

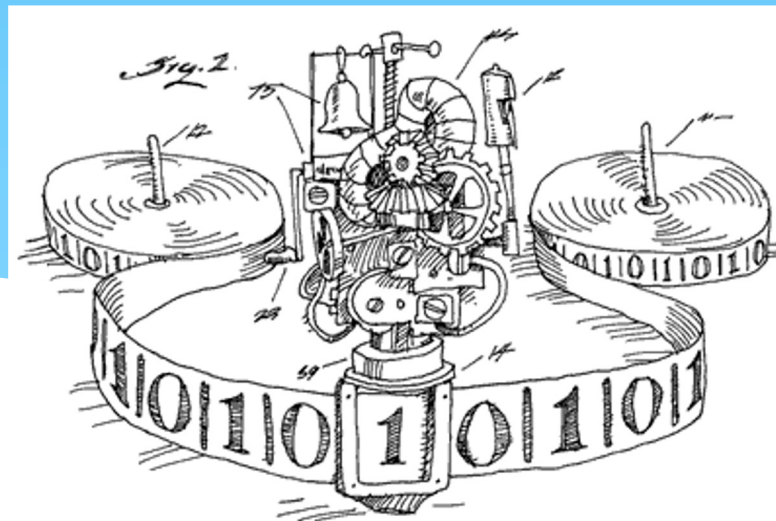
EECS 376: Foundations of Computer Science

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Today's Agenda

- * Introduction
- * Big questions/Outline
- * Administration
- * Algorithm Design and Analysis
 - * Potential Function arguments

Introduction

- * I'm Seth
- * I've been a Professor at Michigan since 2006.
 - * Visiting prof. at various places: Germany, Denmark, Israel, China.
- * I teach math, theory, and algorithms courses (EECS 203, 376, 477, 586, 598 seminars, etc.)
- * **Research:** Combinatorics/discrete math, data structures, distributed computing, statistics, graph algorithms.



Why are we here?

Computer science is no more about computers than astronomy is about telescopes. --- Edsger Dijkstra

Foundations: What is computation? (just number-crunching?)

Is every problem solvable on a computer?

Can every solvable problem be solved quickly?

Are there general algorithmic techniques?

...

Why is this useful to me?

Computational Thinking

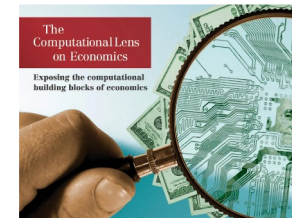
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Natural processes



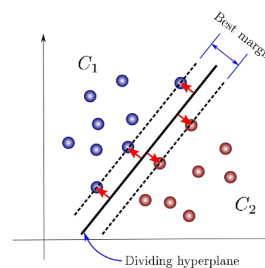
Computational Biology



Algorithmic Finance



Robotics



Machine learning
Big Data



Quantum Computation

Outline

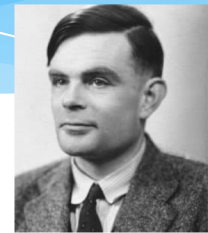
Design and Analysis of Algorithms	Mon 28 Aug	1	Introduction, The Potential Method
	Wed 30 Aug	2	Divide and Conquer 1
	<i>Discussion</i>	1	<i>Review: Proofs, Asymptotic Notation, Induction</i>
	Mon 4 Sep	No class — Labor Day	
	Wed 6 Sep	3	Divide and Conquer 2
	<i>Discussion</i>	2	<i>Divide and Conquer</i>
	Mon 11 Sep	4	Dynamic Programming
	Wed 13 Sep	5	Dynamic Programming 2
	<i>Discussion</i>	3	<i>Dynamic Programming</i>
	Mon 18 Sep	6	Greedy Algorithms
Computability	Wed 20 Sep	7	Formal Languages and Finite Automata
	<i>Discussion</i>	4	<i>Greedy Algorithms and Finite Automata</i>
	Mon 25 Sep	8	Turing Machines and Decidability
	Wed 27 Sep	9	Diagonalization
	<i>Discussion</i>	5	<i>Turing Machines and Diagonalization</i>
	Mon 2 Oct	10	The Acceptance and Halting Problems
	Wed 4 Oct	11	Reducibility
	<i>Discussion</i>	6	<i>Acceptance and Reducibility</i>
	Mon 9 Oct	12	Rice's Theorem & Kolmogorov Complexity
	Wed 11 Oct	13	<i>Midterm Review</i>
Midterm	<i>Discussion</i>	MR	<i>Midterm Review</i>
	Mon 16 Oct	No class — Fall Break	
	Wed 18 Oct	Midterm, 7-9pm ET	
	<i>Discussion</i>	No discussion	

