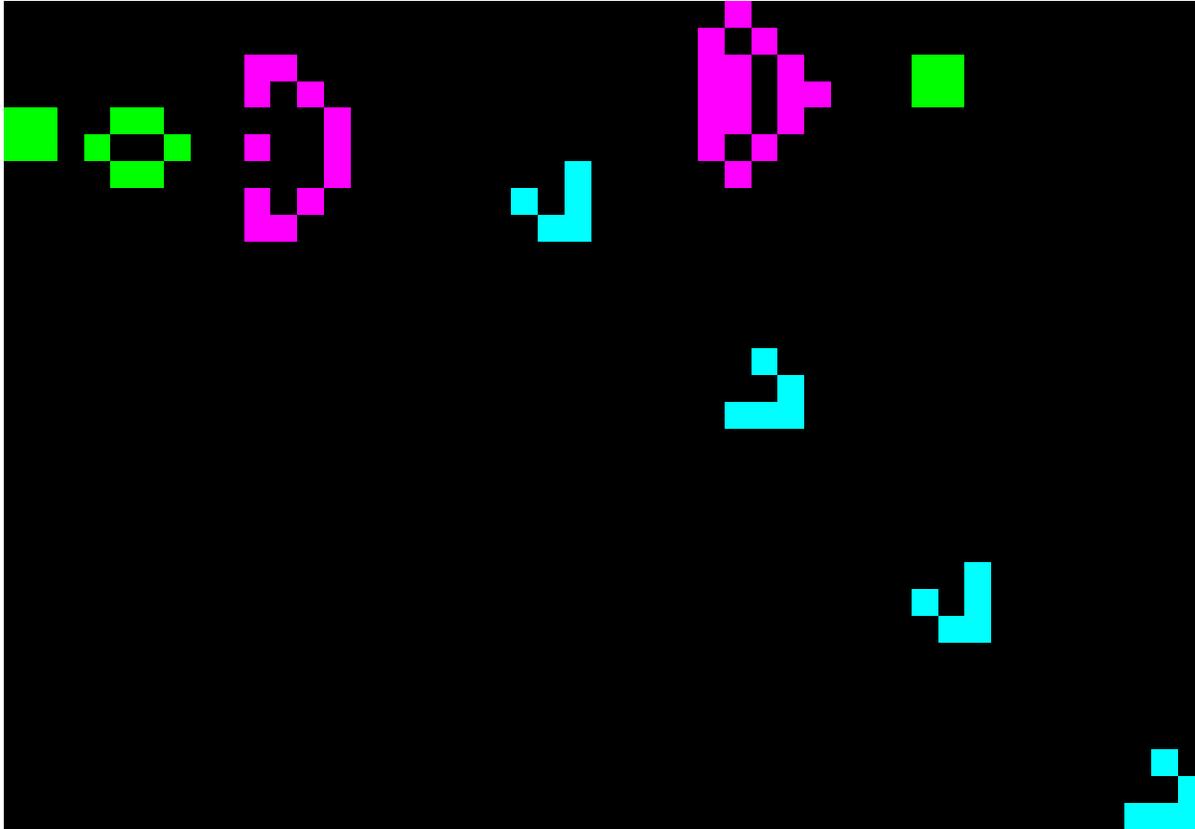


Computability, Undecidability and the Halting Problem

12/01/16

http://www.michael-hogg.co.uk/game_of_life.php



Discrete Structures (CS 173) Lecture B

Gul Agha

Based on slides by Derek Hoiem, University of Illinois

Today's class: Computability, Undecidability and the Halting Problem

- Review of basic concepts from Tuesday
- The halting problem
- Examples of infinitely varying patterns
 - Game of life
 - Penrose tilings

Previous lecture

- Some infinite sets are bigger than others
- A “countable” set is the same size (or smaller) than the natural numbers
- We can compare sizes of infinite sets using bijections or one-to-one functions
- Diagonalization is a useful technique for constructing a new element that is different than every element of a countably infinite set

Size of infinite sets

$$\begin{array}{ccccccc} & & & & & & |\text{Powerset}(\text{Naturals})| \\ & & & & & & \parallel \\ |\text{Naturals}| = |\text{Integers}| = |\text{Odd Numbers}| < |\text{Reals}| < |\text{Powerset}(\text{Reals})| < \dots \\ \underbrace{\hspace{15em}} & & & & & & \\ & & & & & & \text{Countably Infinite} \end{array}$$

Functions and Relations on Natural Numbers

$$\mathcal{F} = \{f \mid f: \mathbb{N} \rightarrow \{0,1\}\}$$

What is the cardinality of \mathcal{F} ?

