



# State Space Paradox of Computational Research in Creativity

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# Outline

1. Computational Research in Creativity
2. Computational Assistance in Creativity
3. The Paradox of Creativity Research
4. Conclusion and Future Directions
5. References

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**1**

Retrospection

Computational Research in Creativity



## I. SMI (Sudden Mental Impulse)

“Sudden onset of a realization that makes the solution of a very difficult problem / the creation of a remarkable possible result”

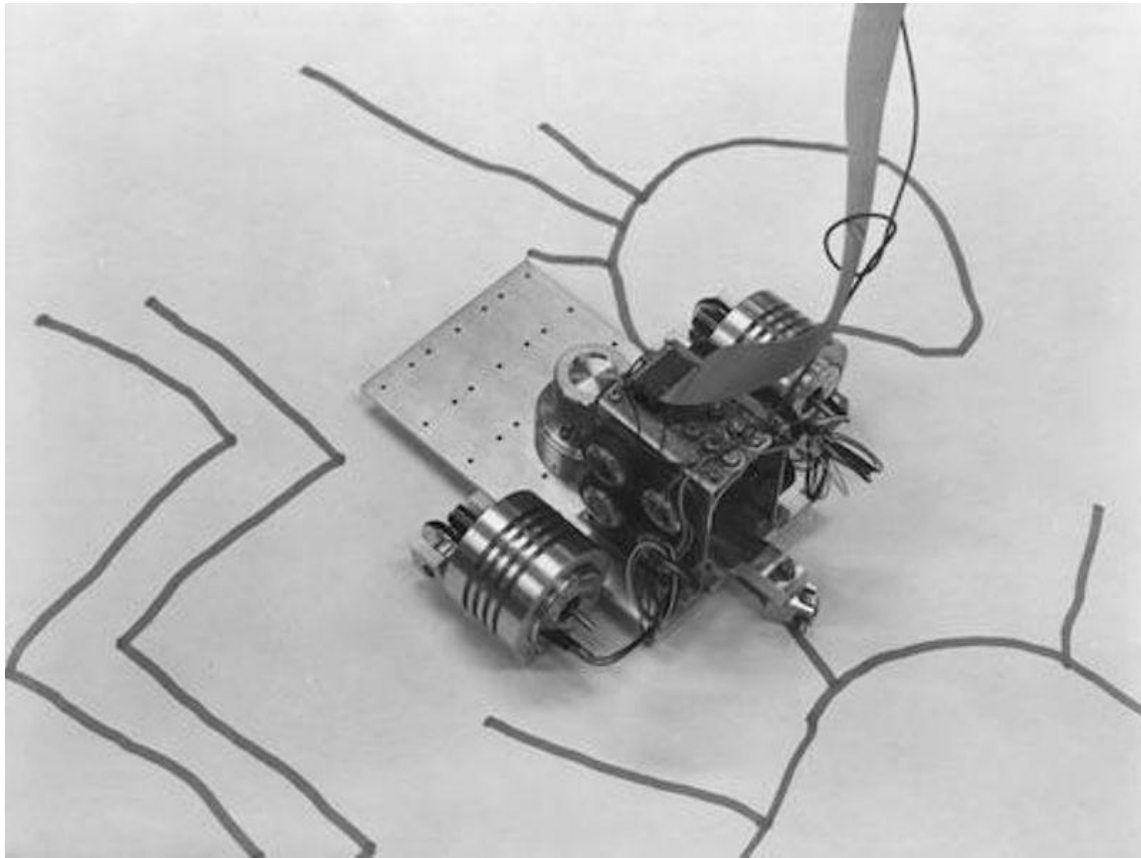


