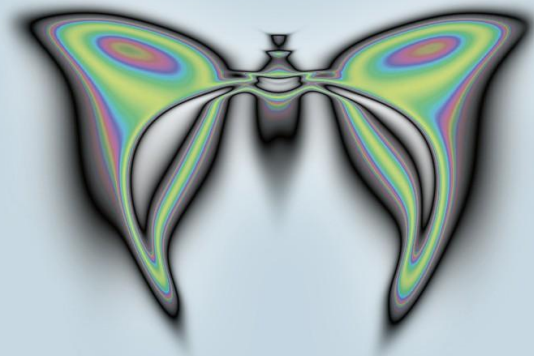


Kenneth O. Stanley · Joel Lehman
**Why Greatness
Cannot Be Planned**
The Myth of the Objective



 Springer

Why Greatness cannot be Planned

Kenneth Stanley & Joel
Lehman

Tessellate Book Club
Judy King Yi CHO
1/10/24

Main Question: How Do Breakthrough Innovations Occur?

1. PicBreeder Experiment
2. The Strategy: No objectives (Open-endedness), Novelty Search, Stepping stone collector
3. Applications of this strategy
 - a. In Research Process
 - b. In Synthetic Biology
 - c. In Life, Social, Entrepreneurship...

The Authors

Previously :CEO, Maven
Open-Endedness Team Leader at OpenAI
Head of Core AI Research at Uber AI
Professor in Computer Science at
University of Central Florida

Inventor (with many distinguished colleagues) of
NeuroEvolution of Augmenting Topologies
(NEAT), compositional pattern producing
networks (CPPNs), novelty search (NS)....



<https://www.kenstanley.net/home>

Kenneth O. Stanley



<http://joellehman.com/>

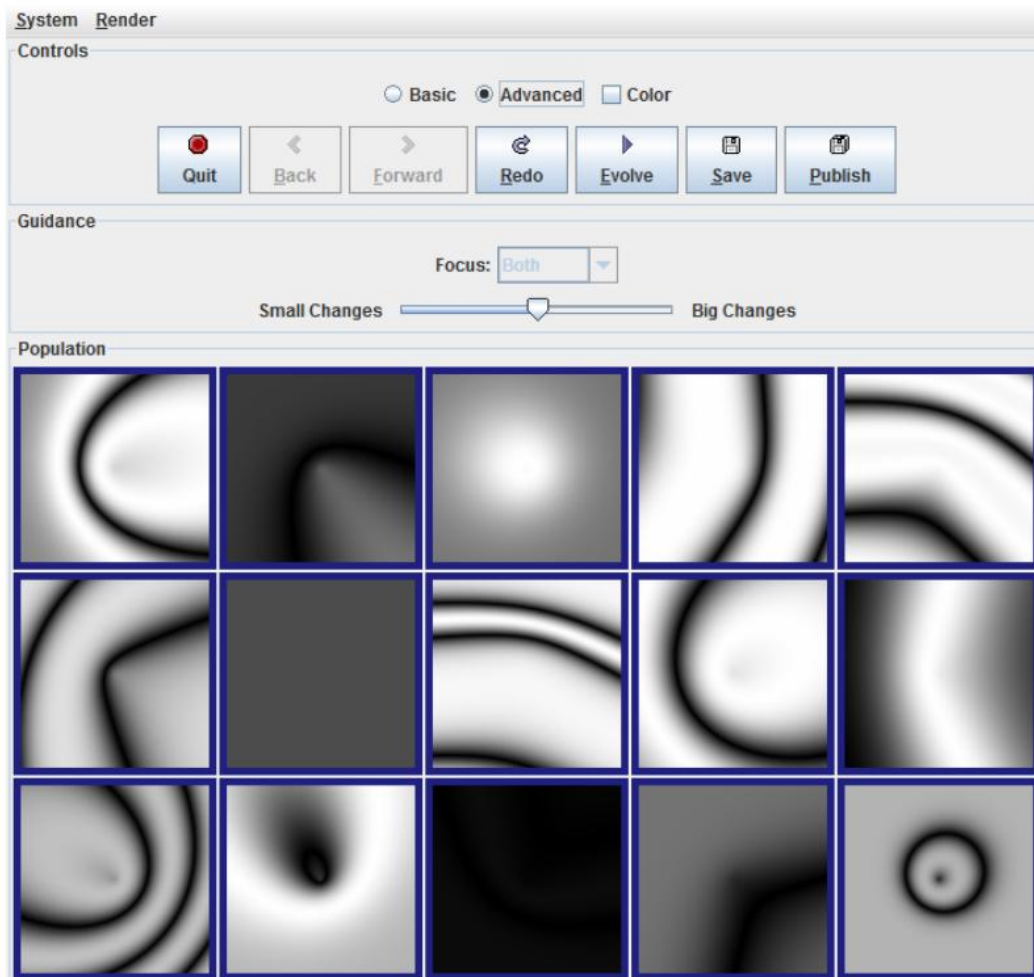
Joel Lehman

The paper (2008) The Book (2015)

Picbreeder: Evolving Pictures Collaboratively Online

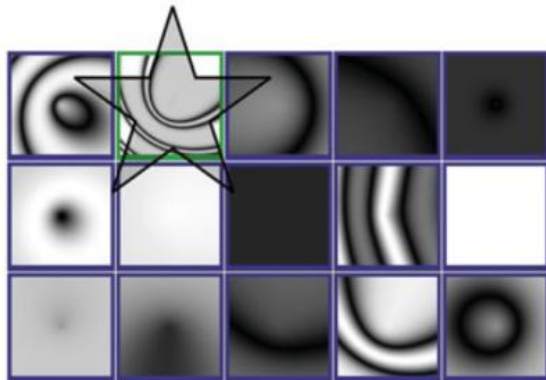
**Jimmy Secretan, Nicholas Beato, David B. D'Ambrosio, Adelein Rodriguez,
Adam Campbell, and Kenneth O. Stanley**
School of Electrical Engineering and Computer Science
University of Central Florida, Orlando, FL 32816-2362

The PicBreeder Experiment: How it works?

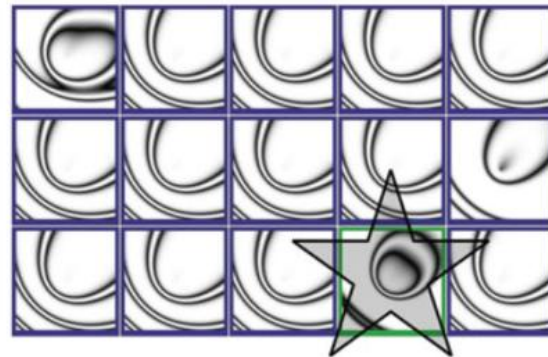


- Crowd-sourced picture-breeding website
- 7 years of operation (started since 2007)
- Almost 10,000 evolved images (lineages)
- Over 1,000 users
- NEAT Algorithm (NeuroEvolution of Augmenting Topologies)
- Pattern produced by CPPNs (Compositional Pattern Producing Network)

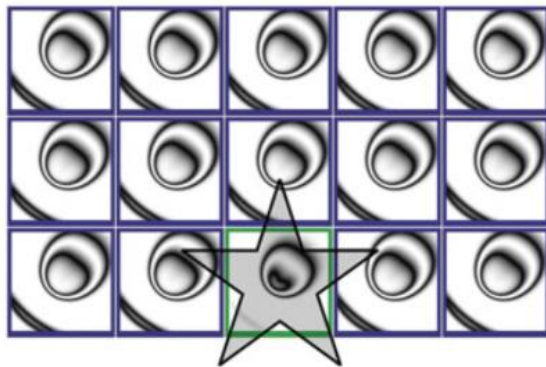
The PicBreeder: How it works?



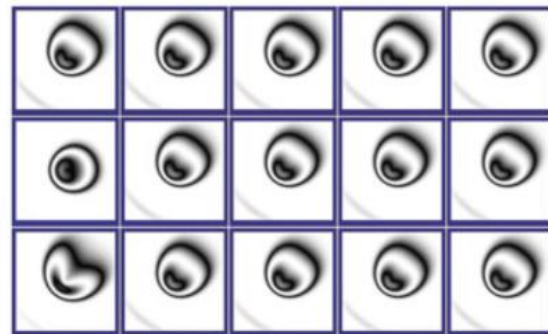
Initial Population



After First Selection

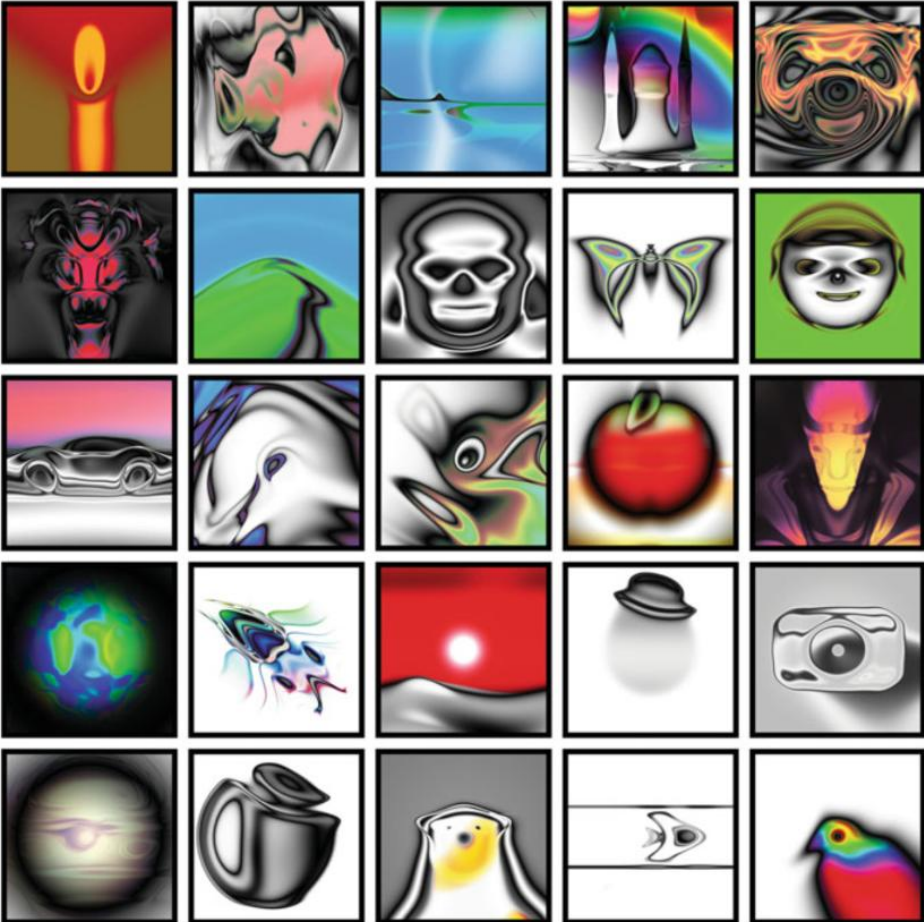


After Second Selection



After Third Selection

Discoveries by Picbreeder users (100% evolved)



Important: Branching from existing discoveries

Branch
Evolve new variations on other users' images. Try clicking these!