Notice that this encodes the power set of natural numbers!

Uncomputability

- A computer program is just a string (finite series of characters), so the set of all programs is countable.
- But the set of functions is uncountable (e.g., functions that map reals to reals)
- So there are more functions than programs – some functions cannot be computed by any program

Cardinality of the Set of all Programs

Programs are from a countable grammar (rules, kinds of statements) and of finite (though arbitrary) length. How many programs may have:

- “Length” 1
- “Length” 2
- ...

Example: not all real numbers are computable

$$3/4$$

$$\sqrt{2}$$

Halting problem:

- Is there a general purpose algorithm that can determine whether a program will terminate?
 - On a given input?
 - On all inputs?

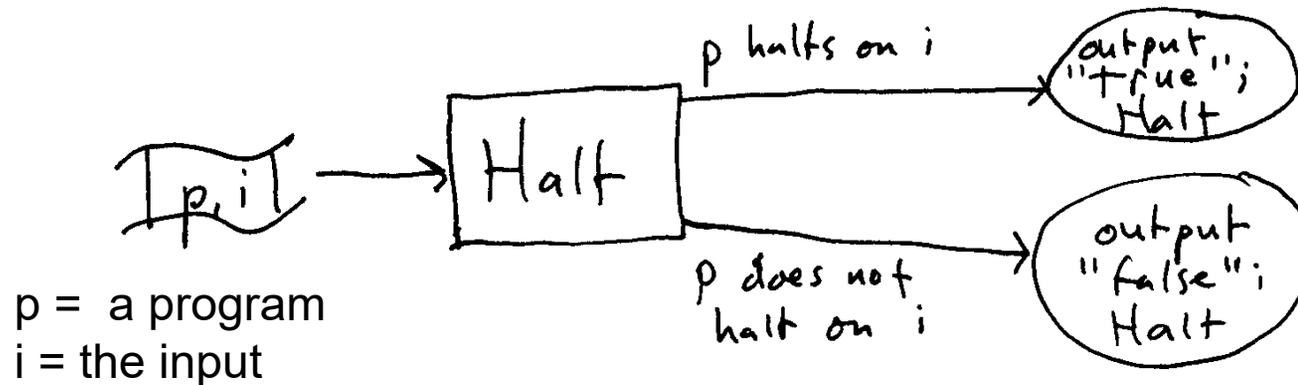
Example: Suppose you have written a machine learning algorithm that has been running for days. Will it ever stop on its own?

Potential solutions to halting problem

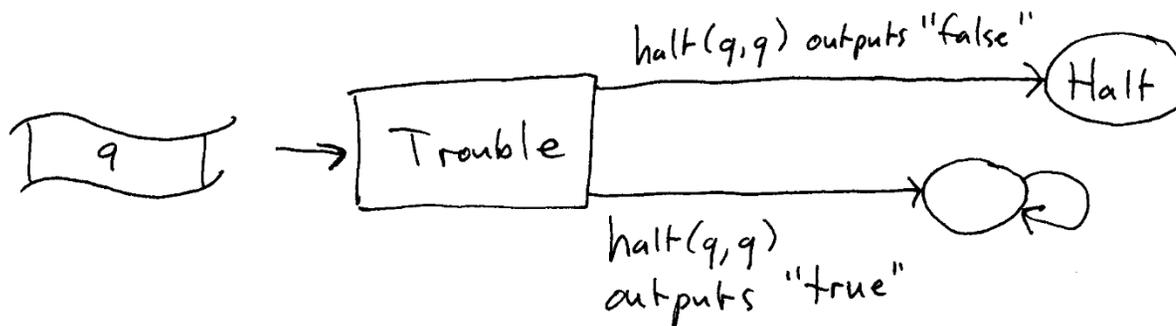
- Run program for a really long time and see if it stops.
- Analyze code to see if there are infinite loops.
- Check if loop exit conditions become “closer” to being met over time (Induction proofs).

