

Train Trajectory Optimization with Signalling Constraints (PPT)

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Train Trajectory Optimization with Signalling Constraints

Delft University of Technology Pengling Wang, Rob M.P. Goverde, Lei Ma July 20, 2015

Outline

1 Introduction

- 2 Train Trajectory Optimization
- **3** Train Path Envelope
- 4 Multiple phase train trajectory optimization model
- 5 Train Trajectory Optimization Strategies Dutch Signalling System
- 6 Computational Experiments

7 Conclusions

Introduction

What is the train trajectory optimization?



Introduction

What is the train trajectory optimization?

- speed trajectory
- energy-saving, on-time, safe, riding comfort...



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Train Dynamic Movement Model

Dynamic constraints:

$$\frac{dv}{ds} = \frac{dv}{dt}\frac{dt}{ds} = \frac{a}{v} = \frac{\theta_1 f - \theta_2 b - R_{train}(v) - R_{line}(s)}{\rho \cdot m \cdot v}$$

$$\frac{dt}{ds} = \frac{1}{v}.$$

$$\theta_1, \theta_2 \in \{0, 1\}$$

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Path constraints:

$$\begin{cases} 0 \le f \le F_{\max} & 100 \\ 0 \le b \le B_{\max} & 100 \\ 0 \le f \cdot v \le P_{\max} & 0 \le v \le V_{\max} \\ A_{\min} \le \frac{dv}{dt} \le A_{\max} & 0 \end{cases}$$

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Train Dynamic Movement Model

Dynamic constraints:

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$$\frac{dt}{ds} = \frac{1}{v}. \qquad \theta_1, \theta_2 \in \{0, 1\}$$



Path constraints:

$$\begin{cases} 0 \le f \le F_{\max} \\ 0 \le b \le B_{\max} \\ 0 \le f \cdot v \le P_{\max} \\ 0 \le v \le V_{\max} \\ A_{\min} \le \frac{dv}{dt} \le A_{\max} \end{cases}$$

Boundary conditions:

 $v(s_0) = 0, v(s_f) = 0$ $t(s_0) = T_0, t(s_f) = T_f$

Objective function:

Minimize
$$E = \int_{s_0}^{s_f} f \, ds$$

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- optimization approach: Maximum principle
- More constraints should been taken into account:



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- optimization approach: Maximum principle
- More constraints should been taken into account:
 - time constraints



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- optimization approach: Maximum principle
- More constraints should been taken into account:
 - time constraints
 - speed limits, grades and curves



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- optimization approach: Maximum principle
- · More constraints should been taken into account:
 - time constraints
 - speed limits, grades and curves
 - signaling system



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More constraints should been taken into account:

- time constraints
- speed limits, grades and curves
- signaling aspects

In this paper:

- Train Path Envelope
- Multiple phase train trajectory optimization model
- Optimization strategies in consideration of the influence from signaling system



Train Path Envelope

Train Path Envelope

a series of time and speed allowances available in real operation



The TPE contains two kinds of targets:

- Mandatory target points, (p, t, v)
- Flexible target windows, (*p*, [*t*_{min}, *t*_{max}], [*v*_{min}, *v*_{max}])

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Multiple-phase optimal control model:

- divide the train trajectory into several phases by several linkage points;
- each phase has its own cost function, dynamic model, path constraints and boundary conditions;
- two adjacent phases are linked by linkage conditions.





Multiple-phase optimal control model:

- divide the train trajectory into several phases by several linkage points;
- each phase has its own cost function, dynamic model, path constraints and boundary conditions;
- two adjacent phases are linked by linkage conditions.

The linkage points can be:

the TPE target points



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boundary conditions:

at mandatory target points:

$$v(s_0^{(r)}) = V_0^{(r)}, \quad t(s_0^{(r)}) = T_0^{(r)}$$
(initial boundaries)
 $v(s_f^{(r)}) = V_f^{(r)}, \quad t(s_f^{(r)}) = T_f^{(r)}$ (terminal boundaries)

for flexible target windows:

í.

