

**acados** reference

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# Chapter 1

## Interfaces

### 1.1 OCP QP interface

This interface describes a Quadratic Programming (QP) problem with Optimal Control Problem (OCP) structure, as follows:

$$\begin{aligned} \underset{\substack{x_0, \dots, x_k \\ u_0, \dots, u_{N-1}}}{\text{minimize}} \quad & \sum_{k=0}^{N-1} \frac{1}{2} \begin{bmatrix} x_k \\ u_k \end{bmatrix}^\top \begin{bmatrix} Q_k & S_k \\ S_k^\top & R_k \end{bmatrix} \begin{bmatrix} x_k \\ u_k \end{bmatrix} + \begin{bmatrix} q_k \end{bmatrix}^\top \begin{bmatrix} x_k \\ u_k \end{bmatrix} \\ & + \frac{1}{2} x_N^\top Q_N x_N + q_N^\top x_N \end{aligned} \quad (1.1a)$$

$$\text{subject to} \quad x_{k+1} = A_k x_k + B_k u_k + b_k, \quad k = 0, \dots, N-1, \quad (1.1b)$$

$$\underline{u}_k \leq u_k \leq \bar{u}_k, \quad k = 0, \dots, N-1, \quad (1.1c)$$

$$\underline{x}_k \leq x_k \leq \bar{x}_k, \quad k = 0, \dots, N, \quad (1.1d)$$

$$\underline{c}_k \leq C_k^x x_k + C_k^u u_k \leq \bar{c}_k, \quad k = 0, \dots, N-1, \quad (1.1e)$$

$$\underline{c}_N \leq C_N^x x_k \leq \bar{c}_N. \quad (1.1f)$$

The C interface looks like

```
int ocp_qp_SOLVERNAME(  
    int N, int *nx, int *nu, int *nb, int *nc,  
    double **A, double **B, double **b,  
    double **Q, double **S, double **R, double **q, double **r,  
    int **idxb, double **lb, double **ub,  
    double **Cx, double **Cu, double **lc, double **uc,  
    double **x, double **u,  
    struct ocp_qp_SOLVERNAME_args *args, double *work);
```

where `SOLVERNAME` is the name of the specific solver.

`N` [input] is the horizon length.

`nx` [input] is the vector of the state sizes  $n_u$  at the different stages, such that `nx[k]` is the state size at stage `k`.

- nu** [input] is the vector of the input sizes  $n_x$  at the different stages, such that **nu**[**k**] is the input size at stage **k**.
- nb** [input] is the vector of the bound sizes  $n_b$  at the different stages, such that **nb**[**k**] is the bound size at stage **k**. The value of **nb**[**k**] is smaller or equal to **nx**[**k**]+**nu**[**k**].
- nc** [input] is the vector of the general polytopic constraint sizes  $n_c$  at the different stages, such that **nc**[**k**] is the general polytopic constraint size at stage **k**.
- A** [input] is the vector of size  $N$  of the pointers to the first element of the matrices  $A_k$ , such that **A**[**k**] is the pointer to the first element of the matrix  $A_k$ , and **A**[**k**][0] is the first element of the matrix  $A_k$ . The matrix referenced by the pointer **A**[**k**] is stored in column-major (or Fortran-like) order, in a vector of **nx**[**k+1**] $\times$ **nx**[**k**] double-precision floating-point numbers.
- B** [input] is the vector of size  $N$  of the pointers to the first element of the matrices  $B_k$ , such that **B**[**k**] is the pointer to the first element of the matrix  $B_k$ , and **B**[**k**][0] is the first element of the matrix  $B_k$ . The matrix referenced by the pointer **B**[**k**] is stored in column-major (or Fortran-like) order, in a vector of **nx**[**k+1**] $\times$ **nu**[**k**] double-precision floating-point numbers.
- b** [input] is the vector of size  $N$  of the pointers to the first element of the vectors  $b_k$ , such that **b**[**k**] is the pointer to the first element of the vector  $b_k$ , and **b**[**k**][0] is the first element of the vector  $b_k$ . The vector referenced by the pointer **b**[**k**] is stored in a vector of **nx**[**k+1**] $\times$ 1 double-precision floating-point numbers.
- Q** [input] is the vector of size  $N + 1$  of the pointers to the first element of the matrices  $Q_k$ , such that **Q**[**k**] is the pointer to the first element of the matrix  $Q_k$ , and **Q**[**k**][0] is the first element of the matrix  $Q_k$ . The matrix referenced by the pointer **Q**[**k**] is stored in column-major (or Fortran-like) order, in a vector of **nx**[**k**] $\times$ **nx**[**k**] double-precision floating-point numbers.
- S** [input] is the vector of size  $N$  of the pointers to the first element of the matrices  $S_k$ , such that **S**[**k**] is the pointer to the first element of the matrix  $S_k$ , and **S**[**k**][0] is the first element of the matrix  $S_k$ . The matrix referenced by the pointer **S**[**k**] is stored in column-major (or Fortran-like) order, in a vector of **nu**[**k**] $\times$ **nx**[**k**] double-precision floating-point numbers.
- R** [input] is the vector of size  $N$  of the pointers to the first element of the matrices  $R_k$ , such that **R**[**k**] is the pointer to the first element of the matrix  $R_k$ , and **R**[**k**][0] is the first element of the matrix  $R_k$ . The matrix