Halting problem is undecidable

Suppose we have a magic program that solves the halting function:



Now we write this evil program:



What happens if we call trouble(trouble)?

Liar's paradox

- In some primitive kingdom, they had not abolished the death penalty. A King ruled that his critics should be executed. But to torture them further, he decreed that they could make a statement. If the statement is true, they should be beheaded. If the statement is false, they should be hanged.
- One of his critics was a logician. She said: "I will be hanged."
- True or False: "This statement is false"

Halting problem is undecidable

```
bool does_it_halt( char * program, char * input ) {  
    if( some terribly clever test for halting )  
        { return TRUE; }  
    else  
        { return FALSE; }  
}
```

```
bool evil_program( char * program ) {  
    if( does_it_halt( program, program ) )  
        { while( 1 ) {} return FALSE; }  
    else  
        { return TRUE; }  
}
```

What does `evil_program(evil_program)` do?

Why the halting problem matters

- We often want to know if a program converges (halts), but not possible to provide one algorithm that answers this for all programs.
- In practice, convergence can be proven in many cases
- First example of a decidability problem
 - Many other problems are shown to be undecidable by being reduced to halting problem
 - E.g., there cannot be a general algorithm that decides whether a given statement about natural numbers is true or not

Halting behaviors

- Program halts
- Program loops but keeps repeating itself
 - Sometimes detectable, unless loop is really long
- Program continues changing without repetition
 - Hard to tell if it will stop or start repeating or keep changing forever

Example: is there a finite or repeating set of digits?

$$3/4$$

$$1/7$$

$$102/103$$

$$\sqrt{2}$$

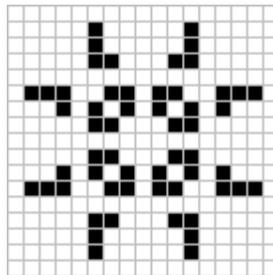
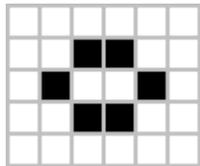
Another example: game of life

Simple rules

- Any live cell with fewer than two live neighbours dies, as if caused by under-population.
- Any live cell with two or three live neighbours lives on to the next generation.
- Any live cell with more than three live neighbours dies, as if by overcrowding.
- Any dead cell with exactly three live neighbours becomes a live cell, as if by reproduction.

Complex outputs

- Some programs halt, some loop repeatedly, some continually change



Historical significance of Conway's Game of Life

- Proposed in answer to question of whether self-replicating machines are possible – artificial life
 - Invented in 1970 (on paper)
- Example of emergence and self-organization

Game of life online:

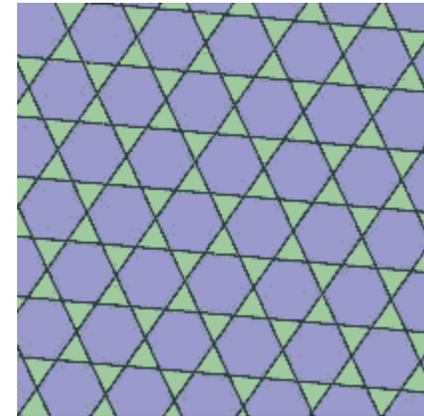
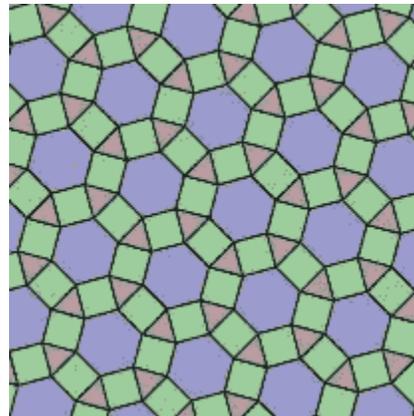
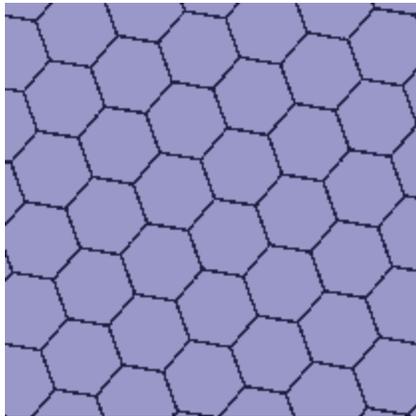
<http://www.bitstorm.org/gameoflife/>

