What is Emergence?

Generative murals as experiments in the philosophy of complexity

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Abstract

The Traveling Salesman s a series of site specific wall paintings based on a canonical optimization problem. Well known among computer scientists, the Traveling Salesman Problem (TSP) is a search for the shortest path visiting a number of locations exactly once. For this piece software is used to solve the problem for sets of random points, and then each optimized path is transformed into an image. The resulting images exhibit a consistent style that is simultaneously random yet visually coherent. Some would call this emergent form.

But emergence is a hotly disputed term from the field of complexity science and the philosophy of science. Complexity Science studies systems made up of large numbers of interacting parts which often exhibit order in the midst of nonlinear, feedback, and/or chaotic mechanisms. These so-called "emergent behaviors" are not typically explained or predicted by sciences traditional reductionist methods. Complexity science, in part, seeks to explain emergence.

The Traveling Salesman explores the ontological and epistemological aspects of the question "what is emergence"?

1. The Traveling Salesman

One day while developing my "Foundations of Generative Art Systems" [1] class I was looking for a good example to illustrate the use of genetic algorithms. I came acoss an article by Larry Fogel [2] documenting his early use of genetic algorithms to solve The Traveling Salesman Problem.

The Traveling Salesman Problem, or TSP, is well-known among computer scientists, mathematicians, engineers and others. The problem is easy to state. A salesman has to visit a number of cities exactly once, and the goal is to find the tour that minimizes the total distance traveled. (There are other variations as well). [3]

The TSP is of interest in part because it represents a broad range of applications including all manner of transportation logistics, but it also maps into less obvious applications such as genome sequencing, integrated circuit design, computer network

design, and power grid design.

The TSP is also of interest because it is a combinatorial problem thought to be NP-Complete. Informally NP-Complete problems are those which become exponentially more difficult to solve as their complexity is increased linearly. For example, if a 200 city problem takes 1 second for a computer to solve, a 400 city problem might take 4 seconds to solve, and an 800 city problem might take 16 seconds to solve. Interestingly if a TSP algorithm could be found that only requires a linear increase in computation time, it would generalize to a linear solution for all NP-Complete combinatorial problems. It is thought, however, that such a solution is an impossibility.

In practice the most efficient algorithms for the TSP are not genetically based. But because the problem is easy to understand it can nevertheless be useful in a teaching context. In a typical implementation each genotype is in fact a proposed solution to the problem, i.e. a tour. At each step the phenotype, the total distance traveled, is evaluated. Very long tours are eliminated from the gene pool, and the genes for short tours are allowed to continue breeding. Because viable genes must be a cycle that includes each city once and only once, typical simple mutation and crossover operations are usually avoided. Instead similar operations that ensure legal tours are used. After a number of generations the solutions in the gene pool improve and perhaps ultimately yield an optimal tour, i.e. the shortest possible path.

Here is the graph Fogel originally published in his groundbreaking work. He first generated a set of random points (i.e. "cities") and then used genetically inspired software to generate this TSP solution.



As I viewed this graph something strange happened. I stopped thinking about the lesson I was preparing and the various technical aspects of genetic algorithms. I was lost in the appreciation of the esthetics of what could be viewed as a line drawing. The formal aspects of this would-be machine drawing seemed to exhibit an intelligence and coherence that had nothing to do with combinatorial analysis and

optimization. A set of random points had been transformed into a compelling image with a definite style. I wondered if an artist, if asked to connect the dots, could come up with an equally satisfying line drawing.

It seemed as if formal beauty was an emergent property arising out of the complexity of genetic competition. With the aid of a scanner and Photoshop I appropriated the graph and added some color to help emphasize the overall contours of the "drawing" resulting in the following image.



Figure 1.1

Those studying complex systems are not unanimous as to how to define complexity, but virtually all would agree that evolutionary systems fit the bill. The local interactions of large numbers of small components (i.e. genes) and feedback mechanisms (i.e. reproduction and competition) result in structures at a higher level (i.e. the phenotype) that would be difficult to explain via reductionism.

For many emergence is the hallmark of complexity, and natural evolution is the highest and best example of emergence. Exquisite forms such as butterfly wings, leopards spots, the branching structures of trees, and spiral structures in seed pods and flower petals, and indeed the entire realm of living things, seem to offer "order for free" [4] as provisional end points in the long process of evolution.

Philosophers and theologians have argued that just as the complex design of a watch implies the existence of an intelligent watchmaker, the infinitely more complex design of the ecosystem and the plants and animals it contains implies the existence of an infinite creator, which is to say God. Emergence is offered by complexity science as a less mysterious, purely mechanistic, explanation of creation. But even as such, emergent properties are often defined as "unexpected" or "surprising" features that defy prediction or even understanding via dissection into parts, and can only be appreciated in a holistic manner.

