

# User Manual

## OCDES (v1.4): OCDE Simulator

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### 1. Overview

OCDES is a MATLAB-based tool that performs numerical integration to solve Optimization-Constrained Differential Equations (OCDE):

$$\dot{x} = f(x, v), x(0) = x_0, \quad (1a)$$

$$v \in \arg \min_v g(x, v), \quad (1b)$$

$$s. t. h_i(x, v) = 0, i = 1, \dots, M, \quad (1c)$$

$$l_j(x, v) \geq 0, j = 1, \dots, N \quad (1d)$$

$x \in \mathbb{R}^m$  and  $v \in \mathbb{R}^n$ .  $f: \mathbb{R}^m \times \mathbb{R}^n \rightarrow \mathbb{R}^m$ ,  $g: \mathbb{R}^m \times \mathbb{R}^n \rightarrow \mathbb{R}$ ,  $h_i: \mathbb{R}^m \times \mathbb{R}^n \rightarrow \mathbb{R}$ ,  $l_j: \mathbb{R}^m \times \mathbb{R}^n \rightarrow \mathbb{R}$  are at least second order continuously differentiable. OCDES provides efficient numerical solution of OCDE by using local optimality-based solution method. A sequence of DAE systems are generated and classical index-1 DAE simulator is applied to solve the derived DAE systems.

### 2. Basic Requirements

- (1) Matlab, version 2014 or higher.
- (2) Matlab Symbolic Toolbox

### 3. Installation

The simulator needs Matlab environment.

### 4. How to use OCDES

Please refer to the example demo1.m. General steps of using OCDES are:

- (1) Define state variables  $x$  and optimization variables  $v$  in symbolic format.
- (2) Define functions  $f$ ,  $g$ ,  $h$ ,  $l$  in symbolic format.
- (3) Give initial condition  $x(0)$  and initial guess of  $v(0)$ .
- (5) Specify options for solving the inner NLP for initialization

opt_init.tol_act	tolerance to check active inequality constraints
opt_init.optimoptions	Optimization options, cf. MATLAB optimoptions
opt_sol.MaxNoUptActiveSet	maximum number of updating active set
opt_sol.tol_feasible	feasibility tolerance

## (6) Specify options for integration

tstart	starting time of simulation
tfinal	ending time of simulation
opt_sol.integrator	Selected integration
opt_sol.opt_integrator	Integration options

