

EXAMPLE

- $S = \{i \mid i \in \mathbb{N} \text{ and } 0 \leq i \leq 15\}$
- $\forall i \in S, f(i) = \text{NUMBER OF 1s IN THE BINARY REPR. } i$
- MAXIMIZATION

NEIGHBORHOOD :

$$\forall i, j \in S, j \in N(i) \Leftrightarrow |i - j| = 1$$

ASSUME :

$i = 5$ (RANDOM EVENT)

$$\text{bin}(5) = \underline{101}$$

$$f(i) = 2$$

$$N(i) = \{4, 6\}$$

$$\text{bin}(4) = 100$$

$$\text{bin}(6) = \underline{\underline{110}}$$

$$f(j) = \underline{\underline{2}}$$

$$i := j$$

$$\left. \begin{array}{l} \text{bin}(4) = 100 \\ \text{bin}(6) = \underline{\underline{110}} \end{array} \right\} j = 6$$

$$i = 6$$

$$N(i) = \{5, 7\}$$

$$\left. \begin{array}{l} \text{bin}(5) = 101, f(5) = 2 \\ \text{bin}(7) = 111, f(7) = \underline{\underline{3}} \end{array} \right\} j = 7$$

$$i := j$$

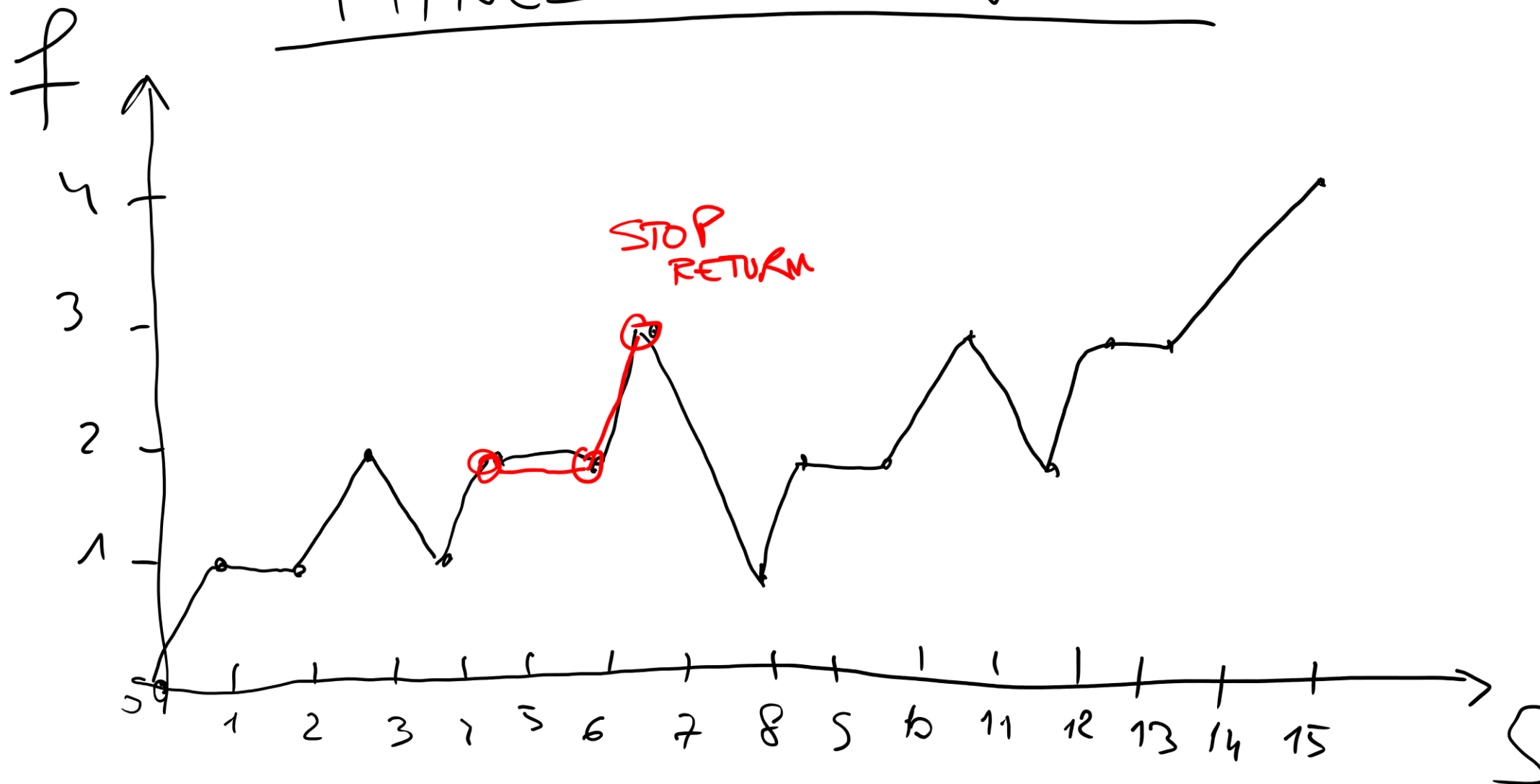
$$i = 7$$

$$N(i) = \{6, 8\}$$

$$f(6) = 2$$

$$\left. \begin{array}{l} f(6) = 2 \\ \text{bin}(8) = 1000, f(8) = 1 \end{array} \right\} j = 6$$

FITNESS LANDSCAPE



FITNESS LANDSCAPES (F.L.)

GIVE A VISUAL RENDERING OF THE HARDNESS OF A PROBLEM.