referenced by the pointer  $\mathbf{R}[\mathbf{k}]$  is stored in column-major (or Fortran-like) order, in a vector of  $\mathbf{nu}[\mathbf{k}] \times \mathbf{nu}[\mathbf{k}]$  double-precision floating-point numbers.

$\mathbf{q}$  [input] is the vector of size  $N + 1$  of the pointers to the first element of the vectors  $q_k$ , such that  $\mathbf{q}[\mathbf{k}]$  is the pointer to the first element of the vector  $q_k$ , and  $\mathbf{q}[\mathbf{k}][0]$  is the first element of the vector  $q_k$ . The vector referenced by the pointer  $\mathbf{q}[\mathbf{k}]$  is stored in a vector of  $\mathbf{nx}[\mathbf{k}] \times 1$  double-precision floating-point numbers.

$\mathbf{r}$  [input] is the vector of size  $N$  of the pointers to the first element of the vectors  $r_k$ , such that  $\mathbf{r}[\mathbf{k}]$  is the pointer to the first element of the vector  $r_k$ , and  $\mathbf{r}[\mathbf{k}][0]$  is the first element of the vector  $r_k$ . The vector referenced by the pointer  $\mathbf{r}[\mathbf{k}]$  is stored in a vector of  $\mathbf{nu}[\mathbf{k}] \times 1$  double-precision floating-point numbers.

$\mathbf{idxb}$  [input] is the vector of size  $N + 1$  of the pointers to the first element of the integer vectors  $\mathbf{idxb}_k$  describing the indexes of the corresponding upper and lower bounds in  $\mathbf{lb}$  and  $\mathbf{ub}$ , such that  $\mathbf{idxb}[\mathbf{k}]$  is the pointer to the index of the first bound at stage  $k$ , and  $\mathbf{idxb}[\mathbf{k}][0]$  is index of the first bound at stage  $k$ . The indexes in  $\mathbf{idxb}[\mathbf{k}]$  correspond to the position of the constrained components in the variables vector  $\begin{bmatrix} x_k \\ u_k \end{bmatrix}$ : therefore a bound on the first state component has index 0, a bound on the last state component has index  $\mathbf{nx}[\mathbf{k}] - 1$ , a bound on the first input component has index  $\mathbf{nx}[\mathbf{k}]$  and a bound on the last input component has index  $\mathbf{nx}[\mathbf{k}] + \mathbf{nu}[\mathbf{k}] - 1$ . The vector referenced by the pointer  $\mathbf{idxb}[\mathbf{k}]$  is stored in a vector of  $\mathbf{nb}[\mathbf{k}] \times 1$  integer numbers.