Outline

Complexity	Mon 23 Oct	14	The Classes P and NP
	Wed 25 Oct	15	The Cook-Levin Theorem
	<i>Discussion</i>	7	<i>NP Overview</i>
	Mon 30 Oct	16	Reductions and NP-Completeness
	Wed 1 Nov	17	NP-Complete Problems 2
	<i>Discussion</i>	8	<i>NP-Completeness</i>
	Mon 6 Nov	18	Search and Approximation Algorithms
	Wed 8 Nov	19	Approximation Algorithms 2
	<i>Discussion</i>	9	<i>Search and Approximation</i>
Randomness in Computation	Mon 13 Nov	20	Probability, Randomness in Computation
	Wed 15 Nov	21	Randomness in Computation 2
	<i>Discussion</i>	10	<i>Randomness and Modular Arithmetic Review</i>
	Mon 20 Nov	22	Randomness in Computation 3
Thanksgiving	Wed 22 Nov	23	No Class — Thanksgiving Break
	<i>Discussion</i>	11	No Class — Thanksgiving Break
Cryptography	Mon 27 Nov	24	One-time Pad, Diffie-Hellman, and Discrete Logarithm
	Wed 29 Nov	25	RSA and Factoring
	<i>Discussion</i>	12	<i>Intro to Cryptography</i>
Special Topics	Mon 4 Dec	26	Special Topics (Untested Material)
	Wed 6 Dec	27	Special Topics (Untested Material)
Final Exam			
	Tue 12 Dec		Final Exam, 7–9pm

Computability

Turing(1936): Formal model of computer (Turing machine)



Computability: (1930's-60's)

What can/cannot be done (in finite time)?

E.g. Can one write a program that tests if two given programs in C/C++ have the same functionality? Answer: **No**

Will see: Various other basic problems are “uncomputable”

Complexity

- * **Computability**: what can/cannot be computed (in finite time)?
- * **Finite time** is not good enough; we need to solve fast!
- * Example 1: **Sorting n numbers**
 - * Naïve algorithm: *try all $n!$ permutations.*
 - * Any better solutions?
- * Example 2: **Travelling salesperson problem.**
 - * Find shortest tour that visits all n cities
 - * Naïve algorithm: *try all $n!$ permutations.*
- * Is there a **polynomial-time algorithm**? ($O(n^2)$, $O(n^3)$, ...)



Complexity

10

1971-72: **Efficient computation** (polynomial time)
notion of P vs NP (STOC'71)



Cook



Levin



Karp

No **efficient** algorithm for TSP unless $P=NP$

One of the biggest questions of our time (is $P=NP$?) **Million dollar** prize

We will explore P vs NP in detail later.

Approximation Algorithms

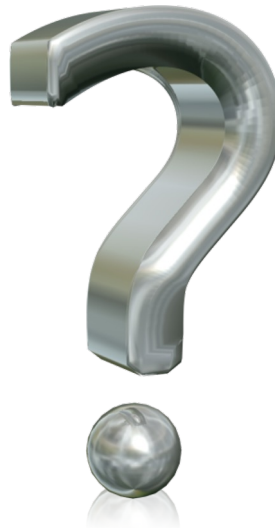
Most problems turn out to be NP-hard (no efficient way to solve exactly)

But can try to solve approximately (99% solution may be good enough)



Hardness is Bad, Right?

- * **Question:** Suppose you know that a certain problem is notoriously “hard”. Is it necessarily a bad thing?



Cryptography



Can do miraculous things (modern magic)

Each time you browse: you are sending data over many public networks

Public key cryptography: Can send a secret message to another person, without arranging a code in advance

Digital signatures

...