And so it seemed with the solutions to the Traveling Salesman Problem. Upon completing the graphic shown above (figure 1.1) I immediately decided to embark on a series of wall drawings or murals. Each mural is site specific in that a set of random points are generated to fit the specific shape of the given wall. Then those points are solved as a TSP problem and the resulting lines are painted and filled with color.

I expected that some would respond to these works in a way consistent with the ironic social/political postmodern tone that remains dominant in the American art world. After all, the traveling salesman has an iconic status in American culture. Willie Loman in Arthur Miller's play "Death of a Salesman" epitomizes the hard working capitalist who ultimately fails because he views the American dream as a purely material pursuit. And there is a tradition of bawdy "traveling salesman" jokes where the eponymous anti-hero engages a sequence of farmer's daughters or bored housewives, often to no happy end. And indeed one could observe that the same computing technology that allows us to now solve large TSP's has also, ironically enough, made traveling salesmen increasingly irrelevant through the advent of web based marketing, video conferencing, and so on.

But such things were not my interest. Artists often invent private languages, and just as felt and fat became symbols for Joseph Beuys of his (possibly fictional) wartime experiences, for me the Traveling Salesman Problem became a symbol of my experience with emergence.

I made more TSP based designs and confirmed that they shared a consistent aesthetic style. I continued to wonder how it was that a genetic algorithm which solves the TSP, an exercise in optimizing a tour of random points with no aesthetic agenda, and no feedback based on artistic judgment, could generate murals with a consistent visual style that seemed anything but random.

2. TSP Solutions Considered Aesthetically and Mathematically

To better understand the emergent form TSP solutions seem to exhibit I created 25 problems, each using 1000 points (cities) randomly distributed within a circle. I distributed the points within a circle to avoid any bias an aspect ratio or straight edges or corners might introduce.



Figure 2.0

Figure 2.1



Figure 2.2

I noted the following aesthetic factors that seemed to contribute to the style these designs exhibit.

- Each design consists of an enclosed area.
- Each design consists of only one enclosed area. The border never crosses itself.
- There is ambiguity in terms of figure and ground.
 - The area seems to be equally divided into figure and ground.
 - The angles which make up the borders seem evenly divided between convex and concave
- There is a relative lack of extreme angles

I then embarked upon a modest mathematical investigation of the apparently emergent form TSP solutions exhibit considering each factor in turn.

2.1 Each design creates an enclosed area

It seems almost trivially obvious that any TSP solution is going to create an enclosed area. Imagine each city is a fence post and each city-to-city path taken is a barrier. If at a given point along the fence 2 persons would like to meet they may be tempted to walk to the next fence post. But at that post they will find another fence span blocking their meeting. And so they move on to the next fence post and find another span blocking their meeting. And so it goes until, by definition, the fence returns to the first fence post. Since the two people can never meet one of them must be trapped in an enclosed area.



Figure 2.3

It's of course possible that the fence will cross itself, and when this happens it creates two or more enclosed areas. But this doesn't seem to happen in TSP solutions. Why might this be?

2.2 Each design creates only one enclosed area, i.e. the border never crosses itself.

Consider the local situation where a tour happens to cross itself. Four cities (points) will be involved and we will ignore how those cities are further connected to the overall tour. In this situation there are only two ways to uncross the line segments. Of these two ways one will maintain the continuity of the tour, and the other will break the tour into two smaller tours.



We now want to show that the total length of the two crossed line segments is always greater than the total length of the uncrossed line segments in both possible cases. We will call the four cities in question A, B, C, and D. An additional point X is added at the point of intersection.



Since the shortest distance between two points is a straight line, we can show:

 $\label{eq:action} \begin{array}{l} \mathsf{AC} < \mathsf{AX} + \mathsf{XC} \\ \mathsf{BD} < \mathsf{BX} + \mathsf{XD} \\ \mathsf{AC} + \mathsf{BD} < (\mathsf{AX} + \mathsf{XC}) + (\mathsf{BX} + \mathsf{XD}) \\ \mathsf{AC} + \mathsf{BD} < (\mathsf{AX} + \mathsf{XD}) + (\mathsf{BX} + \mathsf{XC}) \\ \mathsf{AC} + \mathsf{BD} < \mathsf{AD} + \mathsf{BC} \end{array}$

In the same way we can show that:

Having shown that the total length of the two crossed line segments is always greater than the total length of the uncrossed line segments in both possible cases, we can infer that any suggested solution that includes a pair of crossed line segments can be improved by uncrossing those line segments. Thus an optimal solution will have no crossed line segments at all. (Note though that it is quite possible that a solution with no crossed line segments is still sub-optimal).

2.3 The angles which make up the borders seem evenly divided between convex and concave. There is a relative lack of extreme angles.

To verify this observation I did a statistical analysis of the angles contained in the 25 test problems. Even though casual observation didn't reveal any significant line segment length relationships I also analyzed these. In addition I did this for both all angles and line segments, and only those angles and line segments within a .6 radius of the unit circle distribution. The latter was intended to eliminate any possible edge effects.