$$V_{0,\min}^{(r)} \le v(s_0^{(r)}) \le V_{0,\max}^{(r)}, \quad T_{0,\min}^{(r)} \le t(s_0^{(r)}) \le T_{0,\max}^{(r)} \text{ (initial boundaries)}$$

$$V_{f,\min}^{(r)} \le v(s_f^{(r)}) \le V_{f,\max}^{(r)}, \quad T_{f,\min}^{(r)} \le t(s_f^{(r)}) \le T_{f,\max}^{(r)} \text{ (terminal boundaries)}$$

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The linkage points can be:

- Target positions of the TPE
- Critical points of speed limits or gradients and curves



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cost function:

$$J^{(r)} = \int_{s_0^{(r)}}^{s_f^{(r)}} f^{(r)} \, ds$$

dynamic model:

$$\frac{dv^{(r)}}{ds} = \frac{\theta_1 f^{(r)} - \theta_2 b^{(r)} - R_{train}(v^{(r)}) - R_{line}^{(r)}(s)}{\rho \cdot m \cdot v^{(r)}}$$
$$\frac{dt^{(r)}}{ds} = \frac{1}{v^{(r)}}$$

path constraints:

$$\begin{cases} 0 \le f^{(r)} \le F_{\max} \\ 0 \le b^{(r)} \le B_{\max} \\ 0 \le f^{(r)} \cdot v^{(r)} \le P_{\max} \\ 0 \le v^{(r)} \le V_{\max}^{(r)} \\ A_{\min} \le \frac{dv^{(r)}}{dt^{(r)}} \le A_{\max} \end{cases}$$

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linkage conditions:

$$\begin{split} s_f^{(r)} &- s_0^{(r+1)} = 0, \\ v(s_f^{(r)}) &- v(s_0^{(r+1)}) = 0, \\ t(s_f^{(r)}) &- t(s_0^{(r+1)}) = 0. \end{split}$$



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- Gauss Pseudospectral methods can be applied for solving multiple-phase optimization problems.
- The optimization objective is to minimize the sum of the cost functions of all phases.

Solver:

- GPOPS
- PROPT
- DIDO



Next Subsection

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Dutch Signalling System

Example of Dutch signalling system (a):



Example of Dutch signalling system (b):



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Two cases of information about the signaling system available:

- Case I: Limited information about the signal aspect ahead only.
- Optimization strategy is to rapidly respond to signaling aspects.

Green:

 calculate the optimal trajectory from the current position to the next timetable point



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Yellow:



Decelerating curve

Curve I

Yellow 8:



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Decelerating curve

Curve II

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- Case II: Full information about the entire train trajectory of the preceding train
- Optimization strategy: Green wave policy

• $t(p_s) \ge T_{p_s,\min}$, $T_{p_s,\min}$ is the predicted time that the signal changes from yellow to green.



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If the remaining running time is insufficient,

- increase the remaining running time The time boundary condition of the arrival event is changed from $t(s_f^{(r)}) = T_f^{(r)}$ to $T_f^{(r)} \le t(s_f^{(r)}) \le T_f^{(r)} + T_{add}$.
- the cost function is designed as

$$J^{(r)} = t(s_f^{(r)}) + \omega \int_{s_0^{(r)}}^{s_f^{(r)}} f^{(r)} ds$$

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Computational Experiments - Data

Infrastructure: from Htnc to CI



Train: one Intercity, one Sprinter (Local train), and the Sprinter train runs ahead of the Intercity.





Computational Experiments - Results

the train trajectories of the IC train with four different departure headways after the SPR train at station *Htnc*. (solid line–Case I, dashed line–Case II)

Headway 120 s



Headway 140 s



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Computational Experiments - Results

	Headway [s]	Energy Consumption [J]	Running time [s]	Delay [s]
	120	3.3609×10 ⁸	285	45
	140	1.1878×10 ⁸	282	42
	160	1.7640×10 ⁸	255	15
	180	0	240	0
	120	1.8624×10 ⁸	283	43
1	140	1.4541×10 ⁸	263	23
	160	1.4652×10 ⁸	243	3
	180	0	240	0

Table: Results of the IC train operation optimization for different departure headways.



Conclusions

- Train path envelope is a useful formulation of the time constraints for the train operation.
- The multiple-phase optimal control model and the Gauss Pseudospectral Method can been used for the train trajectory optimization problem.
- The influences from the signalling system on train operations should be taken into consideration. More information about signaling system and green wave policy result in better optimal solutions.



Thank you for listening!