## II. Computational Perspective

### Examples

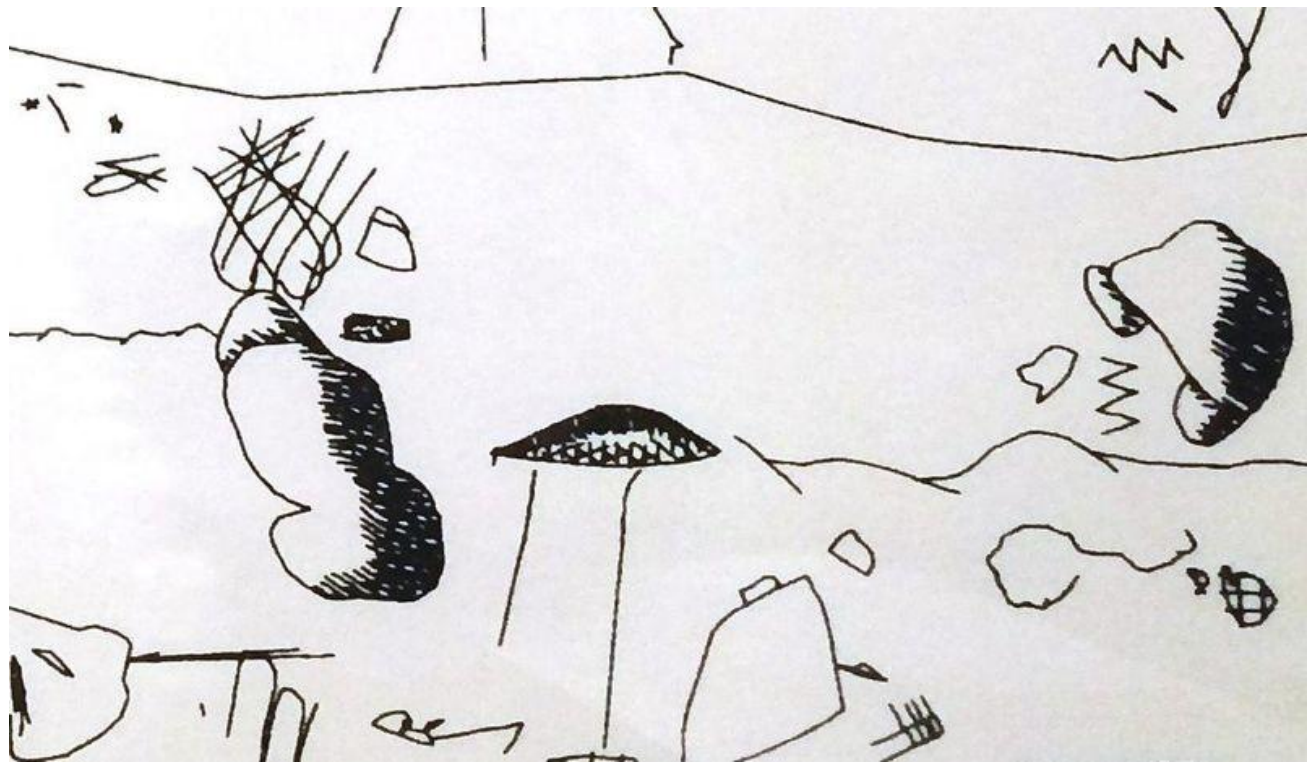
- + Harold Cohen and “Aaron”
- + Eve Sussman and “Serendipity Machine”
- + “Darcy” the artwork judge

Alan Turing and Turing Test



## **AARON**

The 1979 exhibition, Drawings, at SFMOMA, featured this “turtle” robot creating drawings in the gallery. Collection of the Computer History Museum, 102627449.



## AARON and Harold Cohen

Harold Cohen coloring the forms produced by the AARON drawing "Turtle" at the Computer Museum, Boston, MA, ca. 1982. Collection of the Computer History Museum, 102627459.