Evolve Evolve

Start from Scratch
Create a whole new kind of image.



family Tree
See family relationships of any image. Try clicking these!




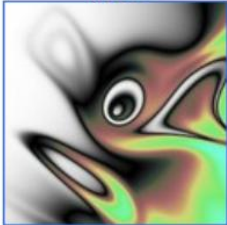
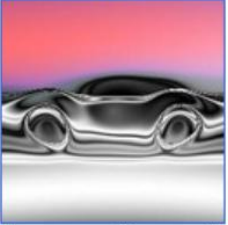




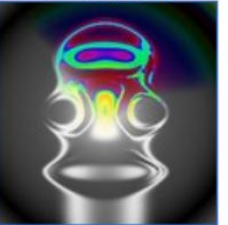
Family Tree Family Tree

Custom Merchandise
Create custom products from any picture on the site. Try these:

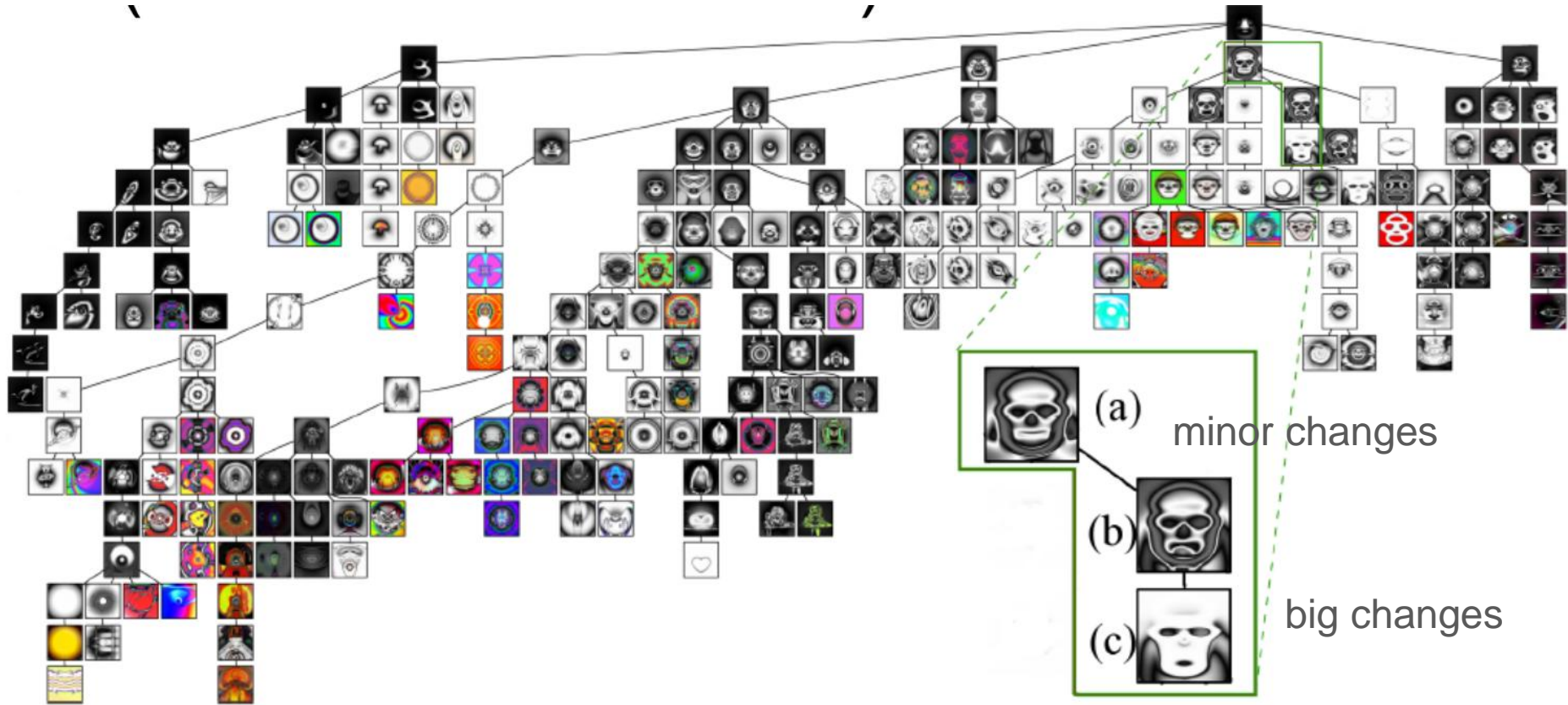


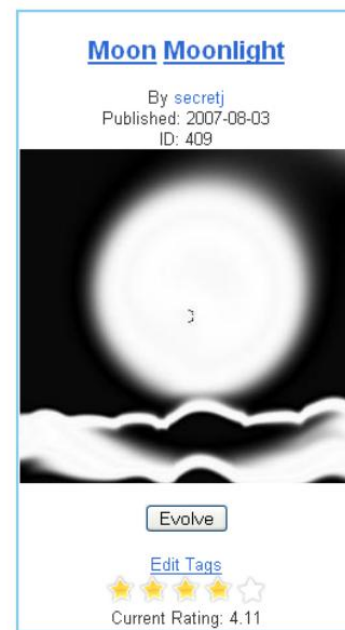
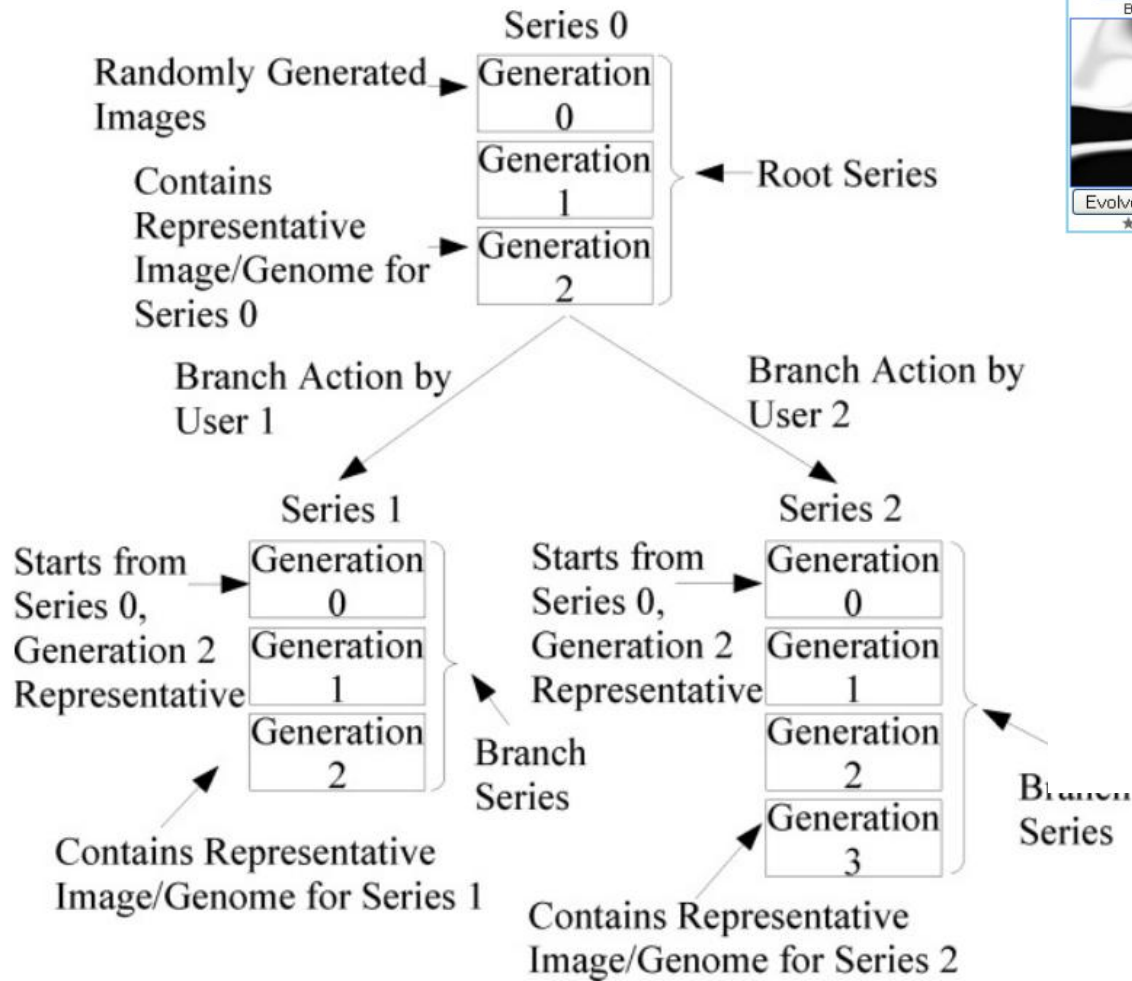
Custom Products Custom Products

Editor's Picks

<p><u>Mystic baboon</u> By burndirt</p>  <p>Evolve DNA</p> <p>★★★★★ <u>Animal happy</u> By ken</p>  <p>Evolve DNA</p> <p>★★★★★</p>	<p><u>sunset drive</u> By ken</p>  <p>Evolve DNA</p> <p>★★★★★ <u>butterfly</u> By adeleirn</p>  <p>Evolve DNA</p> <p>★★★★★</p>	<p><u>devil</u> By burndirt</p>  <p>Evolve DNA</p> <p>★★★★★ <u>round face</u> By robert</p>  <p>Evolve DNA</p> <p>★★★★★</p>	<p><u>dolphin</u> By burndirt</p>  <p>Evolve DNA</p> <p>★★★★★ <u>homer simpson</u> By Anonymous</p>  <p>Evolve DNA</p> <p>★★★★★</p>
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Phylogenetic Tree of discoveries (from 30 users)

