

# HPIPM reference guide

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# Chapter 1

## Introduction

HPIPM, which stands for High-Performance Interior Point Method, is a library providing a collection of quadratic programs (QP) and routines to manage them. Aim of the library is to provide both stand-alone IPM solvers for the QPs and the building blocks for more complex optimization algorithms.

At the moment, three QPs types are provided: dense QPs, optimal control problem (OCP) QPs, and tree-structured OCP QPs. These QPs are defined using C structures. HPIPM provides routines to manage the QPs, and to convert between them.

HPIPM is written entirely in C, and it builds on top of BLASFEO [1], that provides high-performance implementations of basic linear algebra (LA) routines, optimized for matrices of moderate size (as common in embedded optimization).

## Chapter 2

# Dense QP

The dense QP is a QP in the form

$$\begin{aligned} \min_{v,s} \quad & \frac{1}{2} \begin{bmatrix} v \\ 1 \end{bmatrix}^T \begin{bmatrix} H & g \\ g^T & 0 \end{bmatrix} \begin{bmatrix} v \\ 1 \end{bmatrix} + \frac{1}{2} \begin{bmatrix} s^l \\ s^u \\ 1 \end{bmatrix}^T \begin{bmatrix} Z^l & 0 & z^l \\ 0 & Z^u & z^u \\ (z^l)^T & (z^u)^T & 0 \end{bmatrix} \begin{bmatrix} s^l \\ s^u \\ 1 \end{bmatrix} \\ \text{s.t.} \quad & Av = b, \\ & \begin{bmatrix} \underline{v} \\ \underline{d} \end{bmatrix} \leq \begin{bmatrix} J_{b,v} \\ C \end{bmatrix} v + \begin{bmatrix} J_{s,v} \\ J_{s,g} \end{bmatrix} s^l, \\ & \begin{bmatrix} J_{b,v} \\ C_n \end{bmatrix} v - \begin{bmatrix} J_{s,v} \\ J_{s,g} \end{bmatrix} s^u \leq \begin{bmatrix} \bar{v} \\ \bar{d} \end{bmatrix}, \\ & s^l \geq \underline{s}^l, \\ & s^u \geq \underline{s}^u, \end{aligned}$$

where  $v$  are the primal variables,  $s^l$  ( $s^u$ ) are the slack variables of the soft lower (upper) constraints. The matrices  $J_{\dots}$  are made of rows from identity matrices. Furthermore, note that the constraint matrix with respect to  $v$  is the same for the upper and the lower constraints.

## Chapter 3

# OCP QP

The OCP QP is a QP in the form

$$\begin{aligned}
 \min_{x,u,s} \quad & \sum_{n=0}^N \frac{1}{2} \begin{bmatrix} u_n \\ x_n \\ 1 \end{bmatrix}^T \begin{bmatrix} R_n & S_n & r_n \\ S_n^T & Q_n & q_n \\ r_n^T & q_n^T & 0 \end{bmatrix} \begin{bmatrix} u_n \\ x_n \\ 1 \end{bmatrix} + \frac{1}{2} \begin{bmatrix} s_n^l \\ s_n^u \\ 1 \end{bmatrix}^T \begin{bmatrix} Z_n^l & 0 & z_n^l \\ 0 & Z_n^u & z_n^u \\ (z_n^l)^T & (z_n^u)^T & 0 \end{bmatrix} \begin{bmatrix} s_n^l \\ s_n^u \\ 1 \end{bmatrix} \\
 \text{s.t} \quad & x_{n+1} = A_n x_n + B_n u_n + b_n, \quad n = 0, \dots, N-1, \\
 & \begin{bmatrix} \underline{u}_n \\ \underline{x}_n \\ \underline{d}_n \end{bmatrix} \leq \begin{bmatrix} J_{b,u,n} & 0 \\ 0 & J_{b,x,n} \\ D_n & C_n \end{bmatrix} \begin{bmatrix} u_n \\ x_n \end{bmatrix} + \begin{bmatrix} J_{s,u,n} \\ J_{s,x,n} \\ J_{s,g,n} \end{bmatrix} s_n^l, \quad n = 0, \dots, N, \\
 & \begin{bmatrix} J_{b,u,n} & 0 \\ 0 & J_{b,x,n} \\ D_n & C_n \end{bmatrix} \begin{bmatrix} u_n \\ x_n \end{bmatrix} - \begin{bmatrix} J_{s,u,n} \\ J_{s,x,n} \\ J_{s,g,n} \end{bmatrix} s_n^u \leq \begin{bmatrix} \bar{u}_n \\ \bar{x}_n \\ \bar{d}_n \end{bmatrix}, \quad n = 0, \dots, N, \\
 & s_n^l \geq \underline{s}_n^l, \quad n = 0, \dots, N, \\
 & s_n^u \geq \underline{s}_n^u, \quad n = 0, \dots, N,
 \end{aligned}$$

where  $u_n$  are the control inputs,  $x_n$  are the states,  $s_n^l$  ( $s_n^u$ ) are the slack variables of the soft lower (upper) constraints and  $\underline{s}_n^l$  and  $\underline{s}_n^u$  are the lower bounds on lower and upper slacks, respectively. The matrices  $J_{\dots,n}$  are made of rows from identity matrices. Note that all quantities can vary stage-wise. Furthermore, note that the constraint matrix with respect to  $u$  and  $x$  is the same for the upper and the lower constraints.

```

int d_memsize_ocp_qp(int N, int *nx, int *nu, int *nb, int *ng, int *ns);

void d_create_ocp_qp(int N, int *nx, int *nu, int *nb, int *ng, int *ns,
    struct d_ocp_qp *qp, void *memory);

void d_cvt_colmaj_to_ocp_qp(double **A, double **B, double **b,
    double **Q, double **S, double **R, double **q, double **r,
    int **idxb, double **lb, double **ub,
    double **C, double **D, double **lg, double **ug,
    double **Zl, double **Zu, double **zl, double **zu, int **idxs,
    double **ls, double **us,
    struct d_ocp_qp *qp);

```

# Bibliography

- [1] G. Frison, D. Kouzoupis, T. Sartor, A. Zanelli, and M. Diehl. BLASFEO: Basic linear algebra subroutines for embedded optimization. *ACM Transactions on Mathematical Software (TOMS)*, 2018. (accepted).