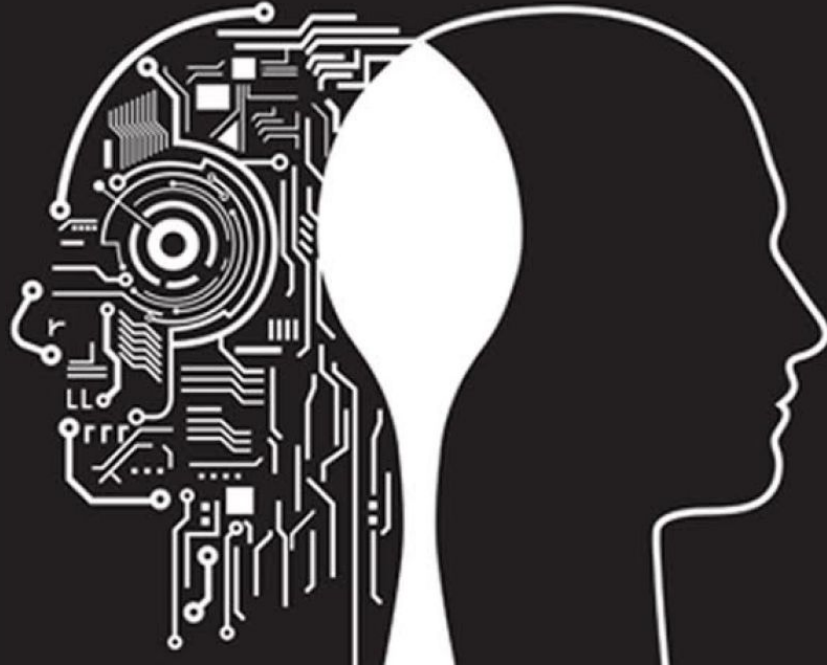
## AARON

AARON image created at the Computer Museum, Boston, MA, 1995. With color rules implemented urged by Edward Feigenbaum.



**“We have many digital emulators of human activities but lack the litmus test for what is sufficiently creative, or intelligent.”**

Up to now, Turing test is the best thing that ever comes up, but it still has its limitations.



Turing  
test



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# 2

## Theoretical Background & Open-Ended Issues Computational Assistance in Creativity

## Procedural Approach

Rule based expert systems

Case based reasoning systems

Complex generative algorithms

- + Genetic
- + Annealing
- + Neural Nets

## Representational Approach

Shape emergence

Object based representation

Complex recognition systems

- + Data mining
- + Petri Nets

Computer based research on creativity (A and B) vs. Digital system models of creativity (A or B)

**Procedural Approach  
A**

Rule based expert systems

Case based reasoning systems

Complex generative algorithms

- + Genetic
- + Annealing
- + Neural Nets

**Representational Approach  
B**

Shape emergence

Object based representation

Complex recognition systems

- + Data mining
- + Petri Nets

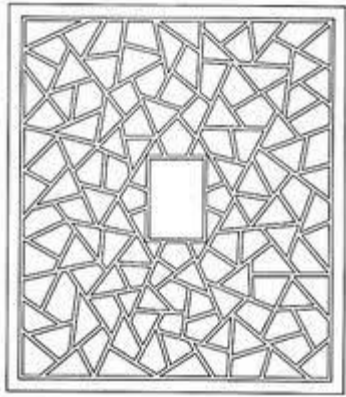


# I. Procedural Approach

- + While representation is important, procedural approaches are built in order to approach machine intelligence.
- + Representation merely aims to facilitate the procedural objectives.

Procedural Systems		
	Procedural Schema	Representation Schema
Rule-based Systems	apply rewrite rules that have their left-hand side match problem representation	problem parameters-variables; rewrite rules; strategy for rule application
Genetic Algorithms	use meta-rules to mutate rewrite rules; generate solutions	problem parameter variables; rewrite rules; rule application strategy; rule mutation mechanism
Case-based Systems	match case; retrieve case; adapt case	case representation; case-base

**Table 1**  
Procedural Systems for Design Creativity



**Ice-Ray Windows by George Stiny**  
Rule based representation, shape grammar





# I. Representational Approach

- + Shape grammar
- + More complex representations. (e.g. Early schema based linguistic representations, etc.)
- + Petri-Nets
- + Data mining