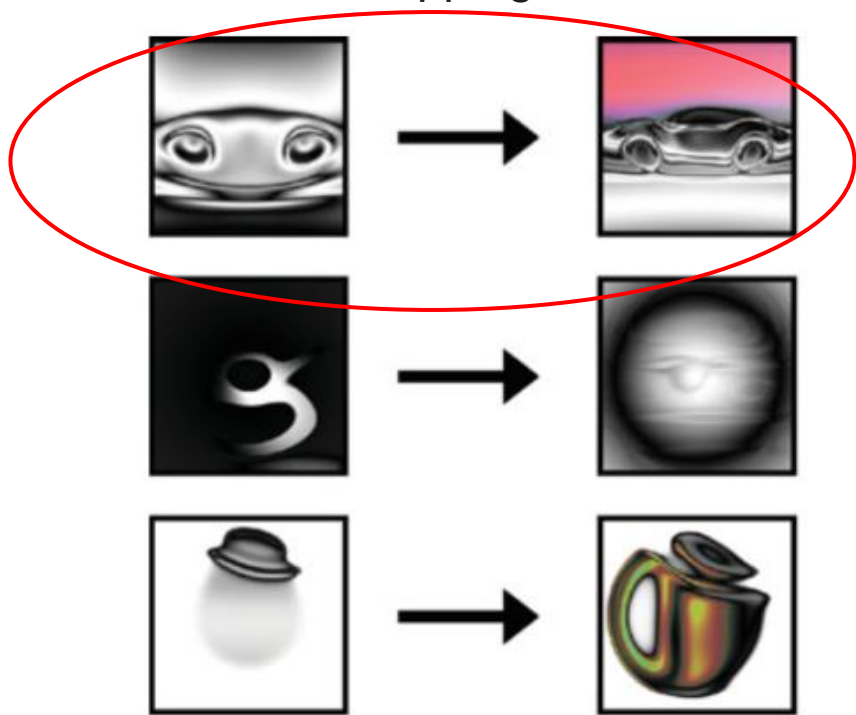




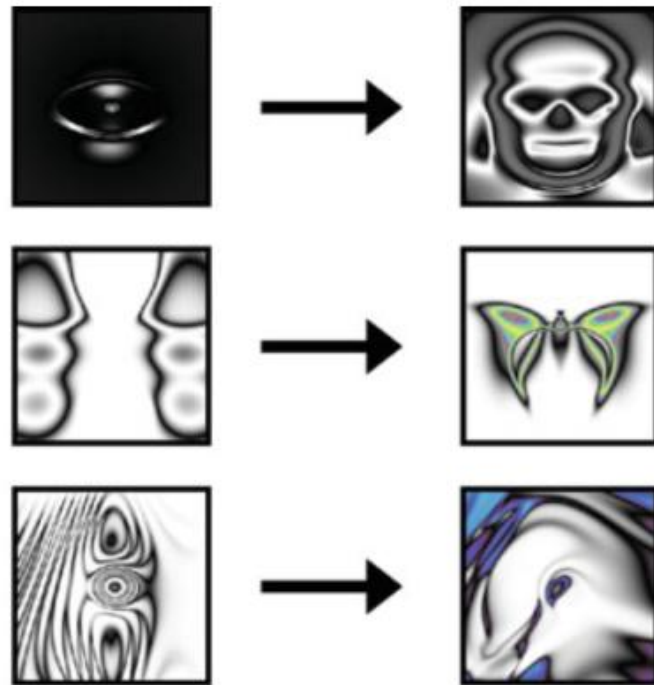
Stepping Stone to new discoveries

Insight 1: Stepping stone almost never resemble the final product!

alien face is a stepping stone to Car



Insight 2: Stepping stone looks interesting



“You can only find things by not looking for them”

How about trying to re-breed these from scratch?

Re-Breed with the same algorithm, but only pick the one that's closely resemble to the target images (Objective-based search)



gen 12



gen 20



gen 36



gen 49



gen 74

74 generations from user branching



90 generations

Results from objective-based re-breeding

non-objective

ALL Failed?!






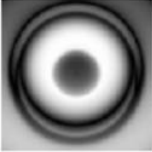
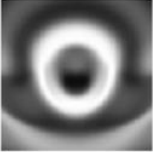
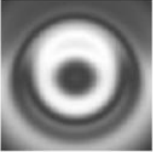

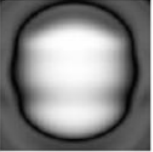
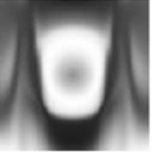
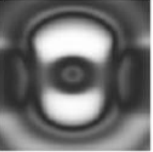
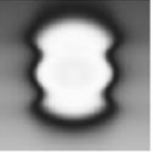






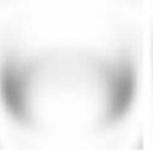

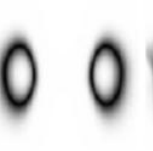


gen 74



gen 90

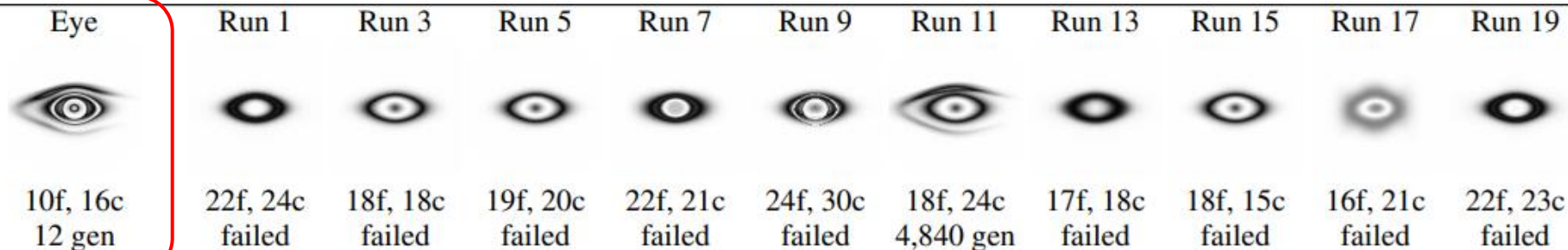
Each results are 30,000 generations

(f = functions in network, c = connections)

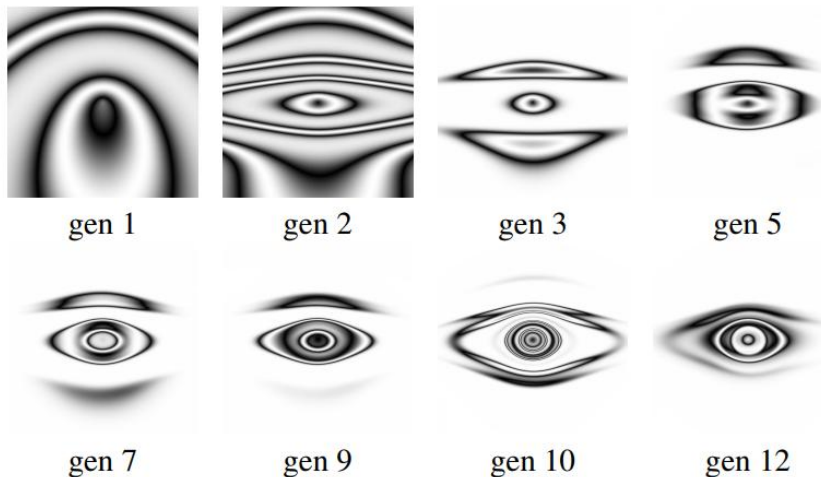
	Run 1	Run 3	Run 5	Run 7	Run 9	Run 11	Run 13	Run 15	Run 17	Run 19
Skull 										
	20f, 24c failed	20f, 29c failed	19f, 24c failed	22f, 28c failed	21f, 28c failed	16f, 22c failed	21f, 27c failed	23f, 29c failed	18f, 25c failed	25f, 28c failed
Butterfly 										
	22f, 27c failed	21f, 27c failed	22f, 25c failed	20f, 28c failed	18f, 23c failed	21f, 27c failed	27f, 34c failed	22f, 25c failed	24f, 29c failed	20f, 28c failed

Target

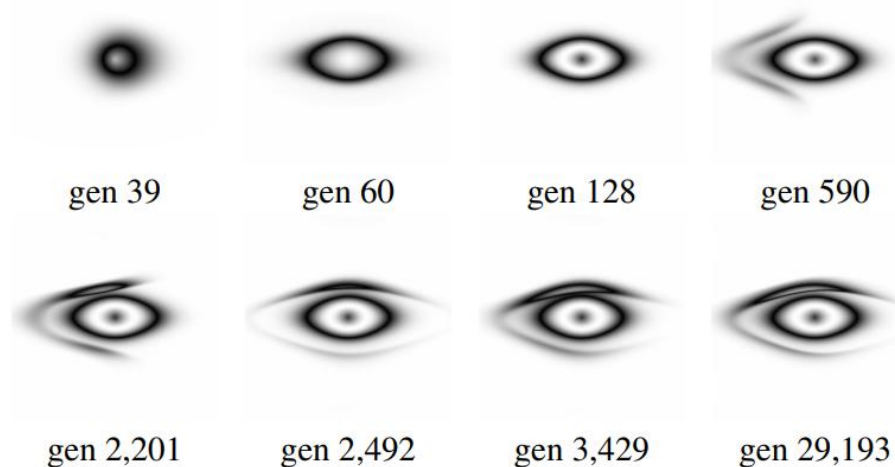
Insight 3: rethink objectives....



