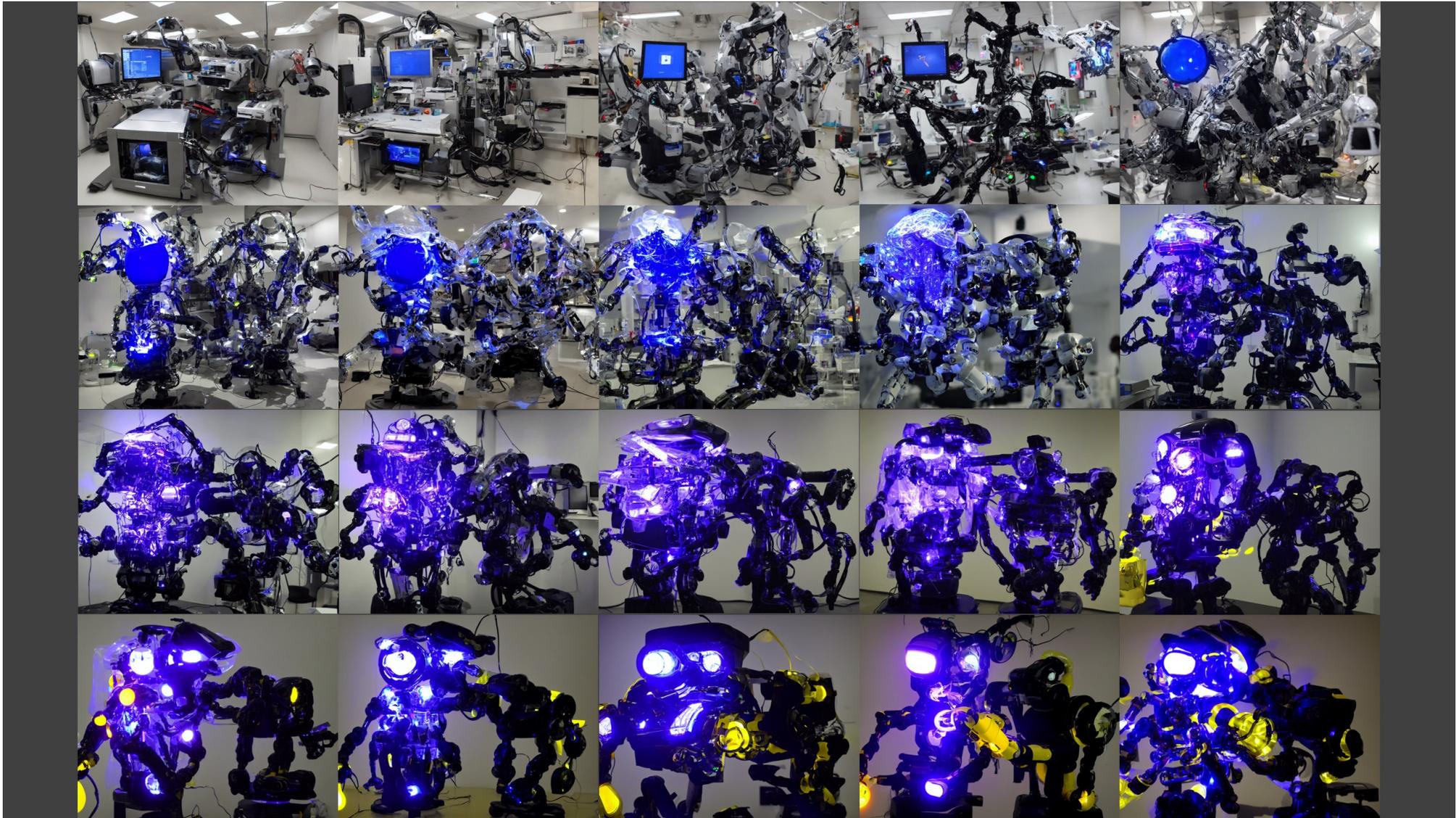
img2img | Sketch | Inpaint | Inpaint sketch | Inpaint upload | Batch



an irregular, complex, cluttered,robotic machine made of translucent light placed in an enclosed lab space viewed sideways

Negative prompt: symmetry, forward perspective, cabinets  
 Steps: 20, Sampler: DPM++ 2M Karras, CFG scale: 7, Seed: 811710814, Size: 1024x1000, Model hash: 6c0161689, Model: v1.5-pruned-emaonly,  
 Denoising strength: 0.75, Version: v1.6.0

Time taken: 1.8 sec. | A: 5.26 GB, P: 8.43 GB, S(p): 9.223.6504 GB (38.9%)



**Generative AI can be defined as an AI system that uses existing media to create new, plausible media.**

**Process of Generative AI Image Synthesis:**

Test prompt -> image generation  
image & text prompt -> image generation

This is a transition from current computational practices which are rule-based either through **software creation** or the use of **existing software**