## (7) Call sOCDE\_main.m to solve the OCDE.

### 5. Function description

```
[tout,yout,teout,yeout,ieq_actout,miu_ieq, miu_eq]=sOCDE_main(f, obj,heq,  
hieq,x,x0,v,v0,tstart, tfinal,opt_init,opt_sol)  
%This function solves OCDE by calling OCDE_sol_init.m for initialization and  
%OCDE_sol.m for integration
```

```
%Input:
```

```
%f: state equations of the dynamic part (sym)
```

```
%obj: objective function (sym)
```

```
%heq: left hand side of equality constraints (sym)
```

```
%hieq: left hand side of inequality ( $\geq$ ) constraints (sym)
```

```
%x: state variables(sym)
```

```
%x0: initial point of x (real column vector). x0 must be given and fixed.
```

```
%v: inner optimization variables (sym)
```

```
%v0: initial guess of inner optimization variables (real column vector). v0  
can be empty.
```

```
%opt_init: options for initialization
```

```
%opt_sol: options for integration
```

```
%Outputs:
```

```
%tout: integration steps of t (real vector)
```

```
%yout: integration results of [x;v;miu_ieq;miu_eq] (real matrix)
```

```
%teout: the time, when the switching of active set happens (real vector)
```

```
%yeout: states of [x;v;miu_ieq;miu_eq], when the switching of active set  
happens (real matrix)
```

```
%ieq_actout: record the different values of active sets along the solution  
trajectory (real matrix)
```

```
%miu_ieq: L. multipliers for inequality constraints
```

```
%miu_eq: L. multipliers for equality constraints
```

```
function [KKT,miu_ieq, miu_eq,  
ieq_act,KKT_fun,event_fun,init]=OCDE_sol_init(obj,heq, hieq,x,x0,v,v0,opt)  
%This function:  
%(1) formulates the KKT optimality condition of the inner NLP  
%in Matlab symbolic format  
%(2) generates m-files of KKT optimality condition and associated function  
handles  
%(3) provides initial conditions for state variables, inner optimization  
%variables, Lagrange multipliers, initial active set of inequality  
constraints,  
%(4) define event functions for detecting the switching of active set.
```

```

%Inputs:
%obj: objective function (sym)
%heq: left hand side of equality constraints (sym)
%hieq: left hand side of inequality ( $\geq$ ) constraints (sym)
%x: state variables(sym)
%x0: initial point of x (real column vector). x0 must be given and fixed.
%v: inner optimization variables (sym)
%v0: initial guess of inner optimization variables (real column vector). v0
can be empty.
%opt: options of initializations
%opt.MaxTry: the number of multi-start times when solving NLP for
initialization (integer), default 10.
%opt.tol_act: tolerance of active inequality (real scalar), default 1e-6.
%opt.optimoptions=: options for used optimizer. default is empty.

%Outputs:
%KKT: KKT optimality condition of inner optimization (sym)
%miu_ieq: Lagrange multipliers of inequality constraints (sym)
%miu_eq: Lagrange multipliers of equality constraints (sym)
%ieq_act: index for active inequality constraint (sym). If ieq_act(j)=1: the
j-th inequality constraint is active, otherwise non-active.
%KKT_fun([x;v;miu_ieq;miu_eq],ieq_act): function handle, which
%returns the evaluated value of KKT
%event_fun: event function for detecting the switching of active inequalities
%init: initial values of state variables, inner optimization variables,
%Lagrange multipliers and the active set

function [tout,yout,teout,yeout,ieq_actout]=OCDE_sol(ODE_fun, ...
    KKT_fun,x0, v0, miu_ieq0, miu_eq0, ieq_act0, tstart, tfinal, ...
    event_fun,Jac_fun,option)
%This function integrates the OCDE by using KKT optimality conditions. It
%solves the following quasi-DAE system
%dx=ODE_fun(x,v);
%0=KKT_fun([x;v;miu_ieq;miu_eq], ieq_act)
%x=x, z=[v;miu_ieq;miu_eq], y=[x;z]

%Inputs:
%ODE_fun: the right hand side of dx=f(x,v) (function handle)
%KKT_fun([x;v;miu_ieq;miu_eq], ieq_act): return the right hand side of 0=KKT.
%(function handle).
%x0:initial value of x (real vector)
%v0: initial value of v, i.e. the optimal solution of inner NLP (real vector)
%miu_ieq0: initial value of Lagrange multipliers miu_ieq (real vector)
%miu_eq0: initial value of Lagrange multipliers miu_eq (real vector)
%ieq_act0: initial value of the active set index ieq_act (real vector)
%tstart: start time of integration (real scalar)
%tfinal: end time of integration (real scalar)
%event_fun([x;v;miu_ieq;miu_eq]): function handle to detect the switching of
%active set. It is define to be miu_ieq-hieq(x,v). (function handle)
%Jac_fun(t,[x;v;miu_ieq;miu_eq], ieq_act): Jacobian matrix  $df(x,z)/dxz$ . If
empty, it is approximated by finite difference methods.
%option: options

%Outputs:

```

```

%tout: integration steps of t (real vector)
%yout: integration results of [x;v;miu_ieq;miu_eq] (real matrix)
%teout: the time, when the switching of active set happens (real vector)
%yeout: states of [x;v;miu_ieq;miu_eq], when the switching of active set
happens (real matrix)
%ieq_actout: record the different values of active sets along the solution
trajectory (real matrix)