Stepping stones of non-objective image evolution



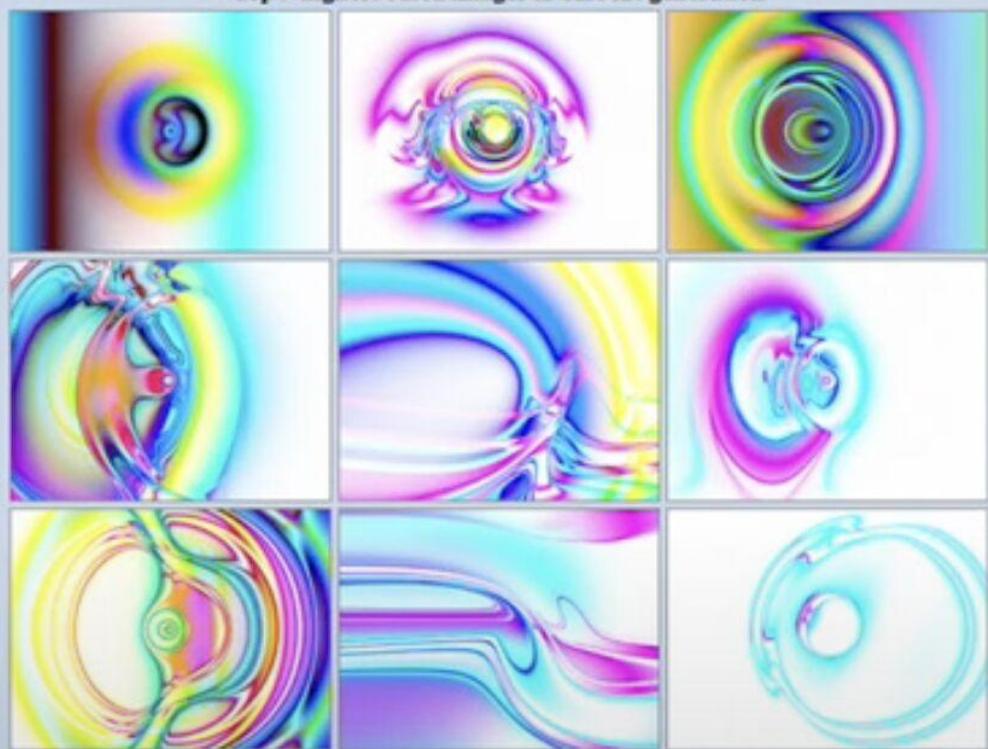
Evolving to an objective.



Convergent vs Divergent

Scientific funding decisions are made this way?

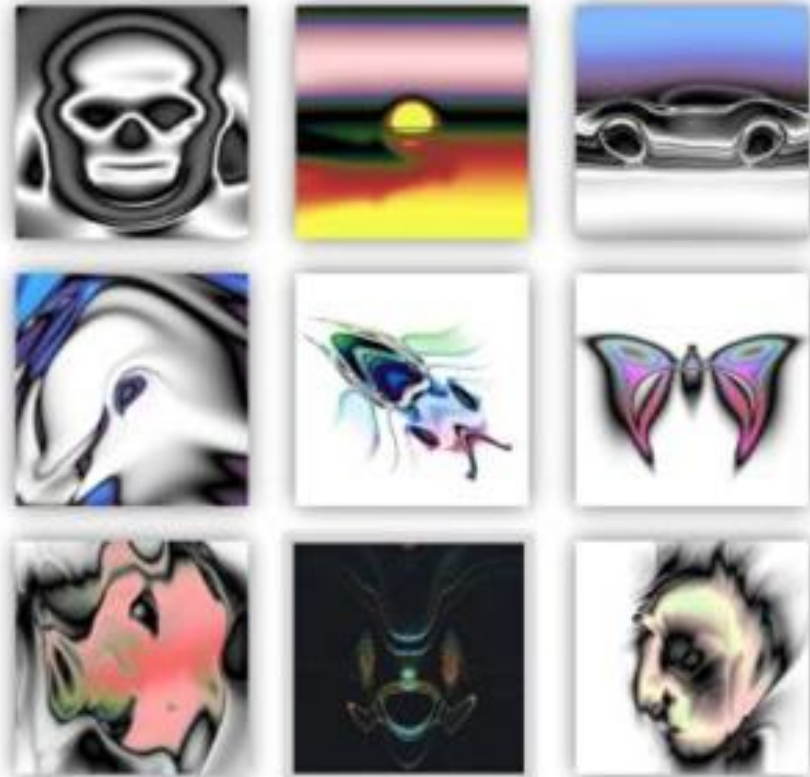
Living Image Project: Based on voting (top 9 images)



(c)White Shadow, 2006-2007. W-Shadow.com

Insight 4: rethink convergent consensus....

PicBreeder: Based on Branching



3 main strategies from this Book

1. **No Objectives (Open-endedness)**: ‘The greatest achievements are less likely when they have objectives, so the optimal path for these great achievements is to have no objective at all as relevant stepping stones aren’t obvious and would be missed if too focused on the objective – the stepping stone doesn’t resemble the final product.’
1. **Novelty search for novel & interesting**: ‘Novelty can often act as a stepping stone detector because anything novel is a potential stepping stone to something even more novel. In other words, novelty is a rough shortcut for identifying interestingness: interesting ideas are those that open up new possibilities.’ (a **simple-to-complex information accumulat**)
1. **Be a Stepping Stone collector**: ‘Instead of judging every activity for its potential to succeed, we should judge our projects for their potential to spawn more projects. As treasure hunters, our interest is in collecting more stepping stones, not in reaching a particular destination. The more stepping stones we find, the more opportunities there are to depart to somewhere greater.’

Be a Stepping Stone collector

1. **No final objectives:** based on novelty search or interestingness
2. **Collect stepping stones:** doesn't necessarily give best solutions to a specific problem
3. **GOOD Stepping stone:** a stepping stone that can lead to more stepping stones
4. **BAD Stepping stone:** leads nowhere beyond itself, no matter how nice it may feel to stand upon it for the moment

“As treasure hunters, our interest is in collecting more stepping stones, not in reaching a particular destination. The more stepping stones we find, the more opportunities there are to depart to somewhere greater.”

Strategies from 'why greatness can't be planned' align with lots of previous ideas

- =Emergent Properties in Complex Systems
- Zen Philosophy (Wu Wei): the best results come when you allow things to happen naturally, without forcing them.
- Serendipity in Scientific Discovery
- Evolutionary Theory (Biological Evolution)
- Theories on The Unconscious Mind and intuitions, Eureka!

.....

Apply in
Research process

Apply in
Synthetic Biology

Apply in
Life, social, entr

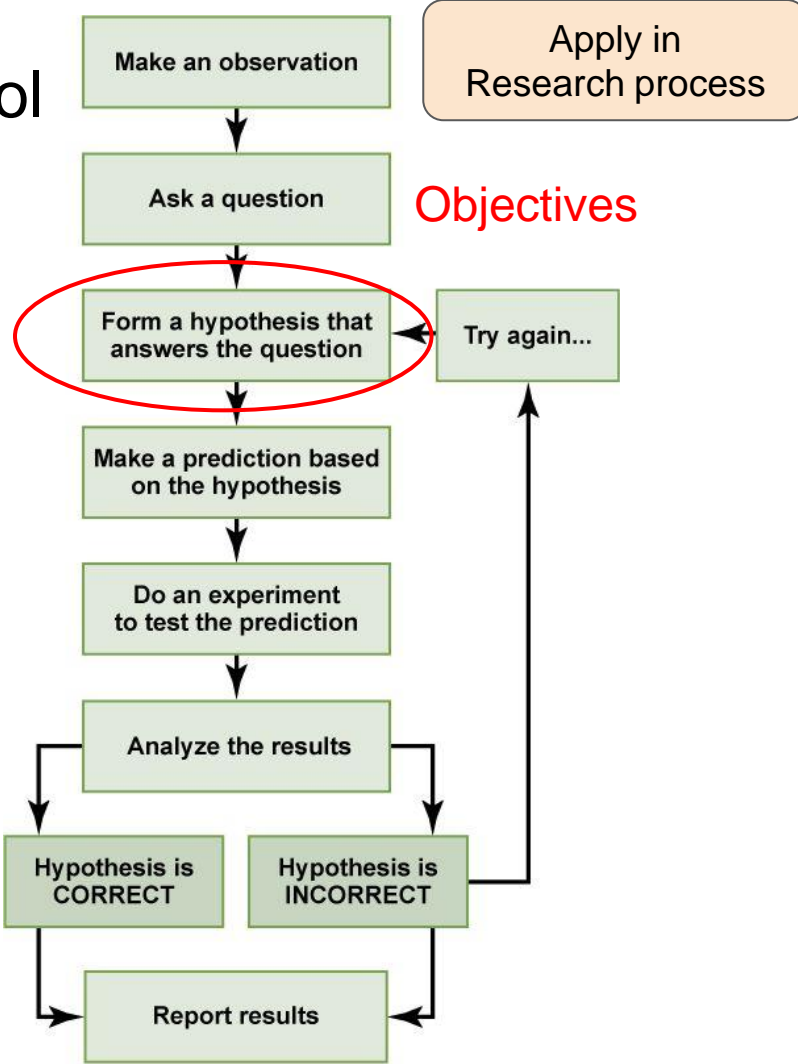
Scientific method that's taught in school



'Finding the right direction'

Do the greatest scientific breakthroughs come from known objectives and top-down execution by following this method?

Are there any other methods?



Examples of unplanned Greatness

Science

- Alexander Fleming: Penicillin
- Richard Feynman: Spinning Plates & Feynman diagrams
- CRISPR-Cas
- Percy Spencer: chocolate bar & microwave
- Vacuum Tube & computation

Entrepenurship

- Slack: Gaming company to communication platform
- Instagram: location-based check-in app to photo-sharing
- Post-it Notes: failed strong adhesive
- YouTube: dating website

In Research Proposal:
What is your objective? What is your hypothesis?

Scientific process:

Planning to get from $A \rightarrow B$,

encounter a cloud (wasting time, feeling miserable),

drift to C instead



“If A is the question, and B is the answer, then research is a direct path.

The problem is that if an experiment doesn't work, or a student gets depressed, it's perceived as something utterly wrong and causes tremendous stress.”

<https://youtu.be/F1U26PLiXjM?si=Dd3TCa0dJFB3ST3X>

Forgive yourself for wasting time

“My third piece of advice is probably the hardest to take. It is to **forgive yourself for wasting time**.As you will never be sure which are the right problems to work on, most of the time that you spend in the laboratory or at your desk will be wasted. If you want to be creative, then you will have to get used to spending most of your time not being creative, to being becalmed on the ocean of scientific knowledge.”

Four golden lessons (Steven Weinberg, 2003)

We don't know what the stepping stones are!


Concepts | Published: 27 November 2003

Scientist

Four golden lessons

 Save

 Related Papers

 Chat with paper

[Steven Weinberg](#)

[Nature](#) 426, 389 (2003) | [Cite this article](#)

(YouTube) How discoveries were made?

<https://youtu.be/thtKsIF8zE4?si=MdbQuX1Fx--isXkC>

"standing on the shoulders of giants"



Applying this strategy in Research process?

