Algorithms

Lecture Topic: Online Algorithms (Part 1)

Roadmap of this lecture:

- 1. Define "Online Algorithm".
- 2. Understand "Online Algorithm" by solving the "Elevator-or-Stairs Problem".
 - 2.1 Define the "Elevator-or-Stairs Problem".
 - 2.2 Competitive ratios of two intuitive algorithms.
 - 2.3 A better online algorithm with competitive ratio 2.

Online Algorithm: The algorithm receives the input progressively over time.

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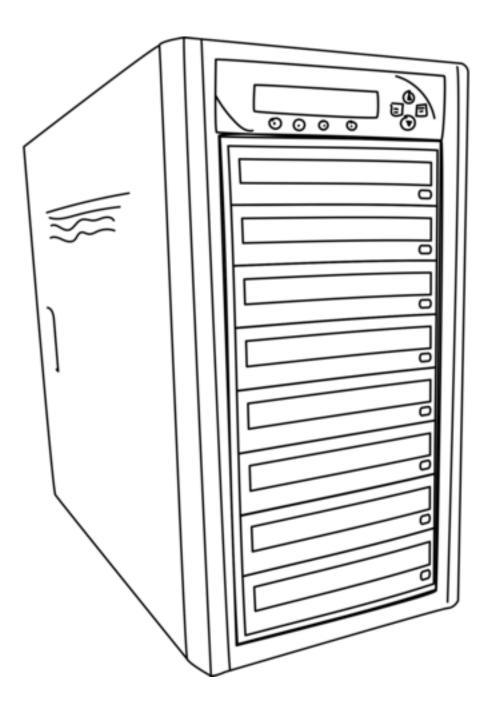
Example: Stock trading



Online Algorithm: The algorithm receives the input progressively over time.

Example: Stock trading

A computer scheduling arriving jobs

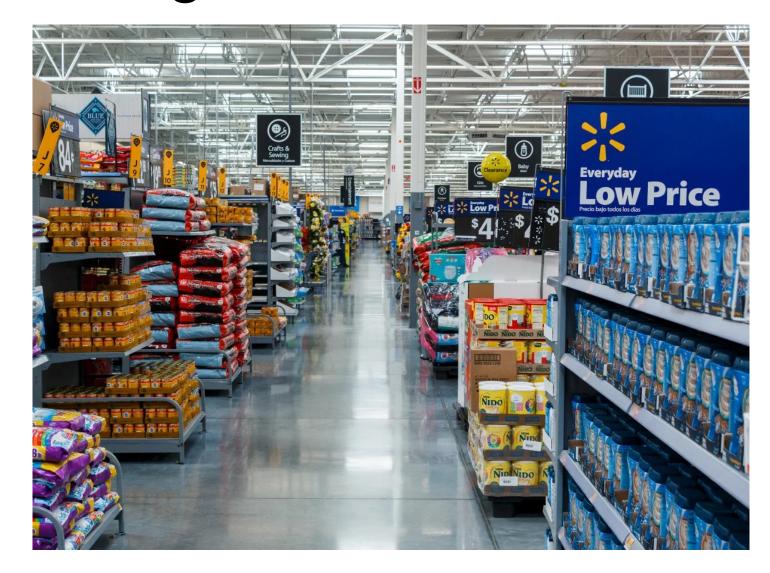


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Example: Stock trading

A computer scheduling arriving jobs

A store deciding when to order more inventory



Online Algorithm: The algorithm receives the input progressively over time.

Example: Stock trading

A computer scheduling arriving jobs

A store deciding when to order more inventory

A taxi driver deciding if to pick up a fare



Goal: The online algorithm's performance is always close to the optimal solution's.

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Consider an optimization problem.

Let C^* be the cost of an optimal solution.

Let C be the cost of the solution found by our online algorithm.

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maximization

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Consider an optimization problem.

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Let C be the cost of the solution found by our online algorithm.

Then
$$C^* \ge C$$
, $\frac{C^*}{C} \ge 1$.

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Let C^* be the cost of an optimal solution.

Let C be the cost of the solution found by our online algorithm.

(For simplicity, assume cost > 0.)

Then
$$C^* \ge C$$
, $\frac{C^*}{C} \ge 1$.

If $\frac{C}{C} \leq \rho$ for all possible instances, then our algorithm is said to have Competitive Ratio ρ .

Goal: The online algorithm's performance is always close to the optimal solution's.