- "SMOOTH" LANDSCAPE WITH ONLY ONE HILL
(EASY PROBLEM)
- "RUGGED" LANDSCAPE
(HARD PROBLEM)

F.L. IN GENERAL CANNOT BE DRAWN, BECAUSE

- S IS HUGE
- N IS MULTI-DIMENSIONAL

EXAMPLE

$$S = \{i \mid i \in \mathbb{N} \text{ and } 0 \leq i \leq 15\}$$

$\forall i, f(i) = \text{NUMB. OF 1s OF THE BINARY CODE OF } i$

MAXIMIZATION

NEIGHBORHOOD:

$\forall i, j \in S \quad j \in N(i) \iff \text{THE BINARY CODES OF } i \text{ AND } j \text{ DIFFER BY ONLY 1 BIT}$

$\begin{matrix} 0100 \\ 0101 \end{matrix} \} \text{Neighbors}$

$\begin{matrix} 0100 \\ 0111 \end{matrix} \} \text{NOT Neighbors}$

F.L. UNIMODAL

EVERY
SOLUTION THAT IS NOT A GLOBAL OPTIMUM
HAS AT LEAST ONE 0 IN ITS BINARY CODE

IF WE CHANGE THAT 0 INTO A 1, WE OBTAIN A SOLUTION
THAT IS :

- A NEIGHBOR OF THE PREVIOUS ONE
- BETTER THAN THE PREVIOUS ONE

→ ~~FOR~~ EVERY SOLUTION DIFFERENT FROM GLOB. OPT.
↳ HAS AT LEAST ONE BETTER NEIGHBOR

EXAMPLE

$$S = \{i \mid i \in \mathbb{N} \text{ and } 0 \leq i \leq 15\}$$

$$\forall i \in S, f(i) = i^2$$

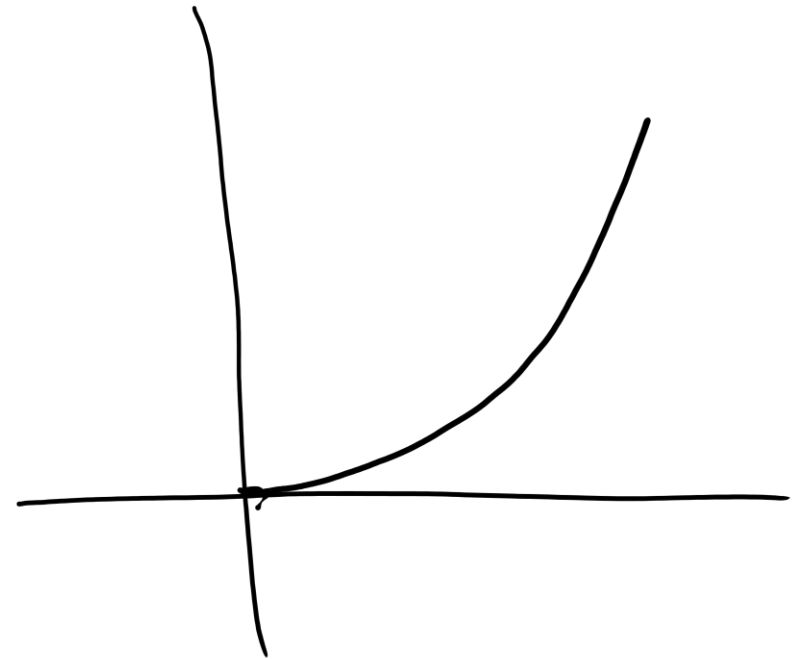
MAXIMIZE.