Correspondence | Published: 27 March 2023

Make science disruptive again

[Itai Yanai](#)  & [Martin J. Lercher](#)

Nature Biotechnology **41**, 450–451 (2023) | [Cite this article](#)

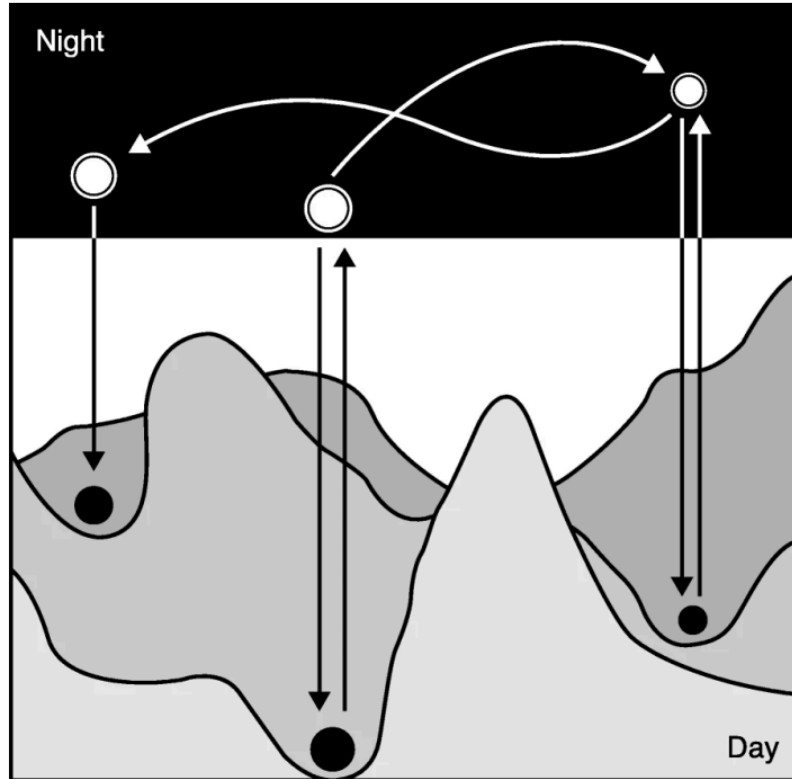
1. No Objectives (Open-endedness)
2. Novelty search for novel & interesting
3. Be a Stepping Stone collector

“...the culture of science has gradually transitioned toward a more executive and results-oriented approach. In this fast-paced mode, scientists and scientists-in-training — graduate students and postdoctoral fellows — have little time for more exploratory topics, which contributes to a less creative environment for transformative science.”

“...science becoming increasingly entrenched into siloed disciplines and by projects being progressively dominated by hypothesis-driven approaches, fueled by a spirit of strategic design that emphasizes predictability rather than unexpected results.”

Main Question: How Do Breakthrough Innovations Occur?

Balance between 'Day Science' vs 'Night Science'



Night science: creates the questions, makes connections to seemingly distant concepts and explores new directions.

Day science: the executive domain, in which we test specific hypotheses by implementing tools and designing experiments

[Night Science - Learning \(night-science.org\)](http://night-science.org)

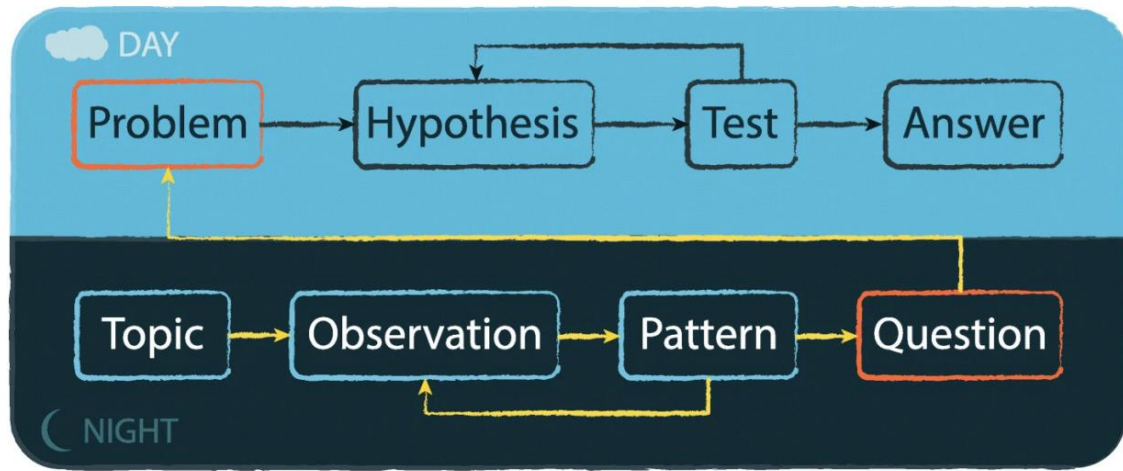
website: 8 chapters of how to apply night science

Table 2: Distinct questions in the two languages of science

<u>Night science questions</u>	<u>Day science questions</u>
Why would that happen?	What is the evidence for that assertion?
What does that protein want?	Is it necessary and sufficient?
Why would the cell do something that stupid?	What is the significance (P-value)?
How does the cell know what to do?	What is the mechanism?
Why did the cell not know that it has been invaded by the virus?	Is there a negative control and a positive control?
How do these cells know to stop dividing?	Is the proposed experiment sufficiently powered?

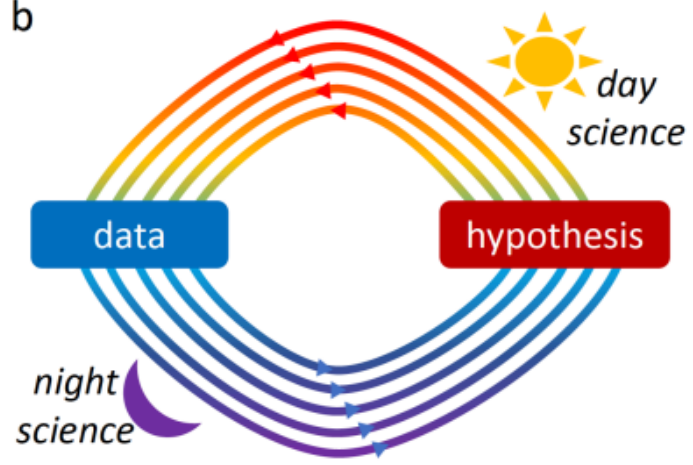
‘Hmm, this is interesting....’

‘what if I try....’



Novelty search for novel & interesting






b



Hypothesis-driven vs Data-driven

make science disruptive again:
 “learn how to refocus existing questions and to ask new ones: inventing the right question can advance science more than answering an existing one”

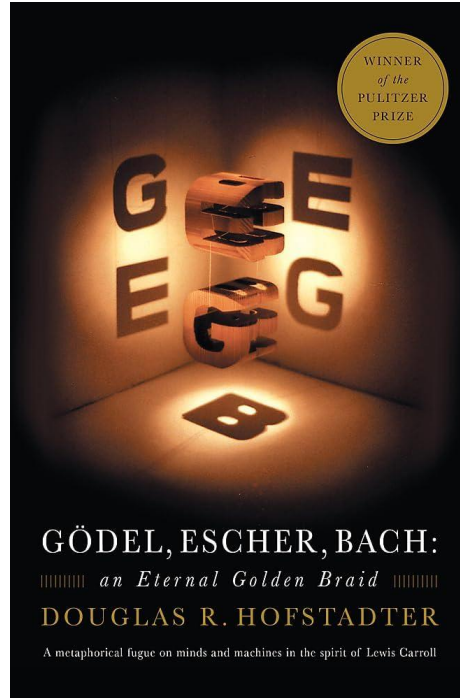
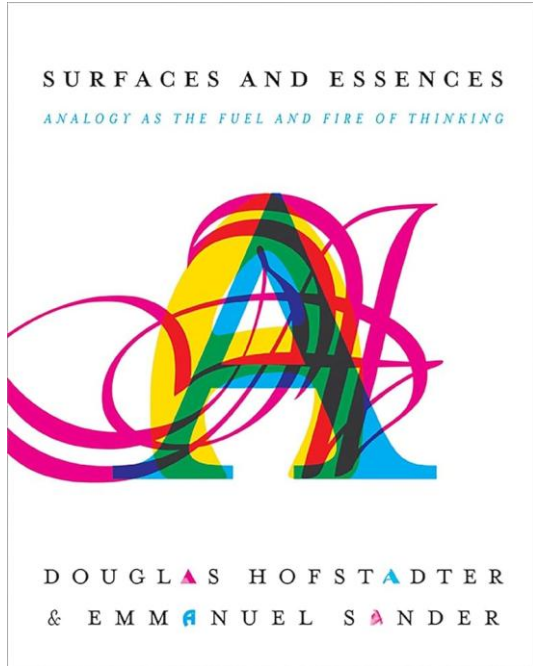
Example of 'Night Science': Improvisational theater in Science

<p>How can we create new ideas?</p> <p>Improvisational science</p> <p>Follow the 5 easy steps!</p>	<p>Step 1: Find someone you can talk to.</p>  <p>Express ideas out loud</p> <p>Creates a space for thinking broadly</p>	<p>Step 2: One-on-ones are the best.</p>  <p>t r s t vulnerable</p>
<p>Step 3: Think of it as an improvisation.</p>  <p>"Yes, and"</p> <p>"No, but..."</p> <p>No fixed plan or agenda</p>	<p>Step 4: Make them look good.</p>  <p>Overcoming the imposter syndrome</p>	<p>Step 5: Be the lone-genius.</p>  <p>After the improvisation, take action!</p> <p>Then, go back to Step 1:</p>



deep discussion, more freely

Analogy & Import/Export ideas to other fields



Exporting an idea to another field

Network thinking: applying network analysis methods to internet robustness [\[24\]](#) (see text).

Quantum computer: bringing quantum physics to computer science [\[29\]](#).

CRISPR/Cas: bringing evolution and immunology to genome editing [\[31,32\]](#).

Douglas R. Hofstadter

Commit 20% of time to understand the bigger problem

“I subscribe to Pasteur's ``Luck favors the prepared mind." I favor heavily what I did. Friday afternoons for years - great thoughts only - means that I **committed 10% of my time trying to understand the bigger problems in the field**, i.e. what was and what was not important. I found in the early days I had believed `this' and yet had spent all week marching in `that' direction. It was kind of foolish. If I really believe the action is over there, why do I march in this direction? I either had to change my goal or change what I did. So I changed something I did and I marched in the direction I thought was important. It's that easy.”