In this analysis of all (Figure 2.6) and central (Figure 2.7) line segment lengths there is no obvious edge effect. (The latter shows greater variance, but this is to be expected due to the smaller sample size). The distribution shows a unique shape which no doubt contributes to the TSP solution's visual signature. Both curves peak near .04. If 1000 points were uniformly distributed in a unit circle using an optimal triangular mesh they would be at a distance of about .06. It shouldn't be too surprising that distances in the TSP solution test cases are significantly less than this because a random distribution will have tightly clustered points of cities that can be exploited.



In this analysis of all angles (Figure 2.6) and central angles (Figure 2.7), those that are less than 180 degrees are convex edges of the enclosed figure, and those that are greater than 180 degrees are concave edges. Again there seems to be little edge effect. The overall distribution appears to be something other than Gaussian. The curve is somewhat flattened from 120 degrees to 240 degrees. There is an apparent inflection point near 60 and 300 degrees where extreme angles become quite rare. Both distributions are very symmetric.



Figure 2.10 visually illustrates why angles less than 60 degrees are so rare. Three points at 60 degree angles can be connected in a series in three different ways, and all will result in the same total length. But when one of the points is shifted further away to create a smaller angle, that path quickly becomes the longest, and thus least optimal, option.



Aggregating the angle statistics within each of the 25 test cases further confirms a relative balance of convex versus concave edges.

With only 25 test cases there is too much variance to clearly exhibit a Gaussian distribution, especially where the edge cases are eliminated, but the proportion of convex to concave angles is very close to .5 in all cases. (All cases are between .48 and .52).



Figure 2.13

It makes perfect sense that there is a balance of convex and concave contours. While some angles may be more likely than others, complementary angles (as the distribution in figures 2.8 and 2.9 shows) are equally likely. Assume a tour is being constructed and that points A and B have been connected. The inside of the soon-tobe enclosed space is to the left and the outside is to the right. As a local phenomenon (figure 2.13) a third random point C to be added to the tour is as likely to be on the left as the right. Thus adding a third point is as likely to create a concave contour as a convex one.

2.4 The area seems to be equally divided into figure and ground

Using Monte Carlo methods I measured the amount of area captured by the enclosed figure versus the area that remains on the outside. As shown below (Figures 2.14 and 2.15), and allowing for the expected statistical variation, the ratio of figure to ground is again very close to .5 for both the entire figure and the portion of the figure with a radius of .6. (All cases are between .45 and .55).



Similar to the argument in the previous section, as a local phenomenon adding a third point C as the tour is connected is as likely to add a lot as a little area in the enclosed figure.



3. Emergence as a Philosophical Problem

Having completed this mathematical consideration of TSP solutions, I still found the resulting graphics to be formally satisfying, but strangely the phenomena no longer seemed to be emergent.

It now felt as if these forms were simply and exactly what they had to be. Each design consists of an enclosed area because any connected loop of nodes would have to. Each design consists of only a single enclosed area because, as we have seen, designs that create multiple enclosed areas are suboptimal solutions. The ambiguity of figure and ground is caused by the equal distribution of angles, the equal distribution of convex and concave contours, and the even distribution of area within and without the figure. All of this is due to the probabilistic symmetry of randomly placed cities. The limited number of very small and large angles is due to the cost in trip length such angles exact. The mean length of the line segments is not surprising when considered in the context of the separation lengths required to create a uniform grid of an equal number of cities.

Somehow improved understanding had evaporated the sense of emergence.

Although many scientists seem very comfortable in referring to various complexity related properties as being emergent, the concept of emergence is a thorny philosophical problem that predates current thinking about complex systems.

One has to wonder whether emergence is in the eye of the beholder. Could it be that Marvin Minsky is correct when he refers to emergence as a "suitcase concept' we use to deceive ourselves by filling it with "things we don't understand yet"? [5] Might it be that extraterrestrial beings endowed with an advanced intelligence wouldn't consider the evolution of earthly plants and animals as emergence, but would simply view it on a par with other non-emergent phenomena?

Often emergence is casually defined relative to the appearance of "surprising" or "unpredictable" features not present in a systems components, or with a slogan such as "the whole is greater than the sum of its parts". But does that endow emergence with ontological integrity? Is emergence real, or is it merely an epistemological consideration that says more about human consciousness than external reality?

But further, if emergence is merely an experience without any specific basis in the physical world, does that mean it isn't real? Following John Searle's thoughts on consciousness [6], perhaps emergence like other qualia is real but partitioned into the realm of what he calls "first person ontology".

Emergence as a philosophical problem remains an open question. But this actually increases my enthusiasm for this series of murals. Often an artists role, and the private language he or she may develop, is more about asking important questions than providing pat answers. In addition I hope the Traveling Salesman series can serve as an example of how the exploration of systems through generative art can act as a sort of experimental philosophy. I remain convinced that even in these postmodern times philosophy can be pursued via artistic experimentation.

References

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