<http://www.ibiblio.org/lifepatterns/>

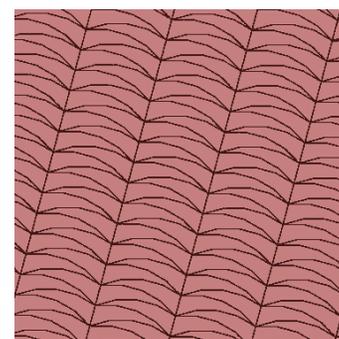
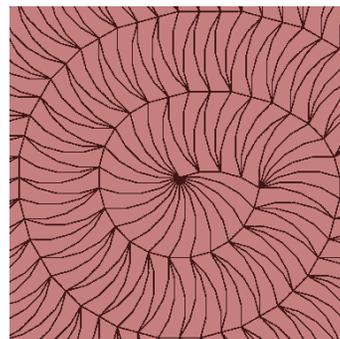
Aperiodic tilings

Examples from
<http://www.ams.org/samplings/feature-column/fcarc-penrose>

Tiles that lead to periodic tilings



Tiles that can create periodic or aperiodic tilings



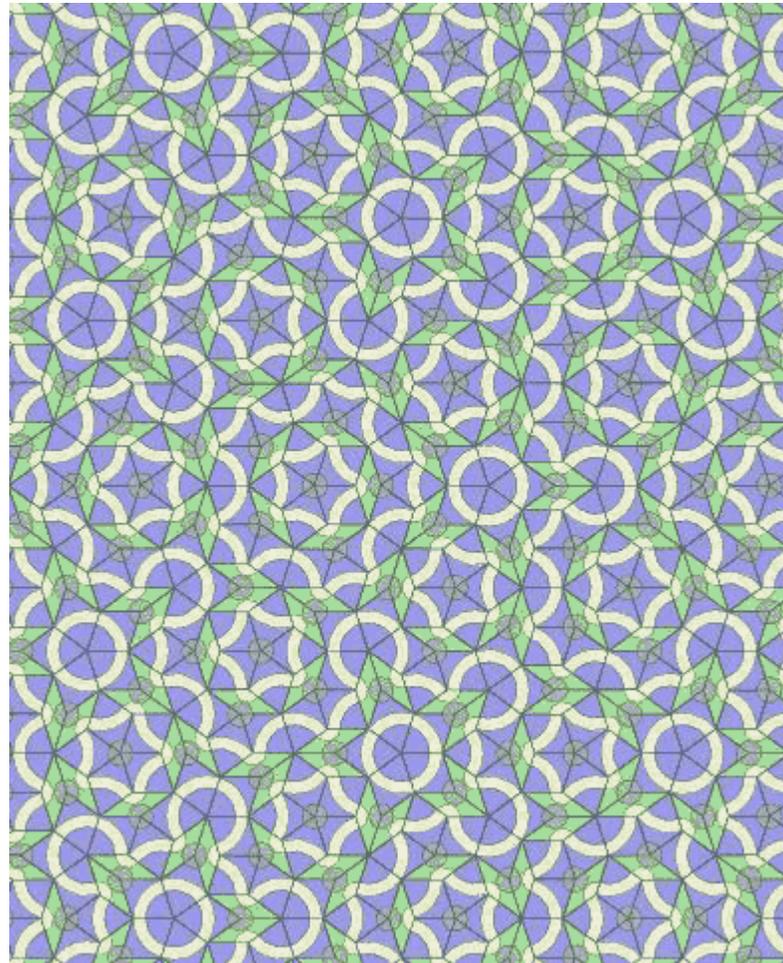
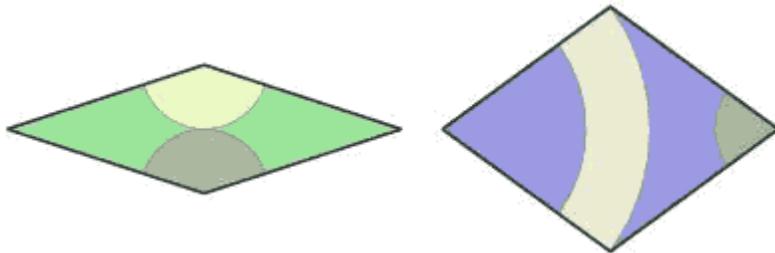
Question asked by Hao Wang in 1961:

Is it possible to create tiles that always lead to aperiodic tilings?

First solved by his student Berger in 1963 with 20,000+ tiles

Is it possible to create tiles that always lead to aperiodic tilings?

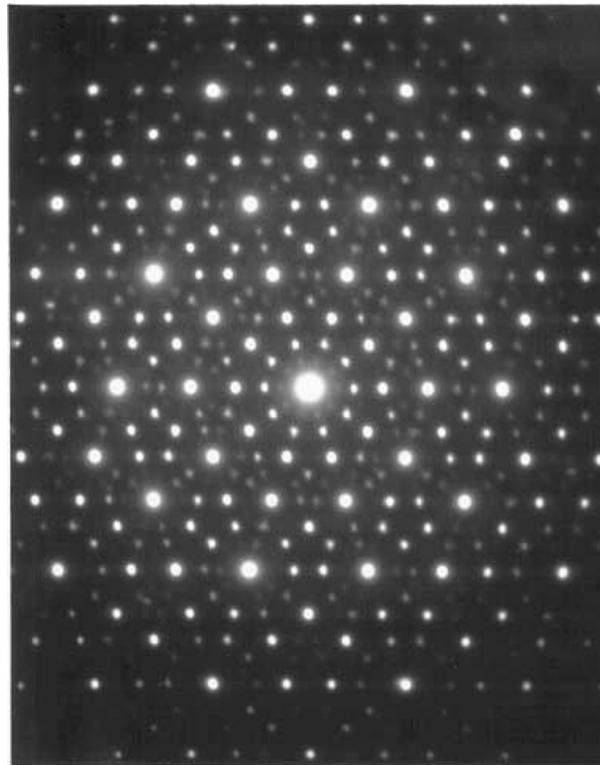
Penrose tilings



Examples from
<http://www.ams.org/samplings/feature-column/fcarc-penrose>

Application: quasicrystals

- Eventually understood to be analogous to 3D Penrose tilings



More on this here: <http://en.wikipedia.org/wiki/Quasicrystal>

Universal Model of Computing

Church's Thesis: Anything that is computable can be computed by a *Turing Machine*.

A model or programming language is *Turing Complete* if it can compute anything a TM can.

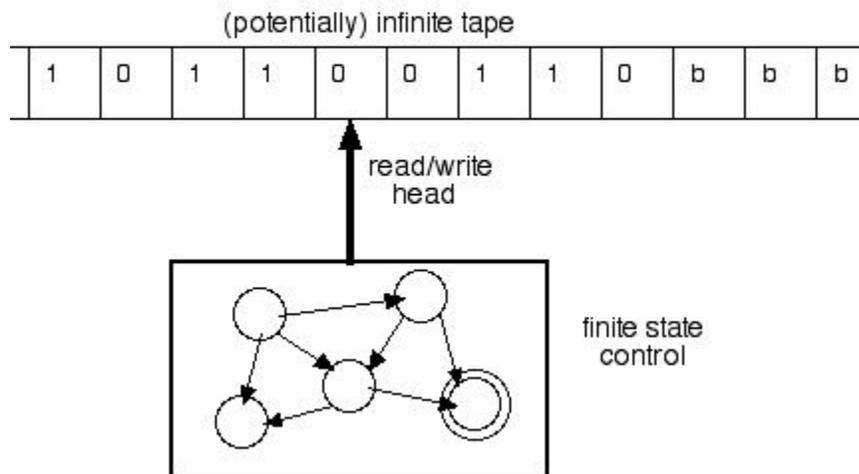
Examples:

1. *the λ -calculus* (theory of functions)
2. *C, C++, algol, Java, Scheme, ...*

What is a Turing Machine?

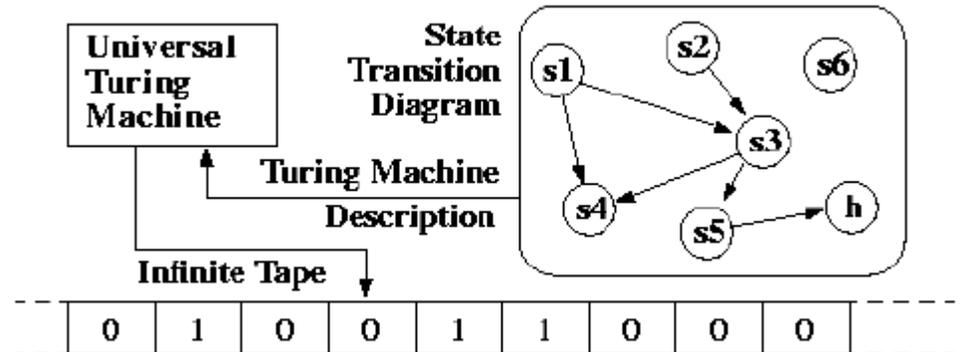
Turing Machines

Turing Machine



<https://csustan.csustan.edu/~tom/Lecture-Notes/Computation/Turing-Machine.jpg>

A description of the Finite State automata for control can be entered on the tape to be interpreted by a Turing Machine (called a Universal Turing Machine because it can execute an arbitrary given TM on a given input)



<http://web.mit.edu/manoli/turing/www/turing.gif>

See also: https://en.wikipedia.org/wiki/Turing_machine

Some Undecidable Problems

- Given an arbitrary function f :
 - Is f a *total function*?
 - Is $f(0)$ *defined*?
 - Is there a natural number for which $f(n)$ is defined?
- The Equivalence Problem
- Post's Correspondence Problem
- Hilbert's Tenth Problem

The Equivalence Problem

- Given two (arbitrary) computable functions (programs) is there an algorithm that can decide if the functions produce the same output?

Example: $f(x) = x + x$ $g(x) = 2x$

- *Simpler version:* given an arbitrary computable function, is there an algorithm to decide if it is equivalent to the *identity* function?
- *Neither is decidable.*
- *But if two computable functions are not equivalent, you can find that they are not.*

Post's Correspondence Problem

- Introduced by Post in 1946.
- Best illustrated with an instance. Given a finite sequence of pairs of strings:

$$(s_1, t_1), (s_2, t_2), \dots, (s_n, t_n)$$

Is there a sequence of indices i_1, \dots, i_k , with repetitions allowed, such that:

$$s_{i_1} \dots s_{i_k} = t_{i_1} \dots t_{i_k}$$

Two instances:

$(ab, a), (b, bb), (aa, b), (b, aab)$

A solution: sequence 1, 2, 1, 3, 4 gives:

$(ab, a), (b, ab)$

Hilbert's Tenth Problem

Does a polynomial $p(x_1, \dots, x_n) = 0$ with integer coefficients have a solution such that each of x_1, \dots, x_n are integers?

(Posed by Hilbert in 1900).

Some instances can be solved:

$$x_1 + x_2 = 2$$

$$x^2 = 2$$

In 1970, Matiyasevich proved that Hilbert's Tenth Problem is undecidable. (There is no algorithm that can say if a polynomial has integer solutions).