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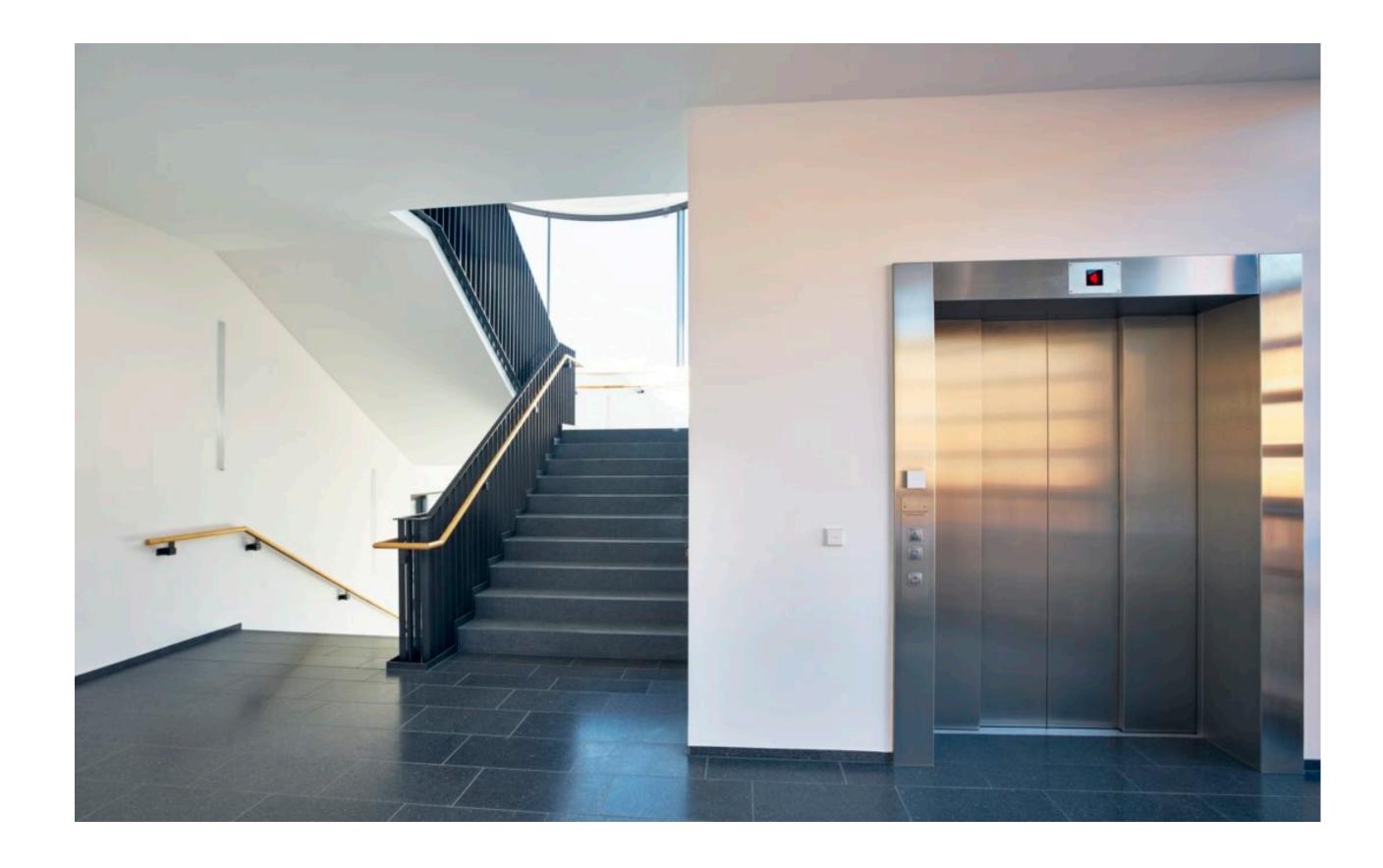
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