You and Your Research (Richard Hamming, 1986)

<https://youtu.be/a1zDuOPkMSw?si=bceB-OW6mrXdgQPt>

<https://blog.samaltman.com/you-and-your-research>

You and your research lecture



Brainstorm with Sticky notes

Can we do it in Journal Club/lab meetings?
when discussing papers, research
proposal/new projects....

1. Everyone participates, diverse background (Boss, employee...)
2. Collect many nodes (as sticky note)
3. refine multiple times (rearrange, add/remove notes)
4. Good ideas/solutions emerges



What is our Noble Vision?



Applying this strategy in Synthetic Biology?

Apply in
Synthetic Biology

SCIENCE ADVANCES | REVIEW

SYSTEMS BIOLOGY

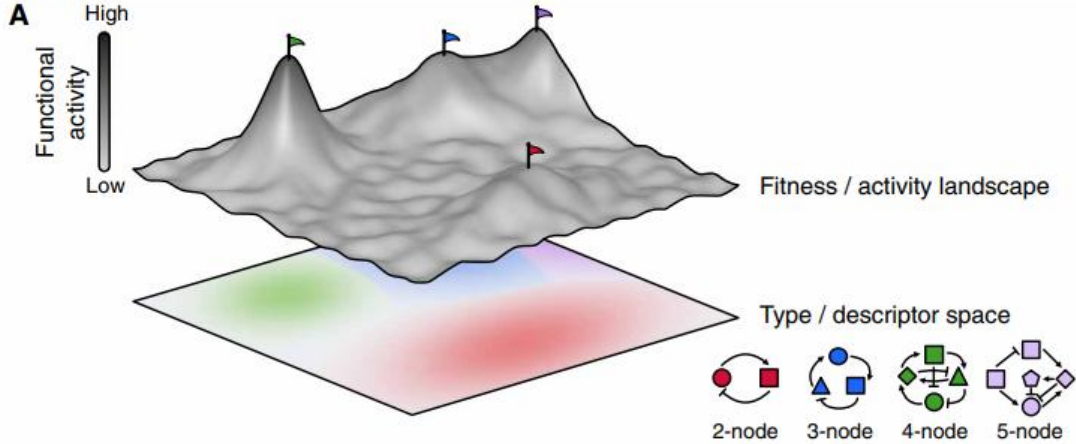
Open-endedness in synthetic biology: A route to continual innovation for biological design

Michiel Stock^{1*} and Thomas E. Goroehowski^{2,3}

Terms (Synthetic Biology)

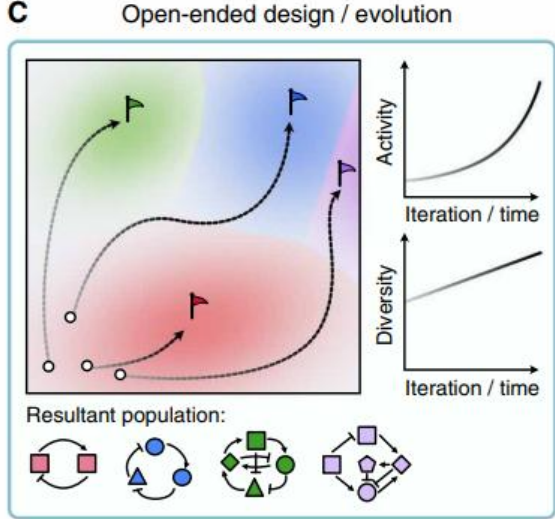
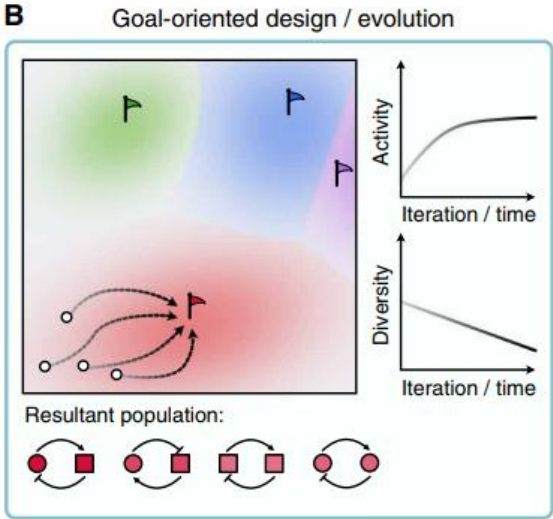
- **Open-ended process:** A process that continually generates novel entities or entities that can improve their functionality without bound. Open-ended processes are also sometimes characterized as having no clearly defined objective or goal
- **Open-endedness, or open-ended search,** relates to the capacity of a system to endlessly improve, produce novelty, or increase its complexity over time
- **Emergent behavior:** Behavior or properties that arise from the interactions of underlying components of the entities but which cannot be directly deduced or predicted from the characteristics of those components in isolation.
- **Creativity:** The process of creating novelty
- **Novelty:** The degree to which an entity is new or unusual, either due to novel compositions or by exhibiting new behaviors.
- **Variation:** Novelty that changes an entity by altering its internal arrangement of components.
- **Stepping stone problem:** The observation that to create an entity with a particular function, one often has to take intermediate steps that seem unrelated or counterproductive toward the end goal.
- **Optimization:** Branch of mathematics concerned with finding the best solutions to a given problem using an objective function, e.g., optimizing a metabolic pathway to maximize the yield of a desired small molecule.

Goal-oriented versus open-ended design



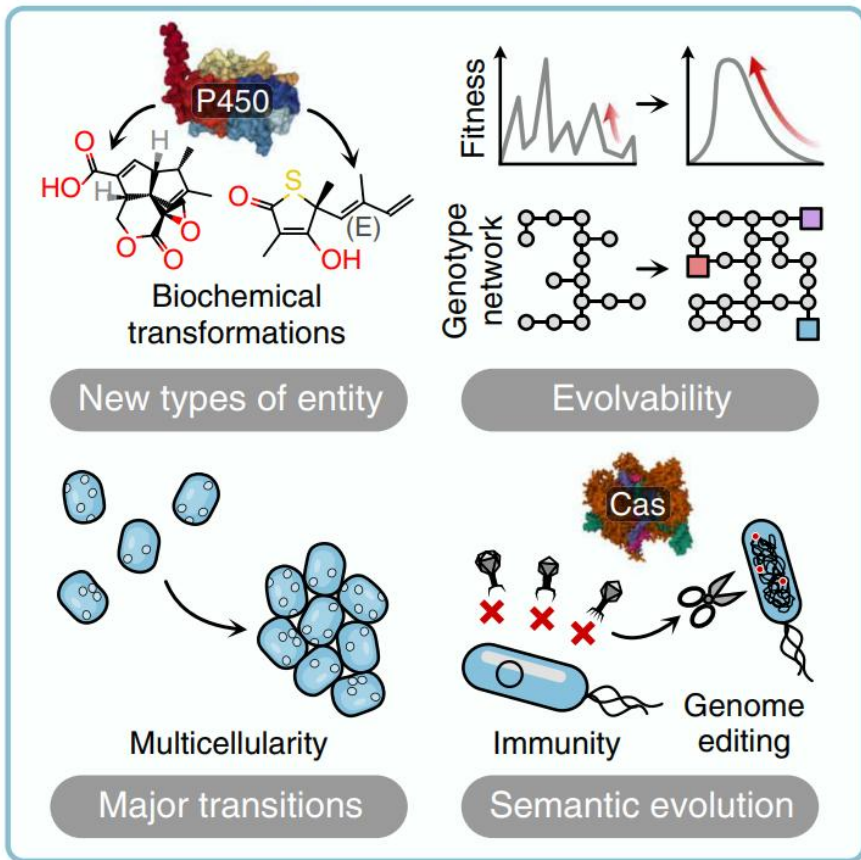
Entities: proteins, genetic constructs, and engineered cell

Functional activity: performance of this entities (eg. activity of proteins)