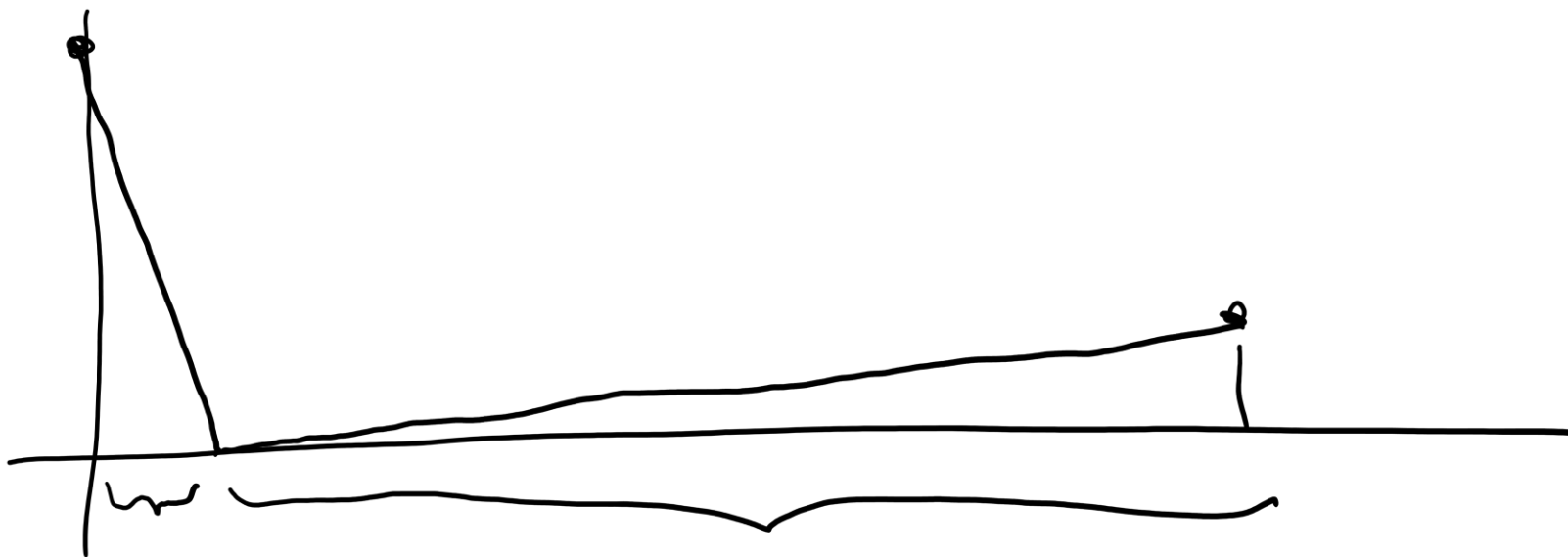
NEIGHBORHOOD:

$$\forall i, j \in S, j \in N(i) \iff |i - j| = 1$$

F.L.

UNIMODAL !





MAXIMIZATION

DECEPTIVE PROBLEMS

RANDOM SEARCH IS
THE BEST OPTION !

PROS AND CONS OF H.C.

PROS

- EASY TO IMPLEMENT, ...
- FAST
- FLEXIBLE

CON

- IT ALWAYS STOPS ON LOCAL OPTIMA

HOW TO IMPROVE
H.C. ?

- ITERATED H.C. ↓
- BETTER / LARGER NEIGHBORHOOD ↓
- MEMORY
(TABU SEARCH)

SIMULATED ANNEALING

EXTENDS H.C. WITH THE POSSIBILITY OF
WORSENING THE FITNESS OF THE CURRENT SOLUTION
("GO DOWNHILL")

INSPIRED BY ANNEALING
IS A CHEMISTRY EXPERIMENT
AIMED AT FINDING THE STATE OF
A MATERIAL THAT IS SOLID
WITH THE MIN. LEVEL OF ENERGY