Administration

- * **Website:** eecs376.org (Syllabus, Schedule)
- * **Text:** <https://eecs376.github.io/notes/> (encouraged to read)
- * **Canvas:** HWs, lecture slides, discussion material, OHs, etc..
- * **Piazza:** questions about homework, lectures; search for teammates
- * **Gradescope:** for exams and HW submission
- * *You may attend any lecture/discussion*
- * **Discussion:** highly encouraged to attend
- * **Note:** **No** lecture recordings
(recordings discourage active learning)

Administration

- * 12 weekly HW assignments, due Wednesdays 8pm (Eastern)
 - * **No Late Submissions after 9:59pm!**
 - * However, **two lowest scores** will be dropped
 - * Solutions published shortly after the deadline
 - * HW = 40% of grade
- * **Midterm:** October 18, 2023, 7-9pm. 29% of grade.
- * **Final:** December 12, 2023, 7-9pm. 30% of grade.
- * **Course Evaluation.** 1% of grade.
- * Participation is important!
 - * Questions are welcome!
 - * There is no such thing as a “bad question”.

Is this an EECS class?

- * **Question to the Instructor:** Wolverine Access says it is an EECS class. Yet why does it feel like a math class?
- * **Answer:** It is both. The only way to answer the questions we raised (and others) is to construct a **computational model** and apply a “proof-based” (*mathematical*) methodology.

Is this an EECS class?

- * **Example:** Show that there is no compiler that tests if two given programs in C/C++ have the same functionality.
- * **Wrong Approach:** Try all the compilers... (infinitely many)
- * **Right Answer:** Construct a *computational model* that captures all the compilers and give a “general impossibility argument”.

Next 3.5 weeks: Design & Analysis of Algorithms

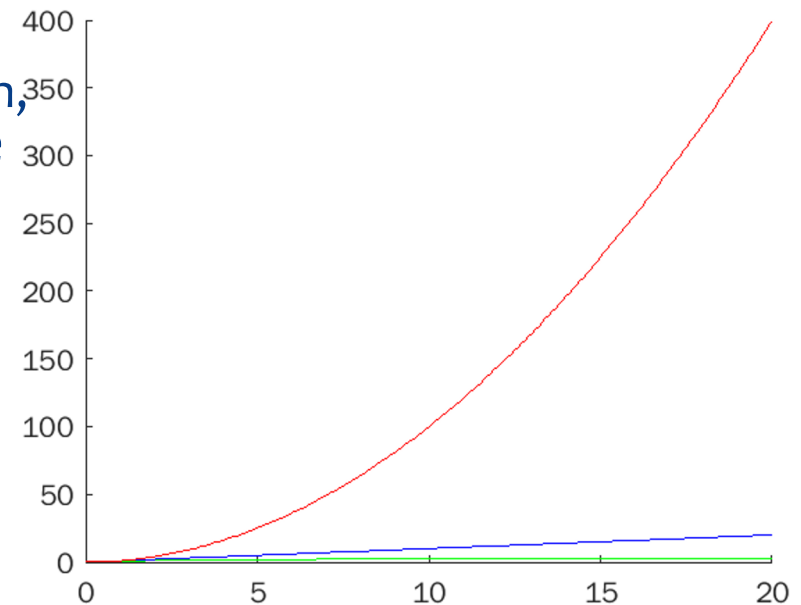
- * **Algorithm Design:** A set of methods to create algorithms for certain types of problems.
- * **Examples:** Dynamic Programming, Divide and Conquer, Greedy Algorithms
- * **Algorithm Analysis:** Methods to prove **correctness** of algorithms and determine the amount of **resources** (e.g. time, memory) necessary to execute them.
- * **Examples:** Potential function arguments, recurrences, Master Theorem, exchange arguments
- * **Remark:** We describe algorithms in “Pseudo-Code” (human readable)

Greatest Common Divisor

- * **Definition:** Let $x, y \in \mathbb{N}$ (natural numbers). The Greatest Common Divisor (gcd) of x and y is the largest $z \in \mathbb{N}$ that divides x and y .
 - * If $\text{gcd}(x, y) = 1$ then x and y are called **coprime**.
- * **Examples:** $\text{gcd}(21, 9) = ?$ $\text{gcd}(121, 5) = ?$
- * $\text{gcd}(343473598722323, 432029908279) = ?$
 - * (gcd is a basic building block for cryptographic algorithms, typically > 100 digits)
- * **Naïve Algorithm:**
 - * For z from y down to 1:
 - * If $((z|y) \wedge (z|x))$, return z .
- * **Runtime:** $O(y)$ operations. Is that good or bad?