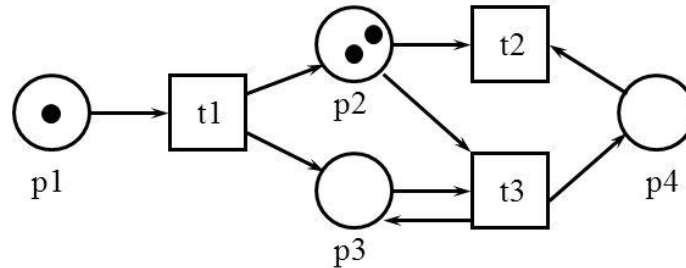
Representational Systems		
	Representation Schema	Procedural Schema
Shape Emergence and Grammars	geometric primitives; maximal shapes	combinatorial enumeration
Cognitive Schema	object based representation of functional, behavioral and physical characteristics	formal reasoning; heuristic reasoning
Recognition Algorithms – Data Mining, Petri-Nets	large data bases; process models	pattern recognition; heuristic search; abstraction

**Table 1**

Representational Systems for Design Creativity

## The classical Petri net model

A **Petri net** is a network composed of **places** (○) and **transitions** (□).



- **Connections**, called **arcs**, are directed and between a place and a transition.
- **Tokens** (●) are the dynamic objects.
- The **state** of a Petri net, called **marking**, is determined by the distribution of tokens over the places.
  - **Initial marking** (1, 2, 0, 0)

### Petri-Nets

A network composed of places and transitions.

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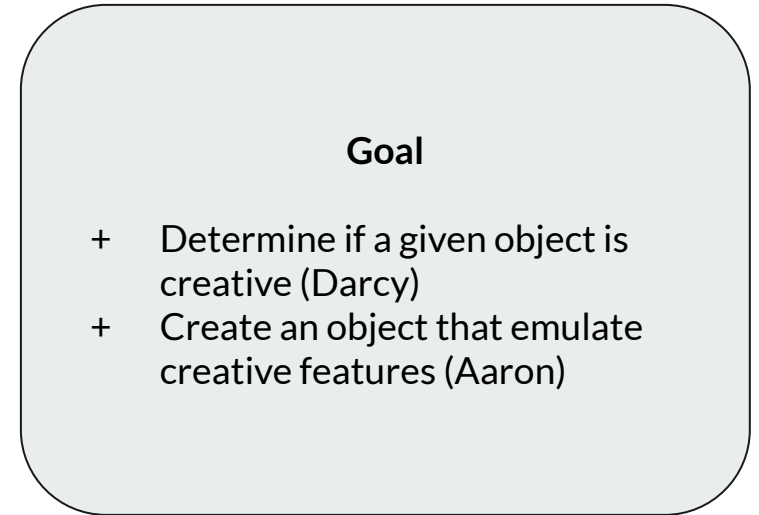
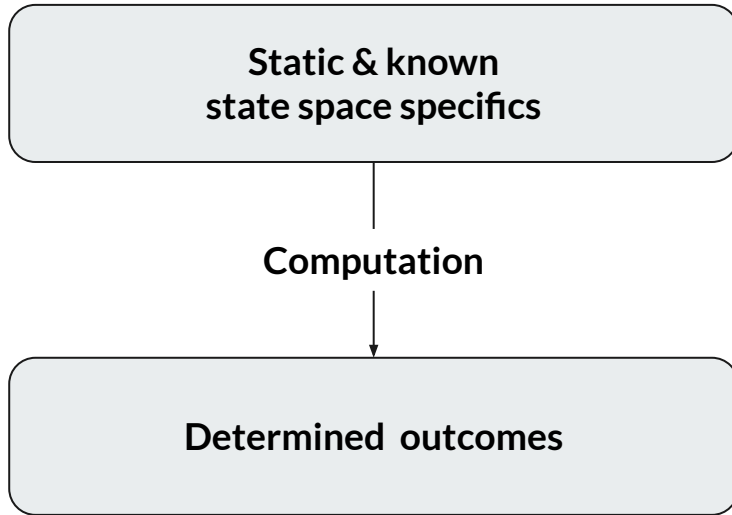
# 3

Implication of theory, policy and practice  
**The Paradox of Creativity Research**