```

### Example (demo1.m)

The demo example solves the following OCDE

$$\dot{x}_1 = 0.5 + v_1 v_2, x_1(0) = \pi/4, \quad (2a)$$

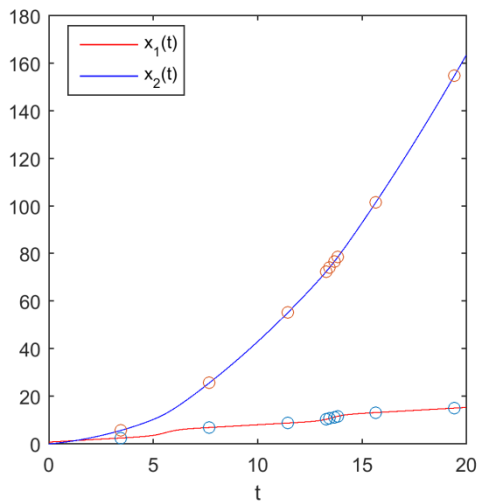
$$\dot{x}_2 = x_1, x_2(0) = 0, \quad (2b)$$

$$v = (v_1, v_2) \in \arg \min_v v_1^2 + v_2^2, \quad (2c)$$

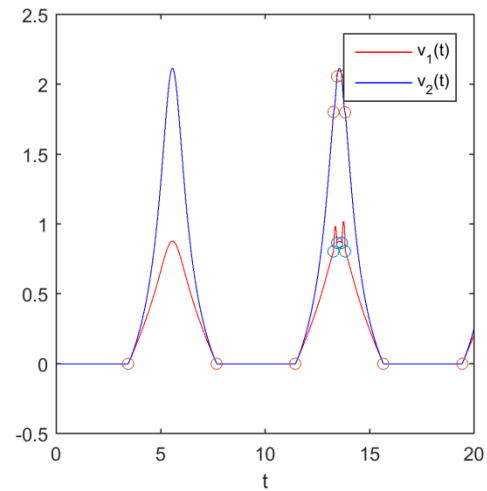
$$\text{s. t. } 1.7 \sin(x_1) + v_2 - e^{-v_1} \geq 0, \quad (2c)$$

$$0.2 \cos(x_2) + 2 - v_2 \geq 0. \quad (2d)$$

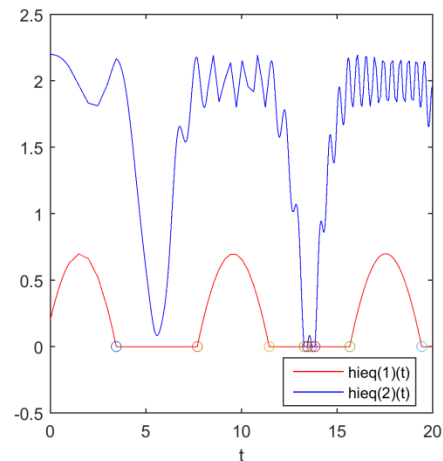
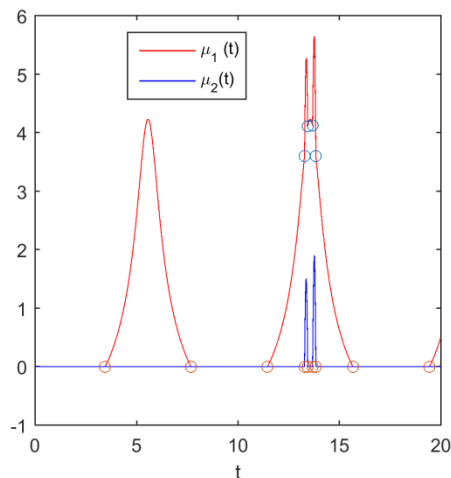
Simulation results:



(a) State variables



(b) Inner optimization variables



(3) *Lagrange multipliers*

(4) *inequality constraints*

*Fig. 1. Simulation results of OCDE (2). Small Cycles refer to the switching time of active set.*

## 6. Citation

Please cite [1], if you use the code.

## 7. License

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## References

[1] Zhao, Ploch, Noack, Wiechert, Mitsos, von Lieres, Analysis of local well-posedness of optimization-constrained differential equations by local optimality conditions, AIChE J., DOI:10.1002/aic.16548.