$$\frac{C}{C^*} \leq \rho$$
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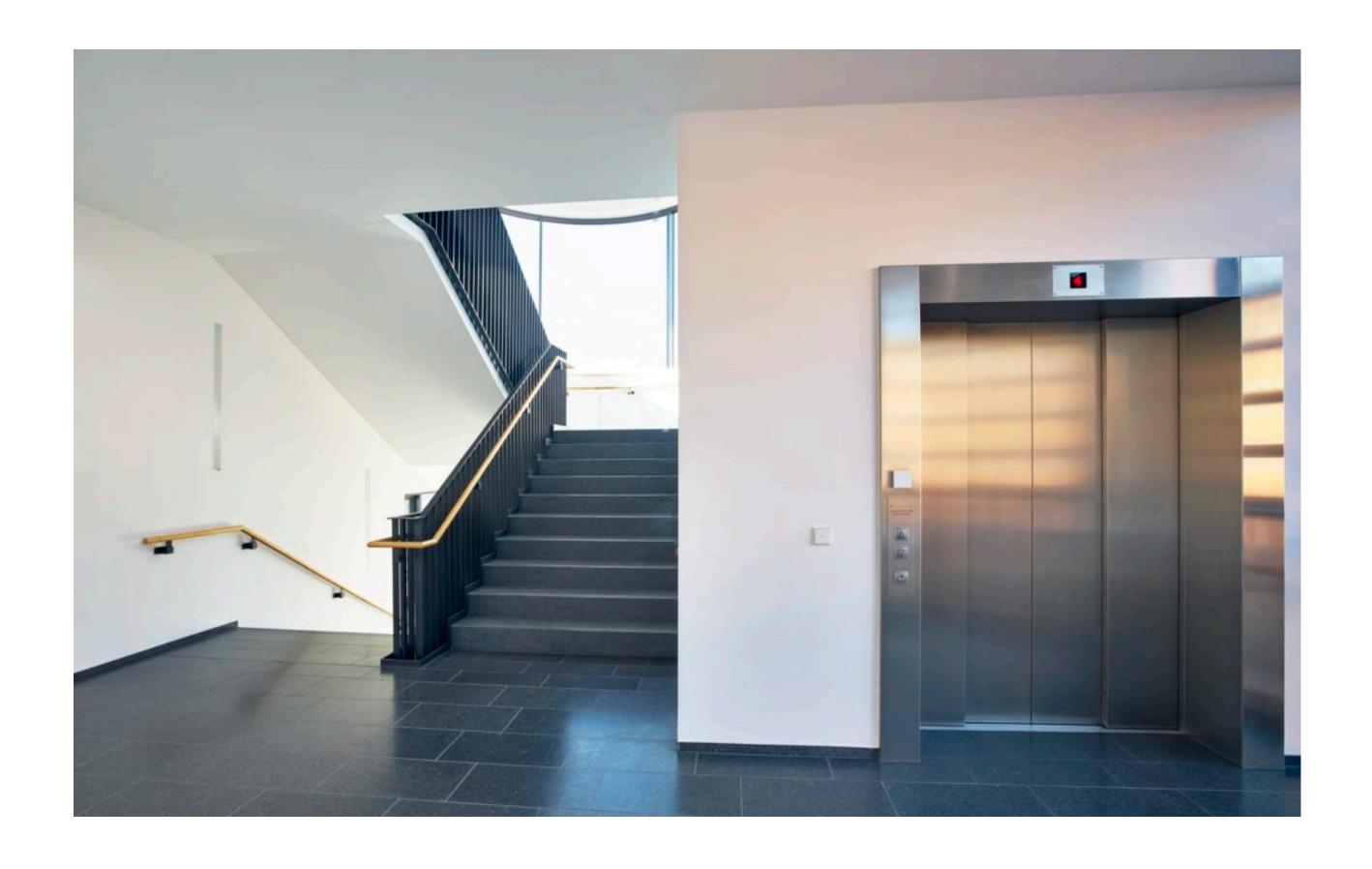
Quiz questions:

- 1. What is the difference between an "online algorithm" and an "offline algorithm"?
- 2. How to measure the performance of an "online algorithm"?

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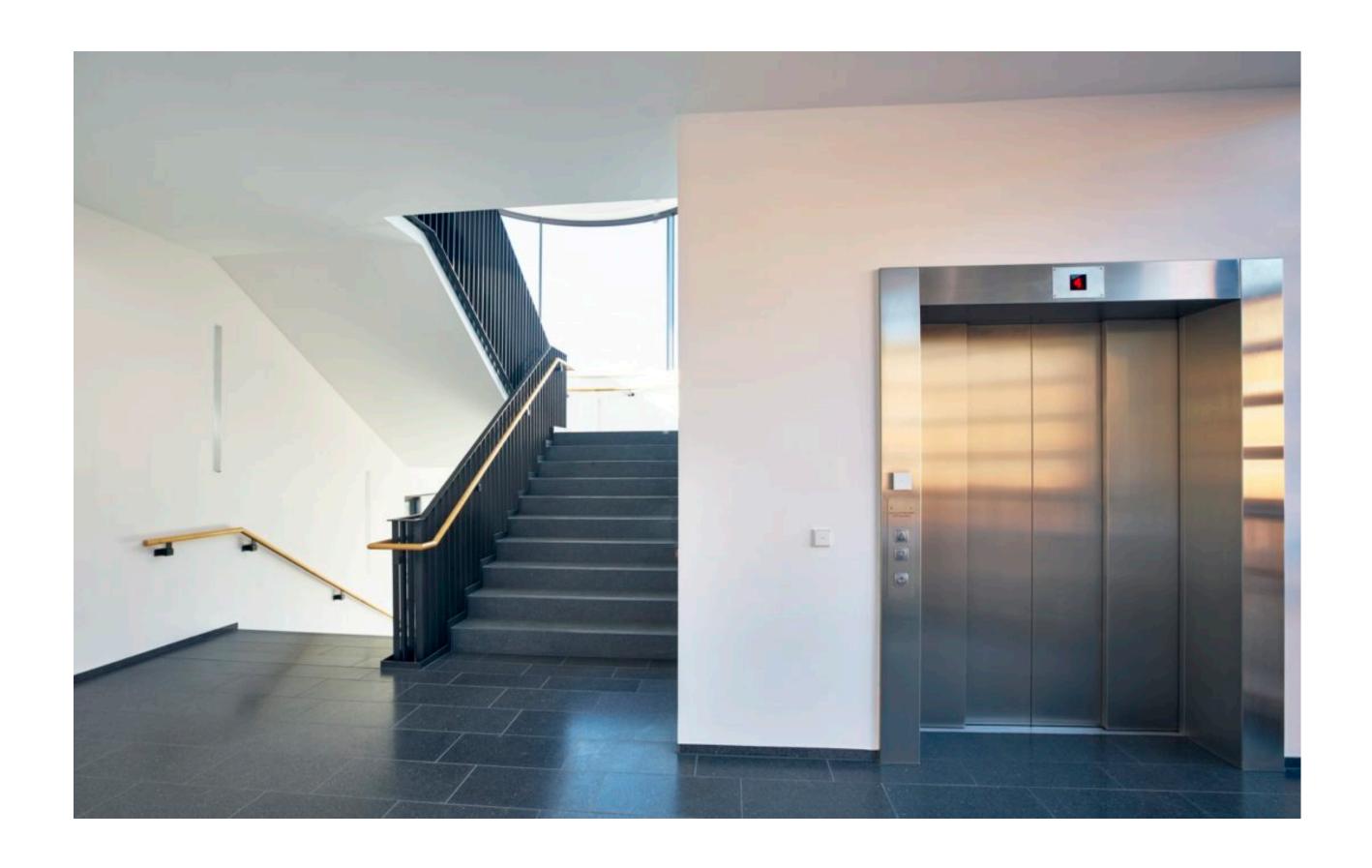
Desitnation: k floors up