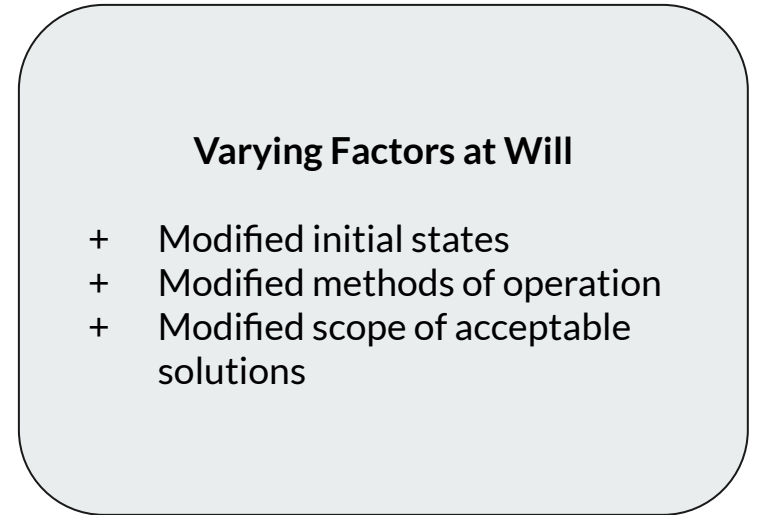
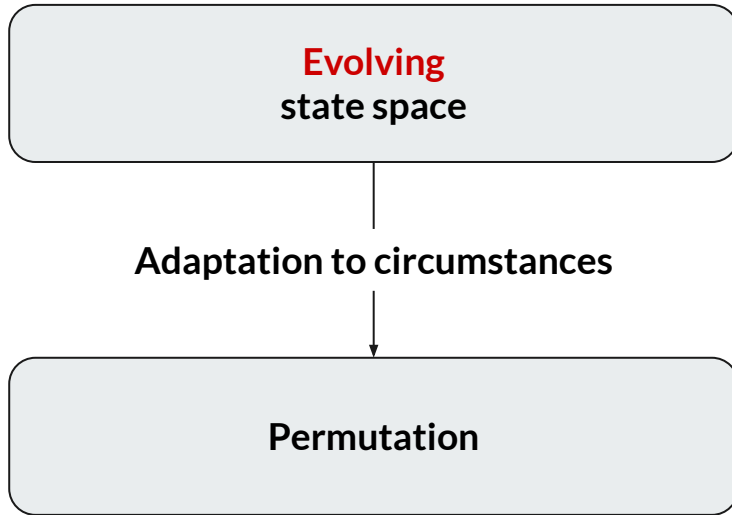
# I. The State Space of Creativity

- + All digital systems of creativity exist within an **implicit or explicit state space**.
- + “The state space represents any finite slice of time in the digital system’s functionality through *entities, operations, goals, heuristics*, and *predicates* that apply to moment in time.”
- + Model process of creativity in discrete terms.



### **Closed systems: digital applications**

Input parameters and possible outcomes are predefined.



