

# COMP 761: Lecture 5 – Invariants and Monovariants

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September 14, 2020

# Problem

Given  $n$  red points and  $n$  blue points in the plane, show that we can draw  $n$  non-intersecting line segments, each having one red endpoint and one blue endpoint.

*(Please don't post your ideas in the chat just yet, we'll discuss the problem soon in class.)*

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- Office hours - right after class! (stay in the Zoom room)

## Problem 1

The numbers  $1, 2, \dots, 100$  are written on a blackboard. You may choose any two numbers  $a$  and  $b$  and erase them, replacing them with the single number  $a + b$ . After 99 steps, only a single number will be left. What are the possibilities for that number?

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- In general?

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- We are replacing two numbers by their sum. What happens if we do this operation twice?
- We get the sum of three numbers.
- In general?
- No matter the order in which we combine the numbers, we will eventually be left with the sum of all of them.

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When is this useful?

- Working out what the final state must be, based on the value of the invariant.
- Showing some final states are *impossible* because the invariant has a different value.

# Proof of Problem 1

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$$1 + 2 + \cdots + 100 = \frac{100(101)}{2} = 5050.$$



## Problem 1b

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- Sum of the numbers + number of steps already taken

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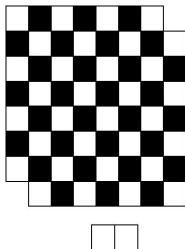
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$$S = 1 + 2 + \cdots + 100 = \frac{100(101)}{2} = 5050.$$

Hence, after 99 operations, we must have  $5050 = S + N = S + 99$ , and therefore  $S = 4951$ . As only one number is left, this number must equal 4951. ■

## Problem 2

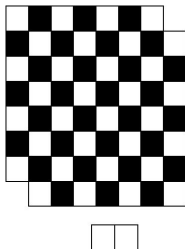
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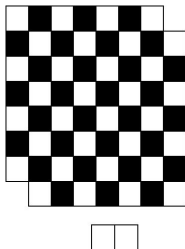
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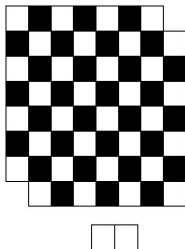
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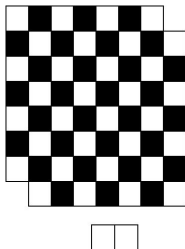
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- But there are 30 black and 32 white squares, so this is impossible.

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You are given a  $100 \times 100$  array of lights. You can flip all the lights in any row or column, so that any lights that were off get turned on, and vice versa. Initially, one light in the grid is on. Can you flip the rows and columns in such a way that all the lights are turned on?

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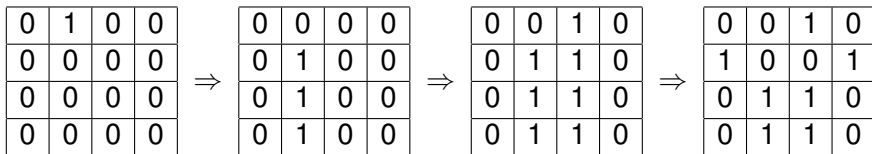
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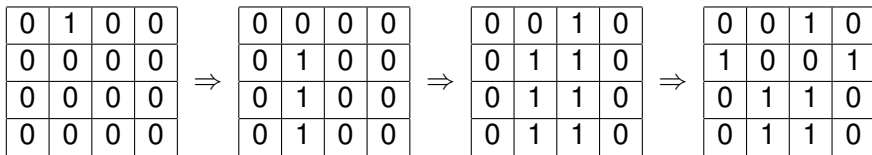
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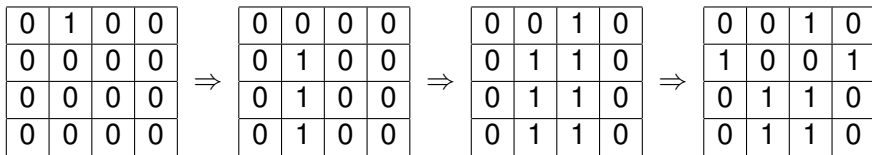


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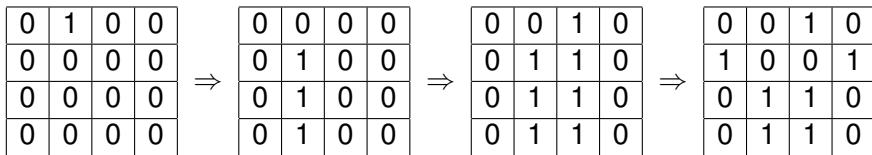


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- Is this always true? If so, why?

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- But  $100^2$  is even, so we can't get all the lights on.

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- Yes! Since they have at most 3 total enemies, they now have at most 1 enemy in their house.
- Let's keep on doing this. Do we ever finish, or can it cycle?
- It has to finish, since the total number of enemies within houses is going down each time.

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**Note:** Be careful that your monovariant goes strictly up/down rather than staying the same sometimes. Or if it does, prove that it will eventually go up/down after enough moves.

# Proof of Problem 4

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We will describe an algorithm for separating into two houses, so that each member has at most one enemy in their house. Start by initializing the houses randomly. Let  $E_1$  be the number of pairs of enemies in house 1, and  $E_2$  similarly for house 2.