Review: Running Time

- * We measure the “efficiency” of an algorithm by how its **worst case** runtime scales with the input size.
- * We express this trade-off in asymptotic notation, e.g. $O(\log n)$, $O(n)$, $O(n^2)$, etc., where n is the size of the input.
- * Common interpretations of “size”
 - * Size of an array: #array cells
 - * Size of a graph: #vertices + #edges
 - * Size of an integer: #digits.
- * Rule of thumb: \approx # bits needed to represent input on a computer.



Efficient \equiv “runtime is polynomial in size of input”

Step 2: Analyze runtime of the naïve solution

- * Q: Suppose x and y each have n digits.
How large can y be?
 - * $10^n - 1$
- * Note: the “size” of y is $\log y$.
- * The runtime of the naïve algorithm is $O(y)$, which is **exponential** in the size of the input: $n = \log y$. (This is not efficient!)

```
NaiveGCD( $x, y$ )  
For  $z = y, y - 1, \dots, 1$   
  If  $(z|x) \wedge (z|y)$  then  
    Return( $z$ )
```

Step 3: Think about the “structure” of the problem.

- * **Strategy:** Recursively solve the problem, by reducing to *smaller* numbers.
- * Suppose $x \geq y$. Observe: $\gcd(x, y) = \gcd(y, x - y)$.

Proof: If d divides both x and y , d also divides $x - y$.

Conversely, any d that divides both $x - y$ and y also divides x .

So the common divisors of x, y are exactly the common divisors of $y, x - y$

Hence, their **greatest** common divisors are equal

How far can we reduce?

- * In general, we can reduce k times until $x - ky < y$.
- * Q: What is $x - ky$?
 - * $x \bmod y$ = the remainder of x divided by y .
- * Theorem: $\gcd(x, y) = \gcd(y, x \bmod y)$

Step 4: Code it up

- * We have just discovered the **Euclidean Algorithm** to compute the **greatest common divisor** of two integers

```
Euclid(x, y): // for  $x \geq y > 0$   
if  $x \bmod y = 0$ : return y  
return Euclid(y,  $x \bmod y$ )
```

Let's do some examples:

$\text{gcd}(21, 9)$,

$\text{gcd}(13, 8)$

$\text{gcd}(42273, 9516)$

[Calculator](#)



Euclid, 300
BCE

Seems fast

Calculator

42273, 9516
-> 9516, 4209
-> 4209, 1098
-> 1098, 915
-> 915, 183
-> 183, 0 (gcd = 183)





```
Euclid( $x, y$ ): // for  $x \geq y > 0$   
if( $x \bmod y = 0$ ), return  $y$ .  
else return Euclid( $y, x \bmod y$ )
```



Euclid, 300
BCE

- * “How can be bound the runtime of Euclid?”
- * We need some tools...

Example: A Flipping Game

- * 3 x 3 board covered with two-sided chips:  
- * Two players, R and C, alternately perform “flips”
 - * R-flip (C-flip): flip a row (col) with #  > # 
- * If no flip is possible, then the game ends.
- * **Q:** Does the game always end?



R-flip (3)



C-flip (1)