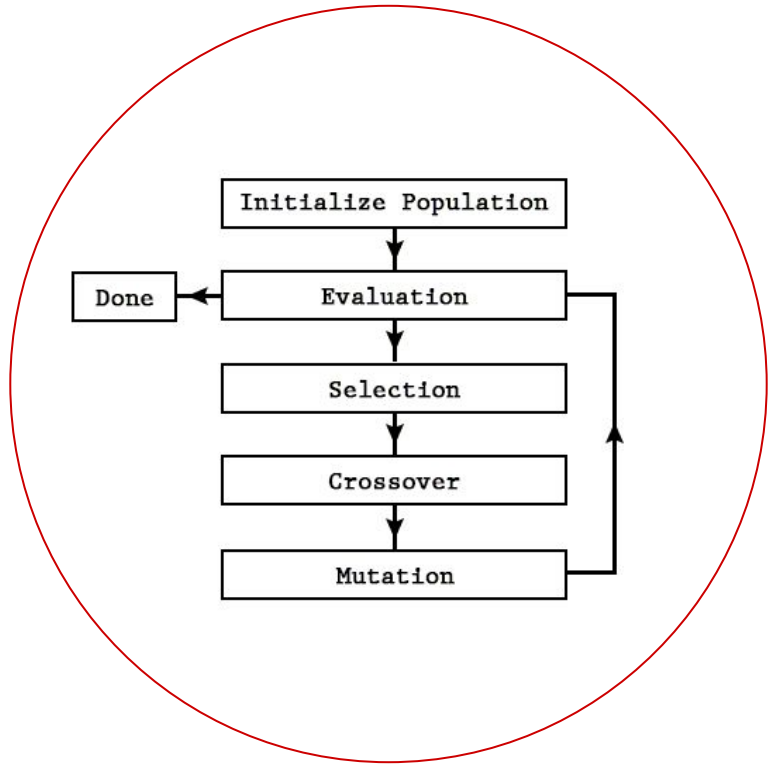
**Open systems: human agents**

The permutations are as endless as concepts carried in one's head



## II. State Space Paradox (SSP)

- + Emulate open system's behaviour
- + Example: genetic algorithm and its enhancement

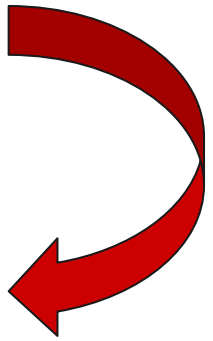
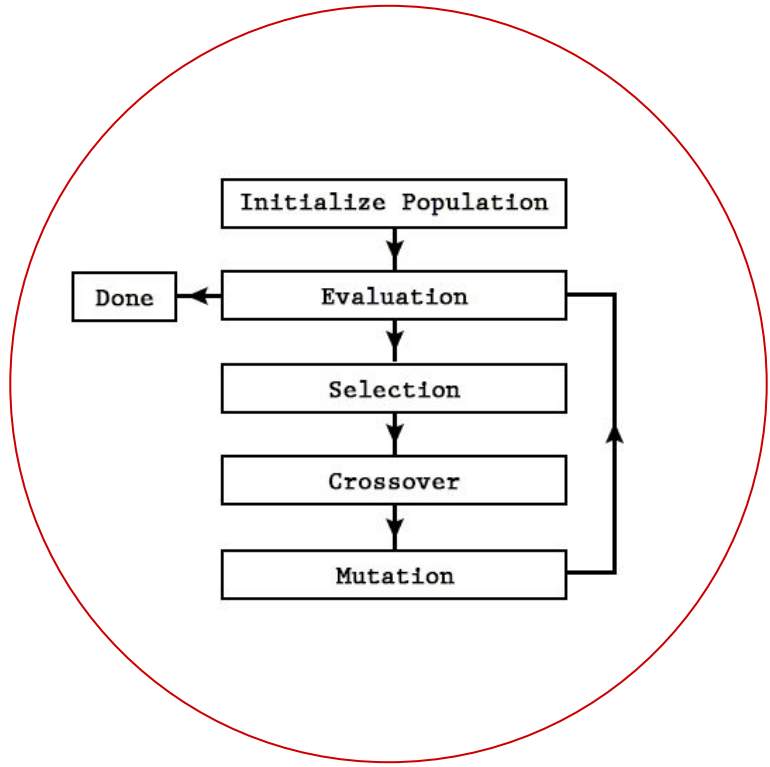


Bounded by the range and complexity of symbol strings

### Genetic Algorithm

Produce transformation on given genotypes





Another algorithm add permutation to symbol string

**Enhanced Version Genetic Algorithm**  
Makes the outcome less predictable



## II. State Space Paradox (SSP)

- + Emulate open system's behaviour
- + Example: genetic algorithm and its enhancement

**This approach simply embeds one closed system (i.e. permutation of the genotypes) inside another one (i.e. generation of designs based on the genotypes)!**



## II. State Space Paradox (SSP)

- + SSP arises when attempts to replicate some aspects of creative behaviours by means of automated / computational closed systems.
- + **A closed system, in order to be creative, must redefine its own state space**