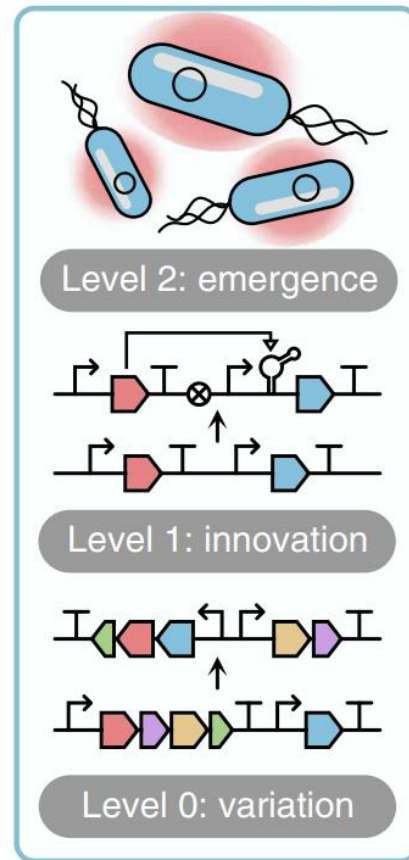


Types of Open-Endedness and Novelty in Syn Bio

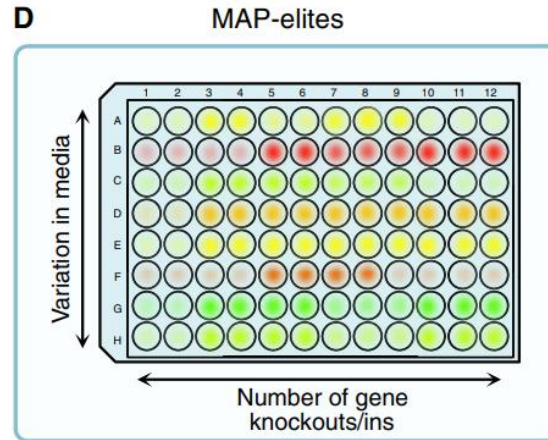
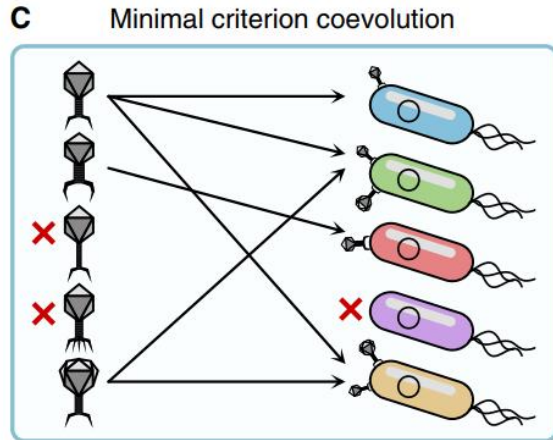
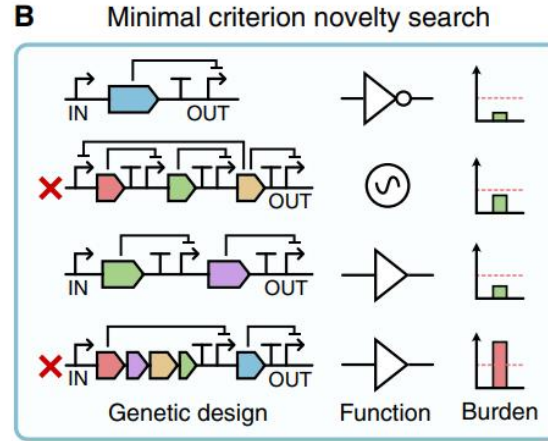
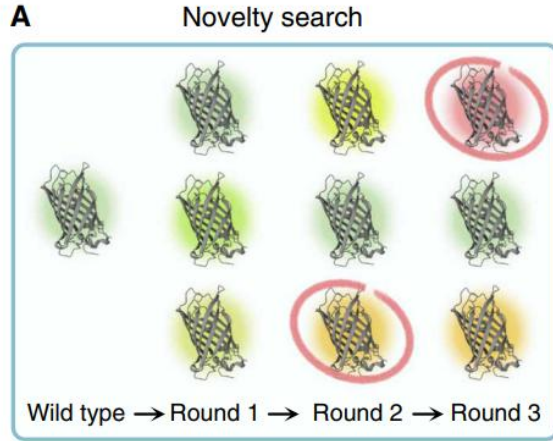
A Tokyo categories of open-endedness



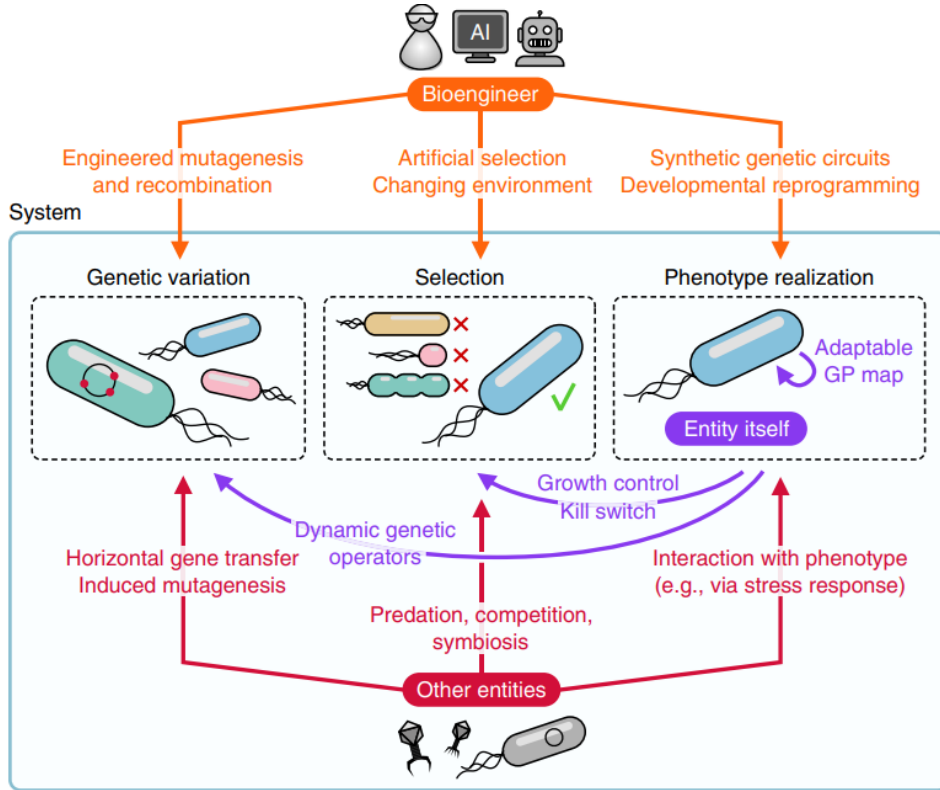
B Levels of novelty



Ways to create Open-Ended Design in the Lab for Syn Bio



Future: Open-ended Synthetic biology in automated lab



<https://ia.samaltman.com/>

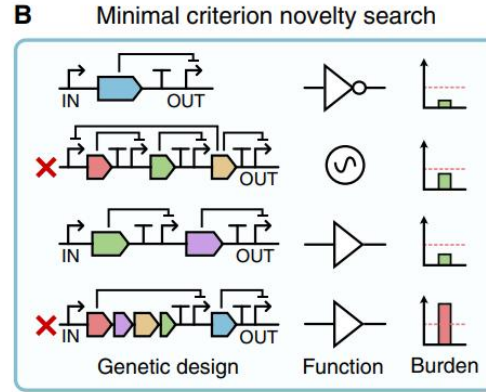
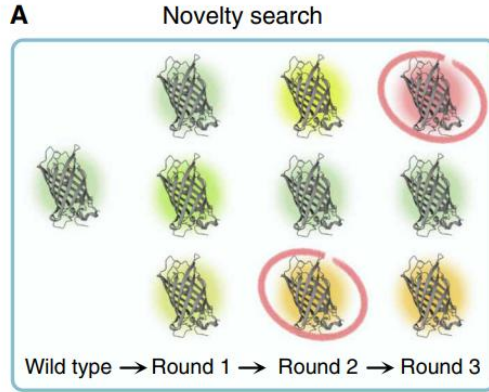
“It is possible that we will have superintelligence in a few thousand days (!)”

What will the future of academia be with ASI & automated lab?

Ways to Apply Open-Ended Design in the Lab for research process

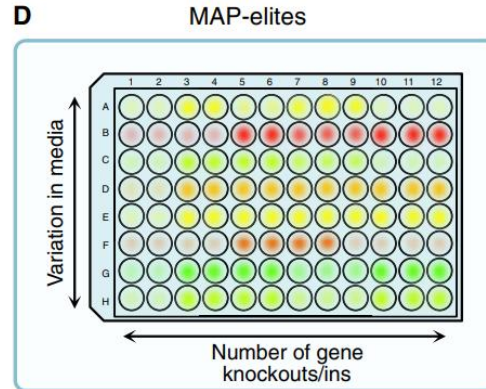
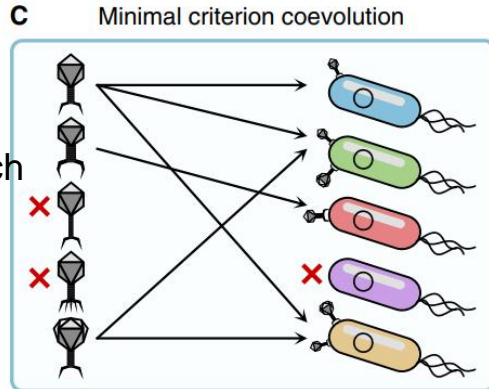
*Analogy

explore ideas based on novelty and uniqueness



not discarding projects that show only minimal success

Encourage collaborative research across disciplines



what if the future research actually work like this?
(with lower cost of execution thanks to robots/AI...)

Applying this strategy in Life?

Apply in
Life, social, entr

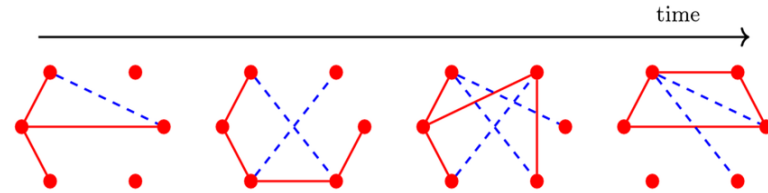
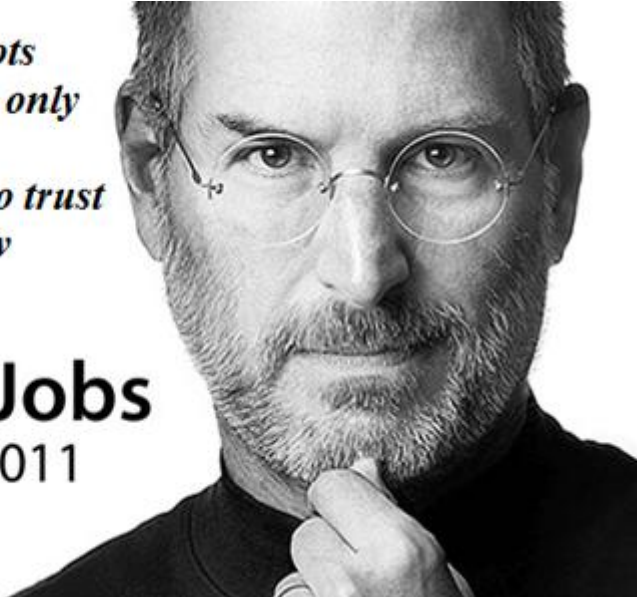
Be a Stepping Stone collector

= Collecting the dots/nodes in the system? (eg. new people, ideas, hobbies...)

Achieve greatness in life?

"You can't connect the dots looking forward; you can only connect them looking backwards. So you have to trust that the dots will somehow connect in your future."

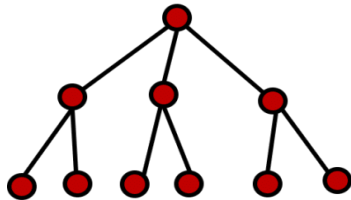
Steve Jobs
1955-2011



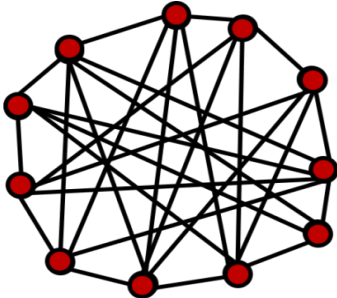
Increasing dots/node =
Increasing number of possible
patterns for connecting the dots

Balance these mindsets

'Top down' vs 'Bottom up'

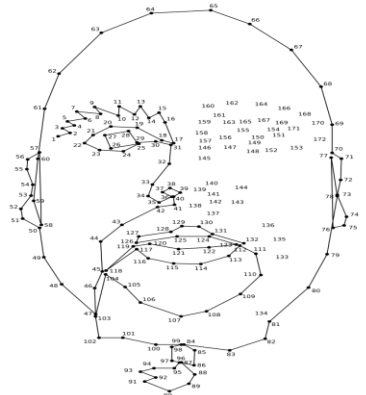


"Top-down"



"Bottom-up"

'Finding the right direction' vs 'Connecting the dots'



Applying this strategy in Social?