Analysis Tool: Potential Function Argument



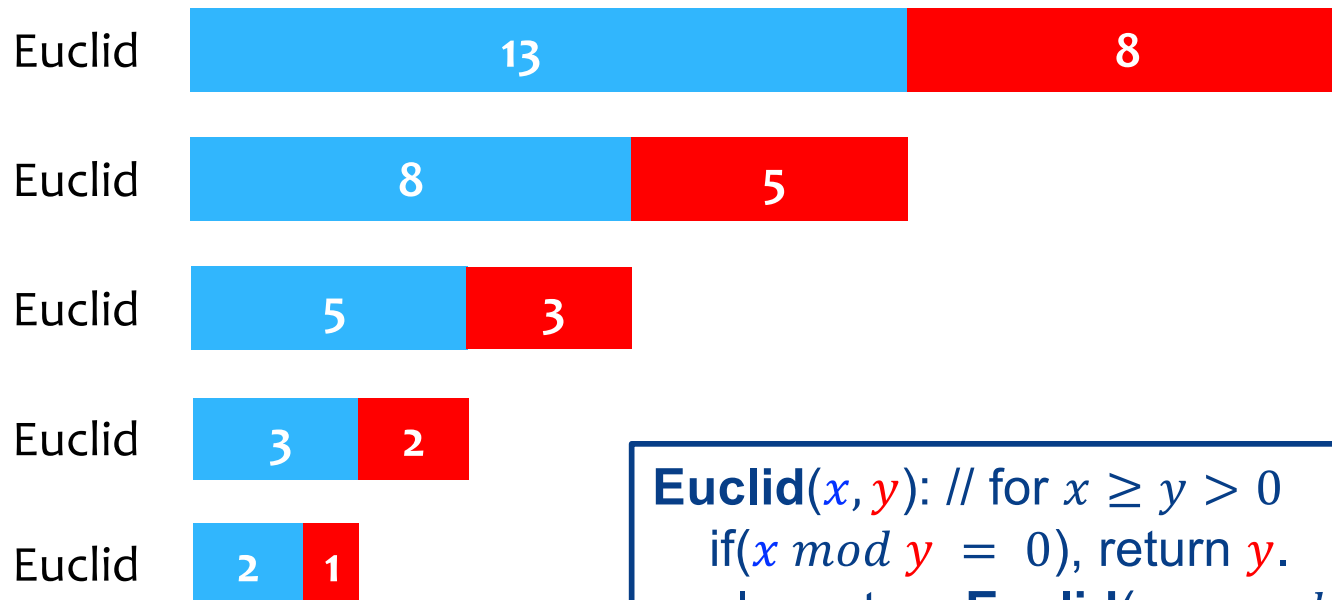
- * Intuitively, a **potential function argument** says that:
- * If I start with a **finite** amount of water in a **leaky bucket**, then eventually water stops leaking out.
- * 3 main ingredients of the argument:
 - * Discrete units of *time* $t = 0, 1, 2, 3, \dots$ (Loop iteration, recursion depth, etc.)
 - * Measure how much water is in the bucket. Map to an integer $s_t \geq 0$.
 - * How is the bucket leaking? Show $s_{t+1} < s_t$.

Example: A Flipping Game (As a Potential Function Argument)

- * Let $s_t \geq 0$ be the number of Ohio chips after t flips.
 - * Unit of time: 1 flip
 - * Amount of water in the bucket: $s_t = \#$ Ohio chips.
 - * **Claim:** Each flip decreases the number of Ohio chips, i.e., $s_{t+1} < s_t$.
- * The game must end! There are no infinitely decreasing integer sequences $s_0 > s_1 > s_2 > \dots > 0$.

Back to Euclid: Idea of analysis

- * We will show that, in each recursive call to Euclid, the x, y arguments are **collectively** decreasing very quickly.



```

Euclid( $x, y$ ): // for  $x \geq y > 0$ 
    if( $x \bmod y = 0$ ), return  $y$ .
    else return Euclid( $y, x \bmod y$ )
  
```

A good potential function

- * The **sum** of the arguments to **Euclid** decreases quite rapidly.

```
Euclid( $x, y$ ): // for  $x \geq y > 0$   
    if( $x \bmod y = 0$ ), return  $y$ .  
    else return Euclid( $y, x \bmod y$ )
```

- * **Example:** $\text{Euclid}(13,8) \rightarrow \text{Euclid}(8,5) \rightarrow \text{Euclid}(5,3) \rightarrow \text{Euclid}(3,2) \rightarrow \text{Euclid}(2,1) = 1$
- * Define x_t, y_t to be the arguments to the t th call to **Euclid**, where $x_t \geq y_t$.
- * Define the **potential** to be $s_t = x_t + y_t$.
- * **Claim.** $s_{t+1} < \frac{2}{3}s_t$.

A good potential function

Euclid(x, y): // for $x \geq y > 0$
 if($x \bmod y = 0$), return y .
 else return **Euclid**($y, x \bmod y$)

* **Claim.** $s_{t+1} < \frac{2}{3}s_t$.