## II. State Space Paradox (SSP)

Eg. Newell and Simon define a state space representation of *search* as

$$S_i = \{ I_i, C_i, T_i \}$$

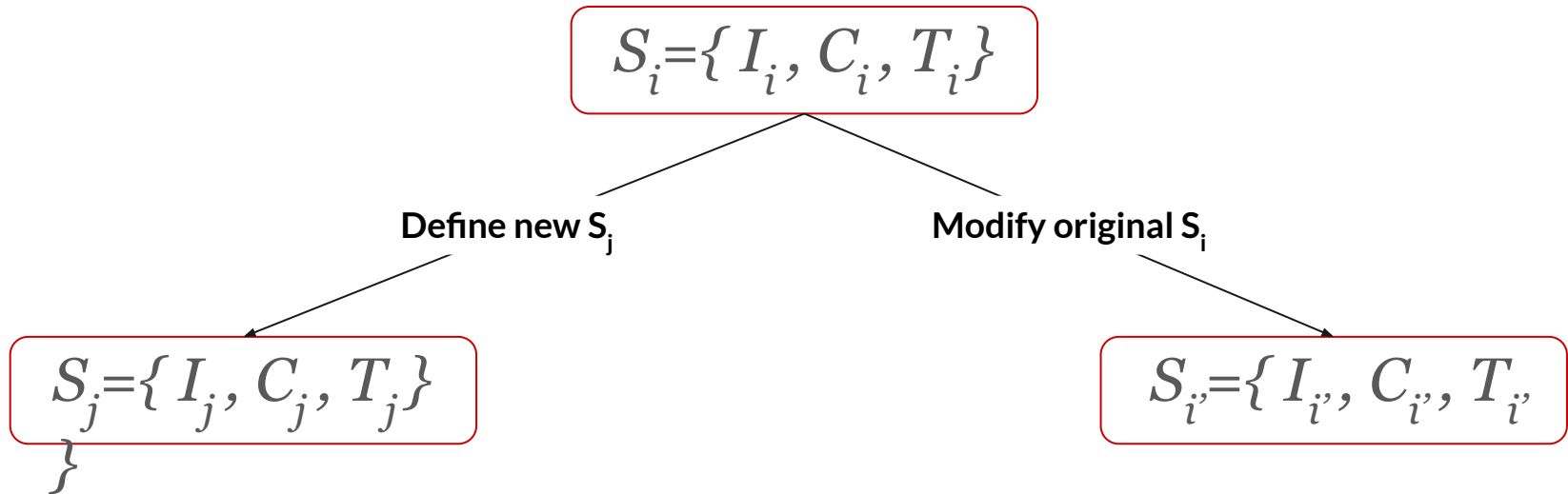
$I_i$  - Initial state

$C_i$  - Conditions on transitions from one state to the next

$T_i$  - Terminal state

## II. State Space Paradox (SSP)

Eg. A creative computer system in Rosenman's





## II. State Space Paradox (SSP)

In either case, the new space is generated by the closed computer system which can only be achieved by applying  $C_i$  (the only operator set) to  $I_i$  or its descendants generated by earlier applications of  $C_i$

$$\{I_j, C_j, T_j\} \subseteq S_i \quad \{I_{i'}, C_{i'}, T_{i'}\} \subseteq S_i$$

$$S_j \subseteq S_i$$

$$S_{i'} \subseteq S_i$$



## III. Consequences of SSP

### Inherent constraint of computer systems

- + Tautologically, computer systems are incapable of exhibiting the creativity we see in open systems.
- + Still, digital creativity applications can and will possibly invoke SMI response in human observer.
- + They are incapable of breaking out their state space boundaries.



## III. Consequences of SSP

### Rare nature of creativity

- + Creativity is sought after because they are scarce, a rare human act.
- + If there's overabundance of creativity acts, we would no longer call them creative.





### III. Consequences of SSP

Combining the two reasonings above, we get

- + If we were able to automate the creation of creativity, we would have an overabundance of so called creative objects.
- + Creativity is not absolute. It's influenced by cultural context, time, space, etc. Attaining it through well-defined / rational means will inevitably run into SSP.




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## Conclusion and Future Directions



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References

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**Thank you!**