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Since  $E_1 + E_2$  cannot decrease beyond 0, we conclude that the process must stop. Since no more moves can be made, every member must have at most 1 enemy in their house. ■

## Problem 5

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- If  $C_n = C_1$ , then  $C_1C_{n-1} > C_2C_1$ , which means she wouldn't have gone to  $C_2$  on the first move!

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- (This is clearer with an example)

## Reminder of Problem 4

In the parliament of Freedonia, certain pairs of members are enemies with each other. Each member has a maximum of 3 enemies. Prove that the house can be separated into 2 houses, so that each member has at most 1 enemy in their own house.

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Hence,  $E_1 + E_2$  decreases by at least 1, which is a contradiction since we supposed it was minimal. We conclude that every member has at most 1 enemy in their house. ■

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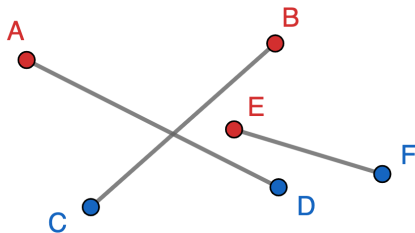
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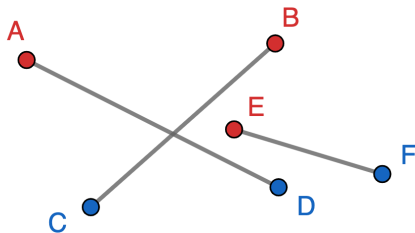
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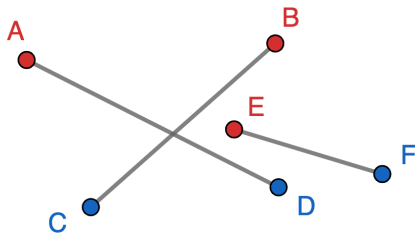


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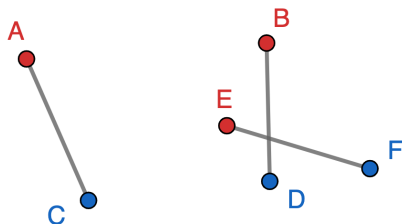


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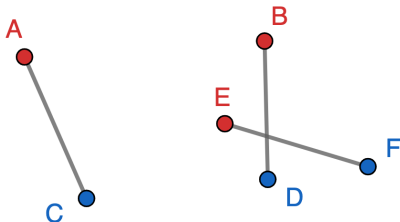


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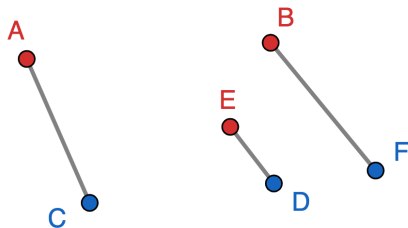


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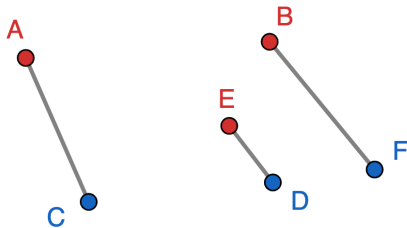


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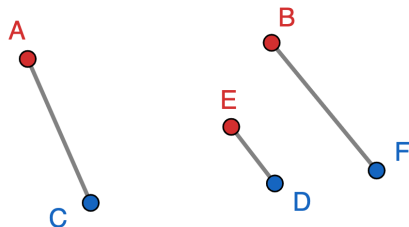
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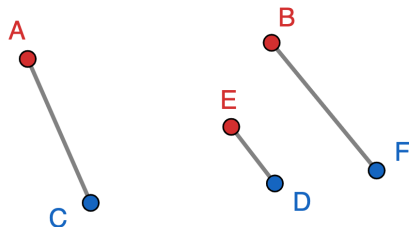


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- Yes! The sum of the lengths of segments is going down each time.

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Consider the matching between the red and blue points such that the total length of segments is minimized. We will show that no crossings can occur. Suppose towards contradiction that some segments  $AD$  and  $BC$  cross, where  $A, B$  are red and  $C, D$  are blue.

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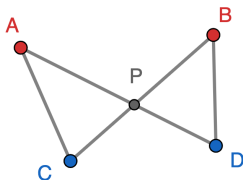
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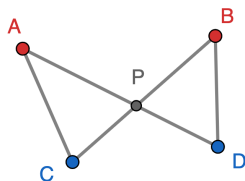
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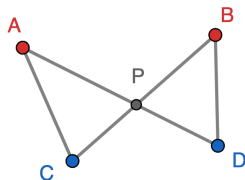
The Triangle Inequality states that in a triangle, the sum of the lengths of two of the sides must be more than the length of the third. Therefore:

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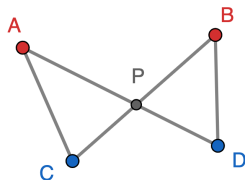
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Since we assumed the matching had minimal total length of segments, we have a contradiction, and conclude there are no intersections. ■



Next time!

## Polynomials and algebra

## Bonus problem

Consider a rectangular array with  $m$  rows and  $n$  columns whose entries are real numbers. It is permissible to reverse the signs of all the numbers in any row or column. Prove that after a number of these operations we can make the sum of numbers along each line (row or column) nonnegative.