* Proof. Write $x_t = k_t y_t + r_t$, where $k_t \geq 1, r_t < y_t$

* What is $x_{t+1} = ?$ y_t

* What is $y_{t+1} = ?$ r_t

* $s_t = x_t + y_t = k_t y_t + r_t + y_t \geq 2y_t + r_t$

*
$$> 2y_t + r_t - \frac{y_t - r_t}{2} = \frac{3}{2}(y_t + r_t) = \frac{3}{2}s_{t+1}.$$

A good potential function

```
Euclid( $x, y$ ): // for  $x \geq y > 0$   
if( $x \bmod y = 0$ ), return  $y$ .  
else return Euclid( $y, x \bmod y$ )
```

- * **Claim.** $s_{t+1} < \frac{2}{3}s_t$.
- * Thus, if there are t calls to **Euclid**, $2 \leq s_t < \left(\frac{2}{3}\right)^t (x + y)$
- * Which implies that $t < \log_{3/2}((x + y)/2)$
- * I.e., $t = O(n)$, where $n = \log x + \log y$ is the size of the input.

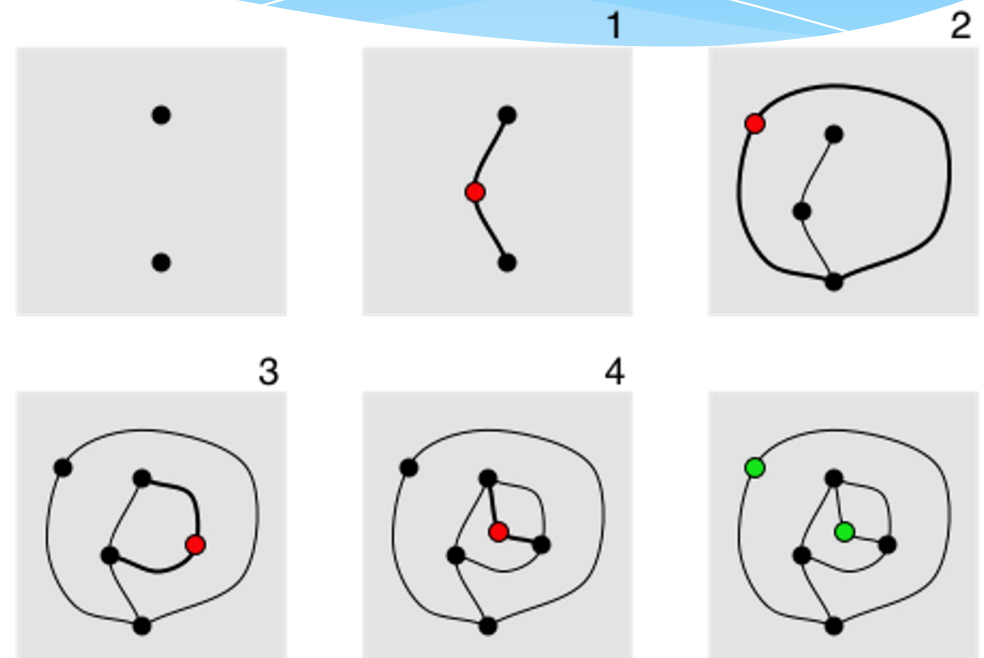
Sprouts Game

There are n points initially.

Each step: Connect any two points by a line (or curve) and introduce a **new point** on the line.

Rule: Each point can have **at most 3** lines attached to it
(i.e. degree of point at most 3)

Given n points, can the game continue **forever**? If not, how many steps to terminate?



Sprouts

Let's do a couple of more examples.

What's a good potential? (something that decreases over time)

Hint: Consider modified game where we add two new points on the line.
Can this go on forever?
Can this tell us something about our original game?

Potential Function: Sprouts

At time t , let us call the deficit of a point p as
 $3 - \text{\# of lines attached to } p$

Note: By rules of the game, the deficit of each point at any time is ≥ 0 .

Consider potential $s_t = \text{sum of deficits of all points at time } t$.
 Initially: $s_0 = 3n$

Claim: For each time step $t \geq 1$, we have $s_t = s_{t-1} - 1$

Proof: Let us see what happens at time t .

- (i) adding the new line decreases deficit by 1 for each of its two end points.
- (ii) the new added point has deficit $3 - 2 = 1$ (the new point has two attachments)

So overall change in potential $s_t - s_{t-1} = -2 + 1 = -1$.

Theorem: The game stops after at most $3n - 1$ steps.

Proof: Initial potential $s_0 = 3n$.

Game must stop when deficit reaches 1 (as no two points available to connect)