Climb stairs: 1 floor/minute

Elevator: k floors/minute

When elevator will arrive: unknown

Goal: minimize time to reach k-th floor



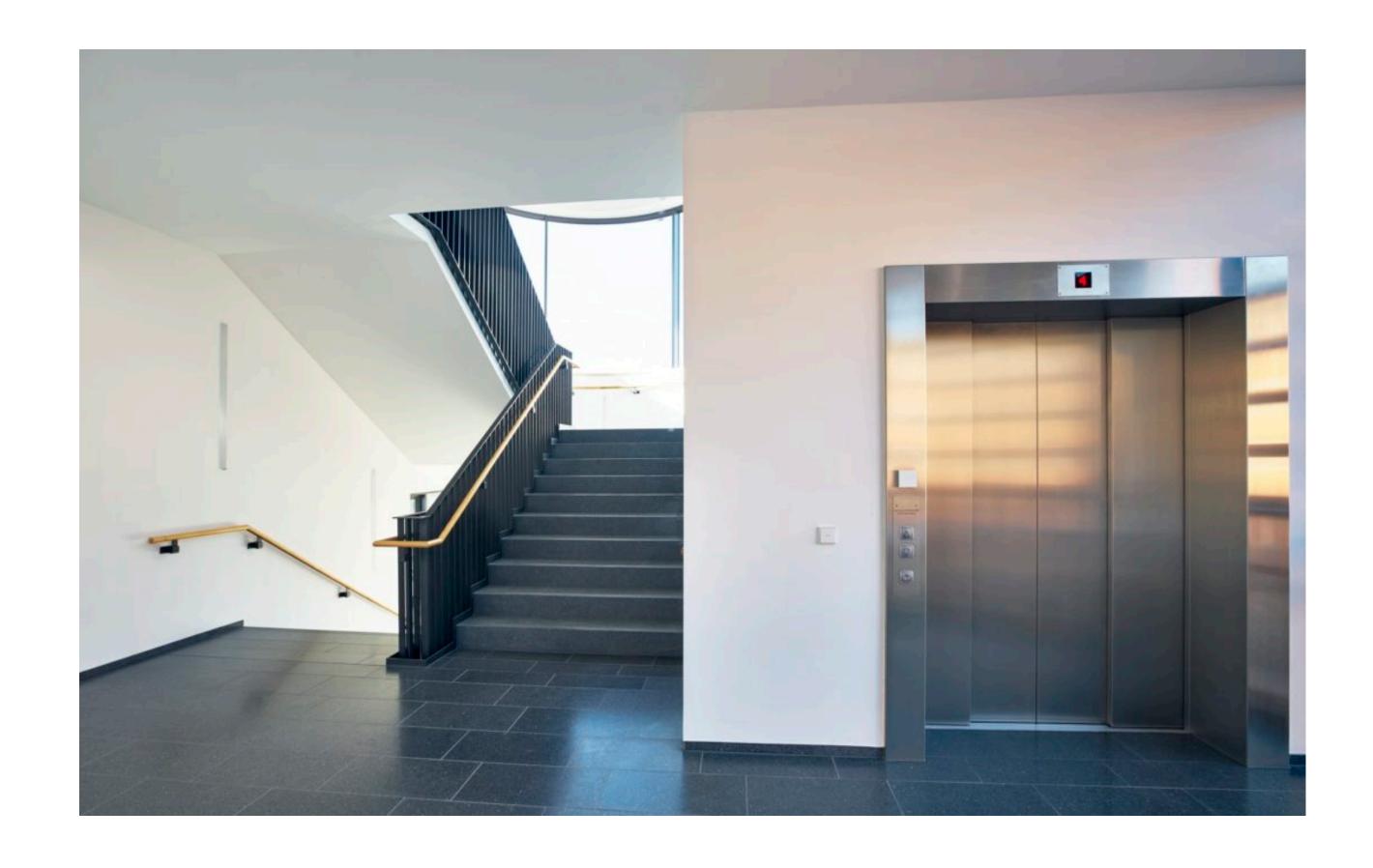
Desitnation: k floors up

Climb stairs: 1 floor/minute

Elevator: k floors/minute

When elevator will arrive:

in at most B-1 minutes, with $B\gg k$



Desitnation: k floors up

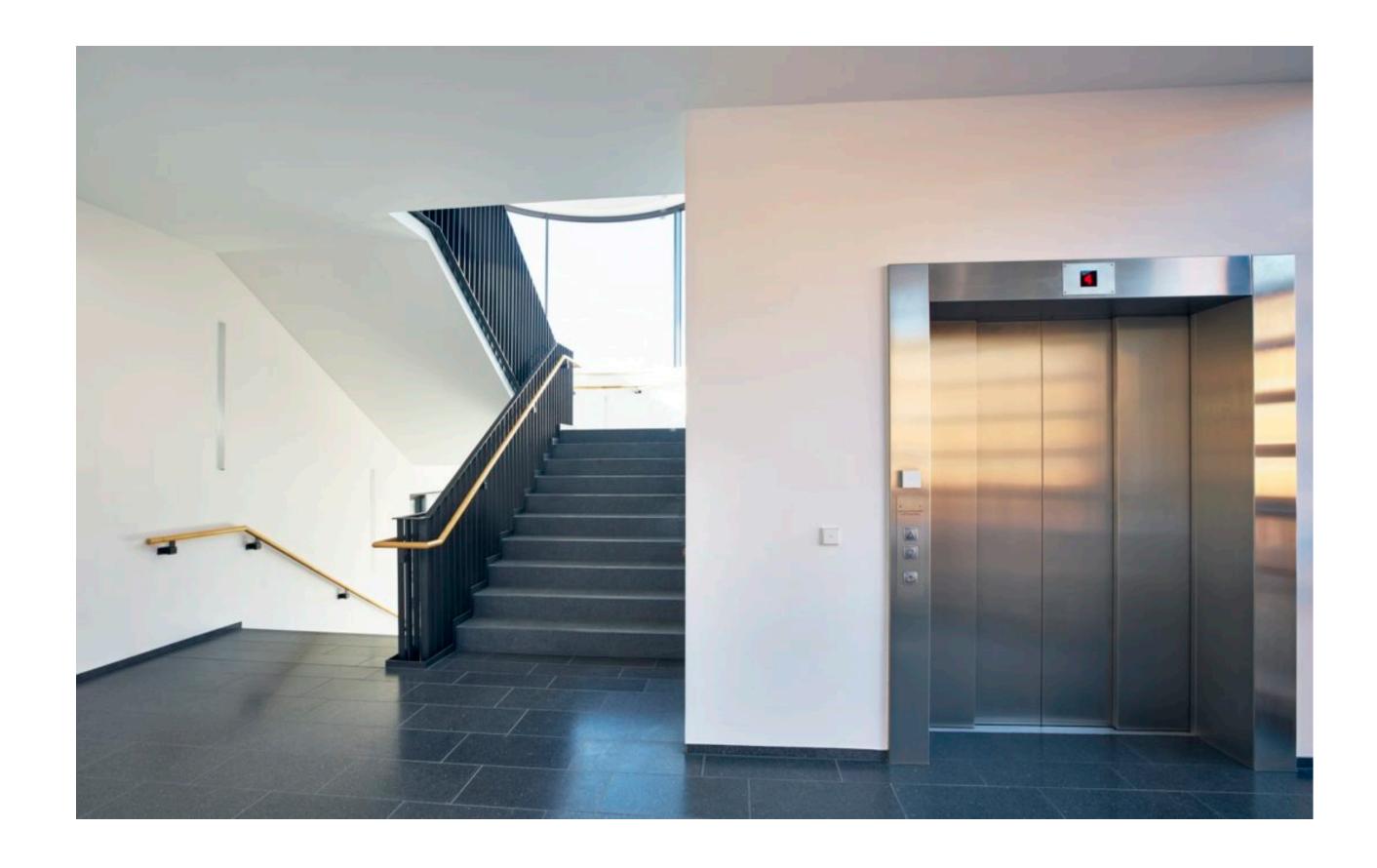
Climb stairs: 1 floor/minute

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When elevator will arrive:

in at most B-1 minutes, with $B\gg k$

in an integer number of minutes



Desitnation: k floors up

Climb stairs: 1 floor/minute

Elevator: k floors/minute

When elevator will arrive: in at most B-1 minutes, with $B\gg k$ in an integer number of minutes

Take the stairs: *k* minutes

Take the elevator: between 1 and B minutes

What are their competitive ratios? We need to know the optimal solution (where the whole input is known) first.

Quiz questions:

- 1. Why do we need an "online algorithm" (instead of an "offline algorithm") for the "Elevator-or-Stairs Problem"?
- 2. If we know when the elevator will arrive, how would we design an offline algorithm?

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Climb stairs: 1 floor/minute.

Elevator: k floors/minute.

When elevator will arrive:

in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs.

Method 2: Take the elevator.

Seer: a person who can see the whole input,

including the future.



Input: Desitnation: k floors up.

Climb stairs: 1 floor/minute.

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What's an optimal solution for the seer?

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If the elevator arrives soon, take the elevator.

Otherwise, take the stairs.



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When elevator will arrive:

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If the elevator arrives in at most k-1 minutes, \tilde{C} take the elevator.

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If the elevator arrives in at most k-1 minutes, \mathcal{L} take the elevator.

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Suppose the elevator arrives in m minutes, where $0 \le m \le B - 1$. Let t(m) be the number of minutes the optimal solution takes.

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Elevator: k floors/minute.

When elevator will arrive:

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The elevator will arrive in an integer number of minutes.

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Method 1: Take the stairs.

Method 2: Take the elevator.

Seer: a person who can see the whole input, including the future.

What's an optimal solution for the seer?

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$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Input: Desitnation: k floors up.

Climb stairs: 1 floor/minute.

Elevator: k floors/minute.

When elevator will arrive:

in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs. k minutes

Method 2: Take the elevator.

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

The elevator arrives in m minutes.

$$m = 0 \quad 1 \quad 2 \quad \cdots \quad k-1 \quad k \quad k+1 \quad \cdots \quad B-1$$

Method 1:
$$k$$
 k \cdots k k \cdots k

$$t(m): 1 2 3 \cdots k k \cdots k$$

Input: Desitnation: k floors up.

Climb stairs: 1 floor/minute.

Elevator: k floors/minute.

When elevator will arrive:

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The elevator arrives in *m* minutes.

Input: Desitnation: k floors up. Climb stairs: 1 floor/minute. Elevator: k floors/minute. When elevator will arrive: in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs. k minutes

Method 2: Take the elevator.

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

The elevator arrives in *m* minutes.

$$m=0$$
 1 2 \cdots $k-1$ k $k+1$ \cdots $B-1$

Method 1: k k \cdots k k k \cdots k
 $t(m): 1$ 2 3 \cdots k k k \cdots k

Ratio: $\frac{k}{1}$ $\frac{k}{2}$ $\frac{k}{3}$ \cdots $\frac{k}{k}$ $\frac{k}{k}$ $\frac{k}{k}$ \cdots $\frac{k}{k}$

Competitive Ratio = k

Input: Desitnation: k floors up.

Climb stairs: 1 floor/minute.

Elevator: k floors/minute.