New Social Media with Serendipity
(Made by Dr. Kenneth Stanley)

<https://app.heimaven.com/discover/25380>

'Why Greatness cannot be planned' book discussion on Maven (with Dr. Stanley's interaction)

<https://app.heimaven.com/discover/24925>

applying novelty search in entrepreneurship

<https://app.heimaven.com/discover/27325>

applying novelty search in synthetic biology



Ken Stanley

Thanks Marvin, glad you found it helpful. It would be interesting to try to record your stepping stones. Usually if I have an interesting thought I'll write it down at least somewhere even if I don't have an official stepping stone list. I don't want to forget interesting stepping stones when I notice them.

writing

organization

productivity

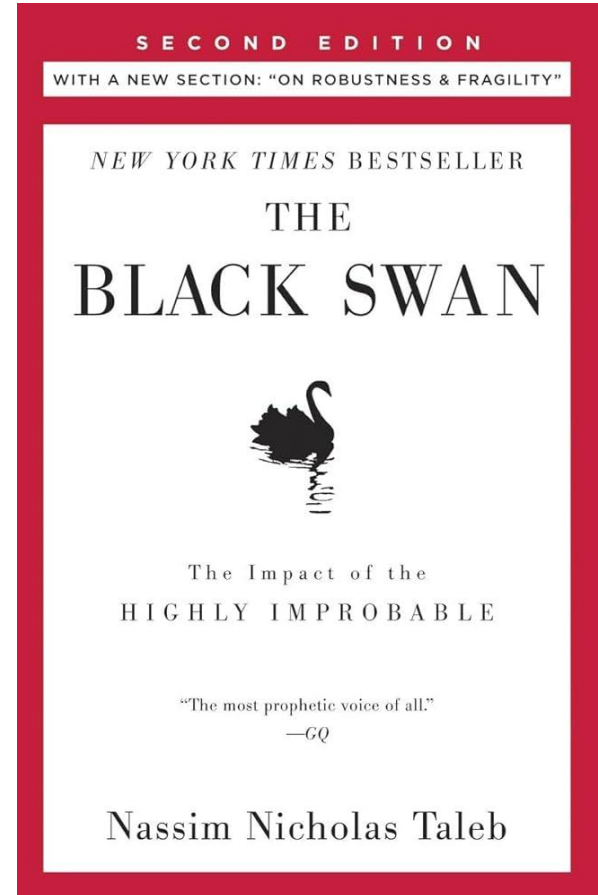
No likes, no follows

Finally, a social network designed to cater to your interests instead of likes and mega influencers.

Side note: The opposite of greatness is negative black swan

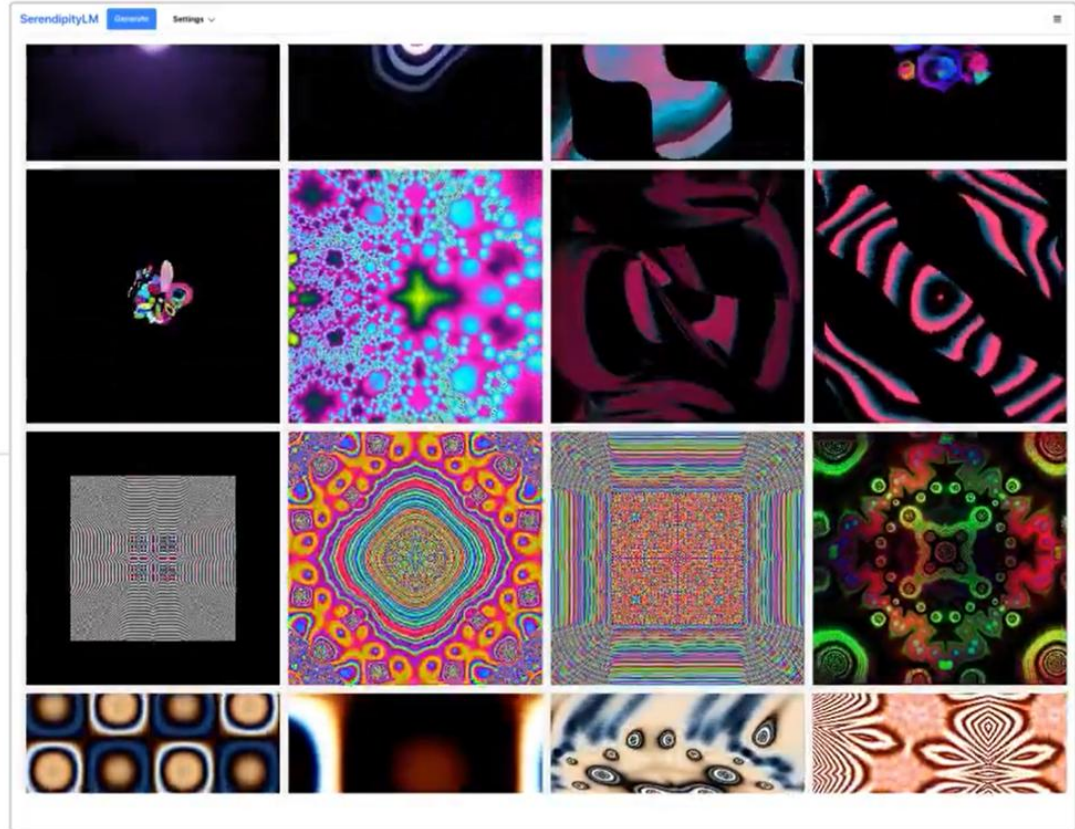
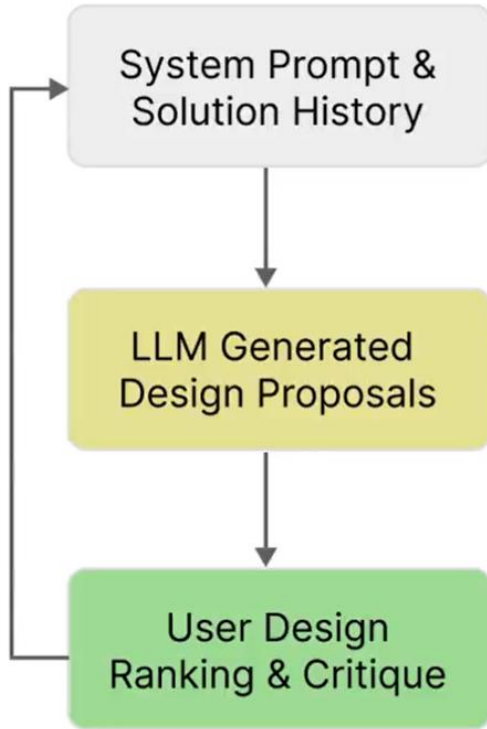
we also cannot know the stepping stone to dramatic events

“Consider a turkey that is fed every day. Every single feeding will firm up the bird’s belief that it is the general rule of life to be fed every day by friendly members of the human race “looking out for its best interests,” as a politician would say. On the afternoon of the Wednesday before Thanksgiving, something unexpected will happen to the turkey. It will incur a revision of belief.”
— **Nassim Nicholas Taleb, *The Black Swan***



Side note: 2024 version of PicBreeder: SerendipityLM

SerendipityLM



Startup incubator for students

Applying this strategy in entrepreneurship!

<https://de.linkedin.com/company/launchrheinmain>





AUFBAU DES ANGEBOTS



Koordination

Marketing/ Öffentlichkeitsarbeit

Mentoring/ Experten

- Mentoring für Gründer:innen durch fachliche Nähe und Expertise
- bei speziellen Fragen weitere Expert:innen



Externe Dienstleister

- Ergänzung zum Mentoring, z.B. Recht, Marketing (Rahmenverträge)



Infrastruktur

- Labor- und Büroflächen
- Zugang zu core facilities
- Vernetzung zu Kapitalgebern
- Peer Groups
- Community
- Netzwerkaufbau



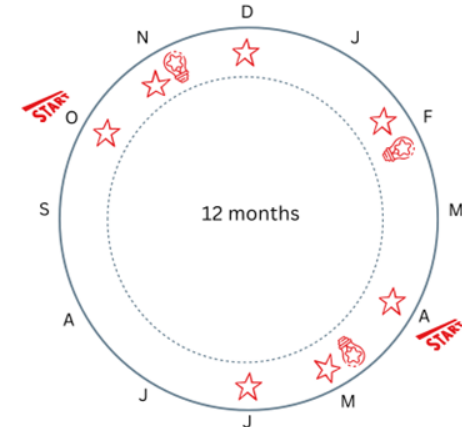
Trainings

- Über gesamte Gründungskette
- Workshops/ Trainings Life Science
- Einzelberatung
- Coaching



Kadans Science Partner
Landesplattform
BioVation RLP

Dr. Diane Murera
Tel.: +49 6131 9064-116
Mail: d.murera@lzmz.de
Web: <http://www.lzmz.de>



- Networking/ Match Making/ Pitch-Events
- Entry of Inkubator for 12 months
- Trainings (1 Week)
- Mentoring programm

The End

1. **No Objectives (Open-endedness):** ‘The greatest achievements are less likely when they have objectives, so the optimal path for these great achievements is to have no objective at all as relevant stepping stones aren’t obvious and would be missed if too focused on the objective – the stepping stone doesn’t resemble the final product.’
1. **Novelty search for novel & interesting:** ‘Novelty can often act as a stepping stone detector because anything novel is a potential stepping stone to something even more novel. In other words, novelty is a rough shortcut for identifying interestingness: interesting ideas are those that open up new possibilities.’
1. **Be a Stepping Stone collector:** ‘Instead of judging every activity for its potential to succeed, we should judge our projects for their potential to spawn more projects. As treasure hunters, our interest is in collecting more stepping stones, not in reaching a particular destination. The more stepping stones we find, the more opportunities there are to depart to somewhere greater.’

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