## Presentation Title

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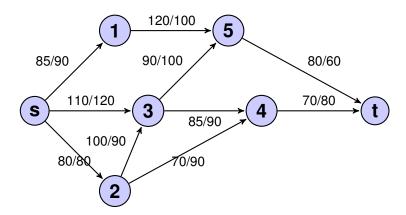
# Introduction

Introduction

Greedy Heuristic Algorithm

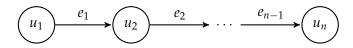
Optimal solution to a path

# **EXAMPLE**



### PHYSICAL SYSTEM

Modeling the physical system, of an EV and a path.



- ► Path
  - + Charging stations, with charging rate ( $R_{CH}(u_i)$ )
  - + Road segments, with speed limit  $(v_{min}(e_i), v_{max}(e_i))$  and distance  $(D(e_i))$
- ► EV
  - + Driving consumes energy accordingly to the speed of the EV, defined by:  $(R_{CO}(e_i))$
  - + Further two constants from the EV are important to model, namely, battery capacity ( $B_{max}$ ) and initial battery ( $B_{cur}$ )

### OPTIMISATION PROBLEM

Formulating a optimization problem, which when solved will yield a optimal solution.

- ▶ Objective: Move from  $u_1$  to  $u_n$  using minimum time .
  - + Time can be used driving or charging.

- min: 
$$\sum_{i=1}^{n-1} \left( \frac{D(e_i)}{v_{e_i}} + CT_{u_i} \right)$$

- ► Physical constraints:
  - + Each edge must be driven at a speed within the speed limit:

- 
$$\forall_{i \in 1...n-1}$$
:  $v_{min}(e_i) \leq v_{e_i} \leq v_{max}(e_i)$ 

- + Time can only be positive.
  - $\forall_{i \in 1}$   $n: 0 < CT_{u_i}$
- + The energy is the battery must alway be between 0 and  $B_{max}$

### **BATTERY CONSTRAINT**

The battery constraint of the optimization problem can be split into two parts

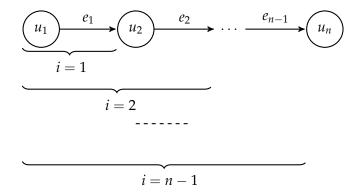
- No road segment can be passed without having the required energy
- No overcharging at any charging station.

Energy can be..

- ▶ Spend:  $\forall_{i \in 1...n-1}$ :  $ES(e_i) = D(e_i) \times R_{CO}(v_{e_i})$
- ► Acuried:  $\forall_{i \in 1...n}$ :  $EA(u_i) = R_{CH}(u_i) \times CT_{u_i}$
- ▶ Already in the battery:  $B_{cur}$

#### BATTERY CONSTRAINT

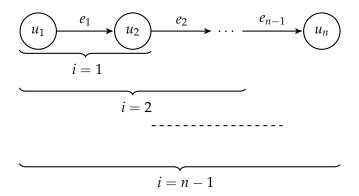
No road segment can be passed without having the required energy



▶ 
$$\forall_{i \in 1...n-1} : 0 \le B_{cur} + \sum_{j=1}^{i} EA(u_j) - \sum_{j=1}^{i} ES(e_j) \le B_{max}$$

#### **BATTERY CONSTRAINT**

No overcharging at any charging station.



▶ 
$$\forall_{i \in 1...n-1} : 0 \le B_{cur} + \sum_{j=1}^{i+1} EA(u_j) - \sum_{j=1}^{i} ES(e_j) \le B_{max}$$

## LINEAR PROGRAMMING

NP-complete problem.

Linearization and linear programming for approximate solution.

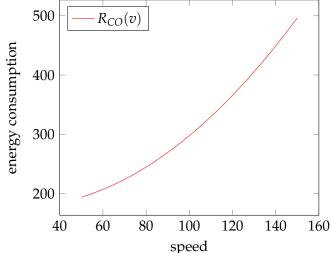
Two functions of the optimization problem are non linear functions.

- ► Consumption rate  $(R_{CO}(v_{e_i}))$
- ▶ Driving time  $(\frac{D(e_i)}{v_e})$

#### LINEARIZATION EXAMPLE

Function for energy consumption before linearization.

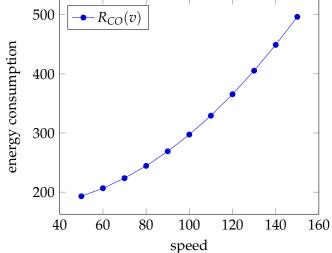
$$R_{CO}(v) = 0.019 * x^2 - 0.770 * x + 184.4$$



#### LINEARIZATION EXAMPLE

Function for energy consumption after linearization.

$$R_{CO}(v) = 0.019 * x^2 - 0.770 * x + 184.4$$



# LINEARIZATION

- ► For all linear function their slope and the y-intercept is precomputed.
- ► For every edge in the path exactly one line segment needs to be chosen. Thus a binary matrix i introduced of size  $n \times m$ , where n = edges in the path and m = linear pieces of each line.