When elevator will arrive:

in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs. *k* minutes

Method 2: Take the elevator.

m+1 minutes

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

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$$= 0 \quad 1 \quad 2 \quad \cdots \quad k-1 \quad k \quad k+1 \quad \cdots \quad B-1$$

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Output: A method to reach the k-th floor as quickly as possible.

Method 1: Take the stairs. *k* minutes

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m+1 minutes

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

The elevator arrives in m minutes.

$$m = 0 \quad 1 \quad 2 \quad \cdots \quad k-1 \quad k \quad k+1 \quad \cdots \quad B-1$$

Method 2: 1 2 3
$$\cdots$$
 k $k+1$ $k+2$ \cdots B

Input: Desitnation: k floors up.

Climb stairs: 1 floor/minute.

Elevator: k floors/minute.

When elevator will arrive:

in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs. *k* minutes

Method 2: Take the elevator.

m+1 minutes

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

The elevator arrives in m minutes.

$$m = 0 \quad 1 \quad 2 \quad \cdots \quad k-1 \quad k \quad k+1 \quad \cdots \quad B-1$$

Method 2: 1 2 3 \cdots k k+1 k+2 \cdots B

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Method 2: 1 2 3
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$$t(m):$$
 1 2 3 \cdots k k \cdots k

Ratio: 1 1 1
$$\cdots$$
 1 $\frac{k+1}{k}$ $\frac{k+2}{k}$ \cdots $\frac{B}{k}$

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The elevator arrives in *m* minutes.

$$m = 0 \quad 1 \quad 2 \quad \cdots \quad k-1 \quad k \quad k+1 \quad \cdots \quad B-1$$

Method 2: 1 2 3 \cdots k k+1 k+2 \cdots B

$$t(m): 1 2 3 \cdots k k \cdots k$$

Ratio: 1 1 1 ...
$$1 \frac{k+1}{1} \frac{k+2}{1} \dots \frac{B}{1}$$

Competitive Ratio =
$$\frac{B}{k}$$

Input: Desitnation: k floors up.

Climb stairs: 1 floor/minute.

Elevator: k floors/minute.

When elevator will arrive:

in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs.

Competitive ratio = k

Method 2: Take the elevator.

Competitive ratio = B/k

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Quiz questions:

- I. How did we find the competitive ratio of the method of "always take the stairs"?
- 2. How did we find the competitive ratio of the method of "always take the elevator"?

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When elevator will arrive:

in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs.

Competitive ratio = k

Method 2: Take the elevator.

Competitive ratio = B/k

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Method 3: Wait for the elevator for a while.

If it still does not arrive, take the stairs.

Input: Desitnation: k floors up. Climb stairs: 1 floor/minute. Elevator: k floors/minute. When elevator will arrive: in at most B-1 minutes, with $B\gg k$. The elevator will arrive in an integer number of minutes.

Output: A method to reach the *k*-th floor as quickly as possible.

Method 1: Take the stairs. Competitive ratio = k

Method 2: Take the elevator. Competitive ratio = B/k

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Method 3: Wait for the elevator for a while.

If it still does not arrive, take the stairs.

Wait for the elevator for k minutes. If it still does not arrive, take the stairs.

Input: Desitnation: k floors up. Climb stairs: 1 floor/minute. Elevator: k floors/minute. When elevator will arrive: in at most B-1 minutes, with $B\gg k$. The elevator will arrive in an integer number of minutes.

Output: A method to reach the k-th floor as quickly as possible.

Method 1: Take the stairs. Competitive ratio = k

Method 2: Take the elevator. Competitive ratio = B/k

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Method 3: Wait for the elevator for a while.

If it still does not arrive, take the stairs.

Wait for the elevator for k minutes. If it still does not arrive, take the stairs.

Time:
$$h(m) = \begin{cases} m+1 & \text{if } m \leq k \\ 2k & \text{if } m > k \end{cases}$$

Input: Desitnation: k floors up. Climb stairs: 1 floor/minute. Elevator: k floors/minute. When elevator will arrive: in at most B-1 minutes, with $B\gg k$. The elevator will arrive in an integer number of minutes.

Output: A method to reach the k-th floor as quickly as possible.

Method 1: Take the stairs. Competitive ratio = k

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Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Method 3: Wait for the elevator for k minutes. If it still does not arrive, take the stairs.

Time:
$$h(m) = \begin{cases} m+1 & \text{if } m \leq k \\ 2k & \text{if } m > k \end{cases}$$

The elevator arrives in m minutes.

$$m=0$$
 1 2 \cdots $k-1$ k $k+1$ \cdots $B-1$

Input: Desitnation: k floors up. Climb stairs: 1 floor/minute.

Elevator: k floors/minute.

When elevator will arrive:

in at most B-1 minutes, with $B\gg k$.

The elevator will arrive in an integer number of minutes.

Output: A method to reach the k-th floor as quickly as possible.

Method 1: Take the stairs. Competitive ratio = k

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Optimal solution:

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Method 3: Wait for the elevator for k minutes. If it still does not arrive, take the stairs.

Time: $h(m) = \begin{cases} m+1 & \text{if } m \leq k \\ 2k & \text{if } m > k \end{cases}$

The elevator arrives in m minutes.

$$m=0$$
 1 2 \cdots $k-1$ k $k+1$ \cdots $B-1$

Method 3: 1 2 3 \cdots k k+1 2k \cdots 2k

Input: Desitnation: k floors up.
Climb stairs: 1 floor/minute.
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When elevator will arrive:

in at most B-1 minutes, with $B\gg k$. The elevator will arrive in an integer number of minutes.

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Optimal solution:

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The elevator arrives in *m* minutes.

$$m = 0 \quad 1 \quad 2 \quad \cdots \quad k-1 \quad k \quad k+1 \quad \cdots \quad B-1$$

Method 3: 1 2 3
$$\cdots$$
 k $k+1$ $2k$ \cdots $2k$

$$t(m): 1 2 3 \cdots k k \cdots k$$

Input: Desitnation: k floors up.
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When elevator will arrive:

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Method 3: Wait for the elevator for *k* minutes.

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Time:
$$h(m) = \begin{cases} m+1 & \text{if } m \leq k \\ 2k & \text{if } m > k \end{cases}$$

The elevator arrives in *m* minutes.

$$m = 0 \quad 1 \quad 2 \quad \cdots \quad k-1 \quad k \quad k+1 \quad \cdots \quad B-1$$
Method 3: $1 \quad 2 \quad 3 \quad \cdots \quad k \quad k+1 \quad 2k \quad \cdots \quad 2k$
 $t(m): \quad 1 \quad 2 \quad 3 \quad \cdots \quad k \quad k \quad k \quad \cdots \quad k$
Ratio: $1 \quad 1 \quad 1 \quad \cdots \quad 1 \quad \frac{k+1}{k} \quad 2 \quad \cdots \quad 2$

Input: Desitnation: k floors up.
Climb stairs: 1 floor/minute.
Elevator: k floors/minute.
When elevator will arrive:

in at most B-1 minutes, with $B\gg k$. The elevator will arrive in an integer number of minutes.

Output: A method to reach the k-th floor as quickly as possible.

Method 1: Take the stairs. Competitive ratio = k

Method 2: Take the elevator. Competitive ratio = B/k

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Method 3: Wait for the elevator for k minutes. If it still does not arrive, take the stairs.

Time: $h(m) = \begin{cases} m+1 & \text{if } m \leq k \\ 2k & \text{if } m > k \end{cases}$

The elevator arrives in *m* minutes.

$$m=0$$
 1 2 \cdots $k-1$ k $k+1$ \cdots $B-1$

Method 3: 1 2 3 \cdots k k+1 2k \cdots 2k

 $t(m): 1 2 3 \cdots k k \cdots k$

Ratio: 1 1 1 ... 1 $\frac{k+1}{k}$ 2 ... 2

Competitive Ratio = 2

Input: Desitnation: k floors up. Climb stairs: 1 floor/minute. Elevator: k floors/minute. When elevator will arrive: in at most B-1 minutes, with $B\gg k$.

Output: A method to reach the k-th floor as quickly as possible.

The elevator will arrive in an integer number of minutes.

Method 1: Take the stairs. Competitive ratio = k

Method 2: Take the elevator. Competitive ratio = B/k

Optimal solution:

$$t(m) = \begin{cases} m+1 & \text{if } m \le k-1 \\ k & \text{if } m \ge k \end{cases}$$

Method 3: Wait for the elevator for k minutes. If it still does not arrive, take the stairs.

Time:
$$h(m) = \begin{cases} m+1 & \text{if } m \le k \\ 2k & \text{if } m > k \end{cases}$$

The elevator arrives in *m* minutes.

$$m=0$$
 1 2 \cdots $k-1$ k $k+1$ \cdots $B-1$ Method 3: 1 2 3 \cdots k $k+1$ $2k$ \cdots $2k$

$$t(m): 1 2 3 \cdots k k \cdots k$$

Ratio: 1 1 1 ... 1
$$\frac{k+1}{k}$$
 2 ... 2

Competitive Ratio = 2

Common philosophy of online algorithms: guard against any possible worst case.

Quiz questions:

- I. How did the above method achieve a constant competitive ratio?
- 2. What is the value of "guard against all possible worst cases" for online algorithms?