$\mathbf{lb}$  [input] is the vector of size  $N + 1$  of the pointers to the first element of the vectors  $\begin{bmatrix} x_k \\ u_k \end{bmatrix}$ , such that  $\mathbf{lb}[\mathbf{k}]$  is the pointer to the first element of the vector  $\begin{bmatrix} x_k \\ u_k \end{bmatrix}$ , and  $\mathbf{lb}[\mathbf{k}][0]$  is the first element of the vector  $\begin{bmatrix} x_k \\ u_k \end{bmatrix}$ . The vector referenced by the pointer  $\mathbf{lb}[\mathbf{k}]$  is stored in a vector of  $\mathbf{nb}[\mathbf{k}] \times 1$  double-precision floating-point numbers.

$\mathbf{ub}$  [input] is the vector of size  $N + 1$  of the pointers to the first element of the vectors  $\begin{bmatrix} \bar{x}_k \\ \bar{u}_k \end{bmatrix}$ , such that  $\mathbf{ub}[\mathbf{k}]$  is the pointer to the first element of the vector  $\begin{bmatrix} \bar{x}_k \\ \bar{u}_k \end{bmatrix}$ , and  $\mathbf{ub}[\mathbf{k}][0]$  is the first element of the vector  $\begin{bmatrix} \bar{x}_k \\ \bar{u}_k \end{bmatrix}$ . The vector referenced by the pointer  $\mathbf{ub}[\mathbf{k}]$  is stored in a vector of  $\mathbf{nb}[\mathbf{k}] \times 1$  double-precision floating-point numbers.

$\mathbf{Cx}$  [input] is the vector of size  $N + 1$  of the pointers to the first element of the matrices  $C_k^x$ , such that  $\mathbf{Cx}[\mathbf{k}]$  is the pointer to the first element of the matrix  $C_k^x$ , and  $\mathbf{Cx}[\mathbf{k}][0]$  is the first element of the matrix  $C_k^x$ . The

matrix referenced by the pointer `Dx[k]` is stored in column-major (or Fortran-like) order, in a vector of `nc[k] × nx[k]` double-precision floating-point numbers.

**Cu** [input] is the vector of size  $N$  of the pointers to the first element of the matrices  $C_k^u$ , such that `Cu[k]` is the pointer to the first element of the matrix  $C_k^u$ , and `Cu[k][0]` is the first element of the matrix  $C_k^u$ . The matrix referenced by the pointer `Cu[k]` is stored in column-major (or Fortran-like) order, in a vector of `nc[k] × nu[k]` double-precision floating-point numbers.

**ld** [input] is the vector of size  $N + 1$  of the pointers to the first element of the vectors  $\underline{c}_k$ , such that `lc[k]` is the pointer to the first element of the vector  $\underline{c}_k$ , and `ld[k][0]` is the first element of the vector  $\underline{c}_k$ . The vector referenced by the pointer `ld[k]` is stored in a vector of `nc[k] × 1` double-precision floating-point numbers.

**ud** [input] is the vector of size  $N + 1$  of the pointers to the first element of the vectors  $\bar{c}_k$ , such that `uc[k]` is the pointer to the first element of the vector  $\bar{c}_k$ , and `uc[k][0]` is the first element of the vector  $\bar{c}_k$ . The vector referenced by the pointer `uc[k]` is stored in a vector of `nc[k] × 1` double-precision floating-point numbers.

**x** [output] is the vector of size  $N + 1$  of the pointers to the first element of the vectors  $x_k$ , such that `x[k]` is the pointer to the first element of the vector  $x_k$ , and `x[k][0]` is the first element of the vector  $x_k$ . The vector referenced by the pointer `x[k]` is stored in a vector of `nx[k] × 1` double-precision floating-point numbers.

**u** [output] is the vector of size  $N + 1$  of the pointers to the first element of the vectors  $u_k$ , such that `u[k]` is the pointer to the first element of the vector  $u_k$ , and `u[k][0]` is the first element of the vector  $u_k$ . The vector referenced by the pointer `u[k]` is stored in a vector of `nu[k] × 1` double-precision floating-point numbers.

**args** [input] is the pointer to a structure of type `ocp_qp_SOLVERNAME_args` that defines the arguments (as e.g. maximum number of iterations, minimum step size, ... ) passed to the specific solver.

**work** [workspace] is the pointer to the working space used by the specific solver. The working space size (in doubles) is returned by a call to the function `ocp_qp_SOLVERNAME_workspace_double(int N, int *nx, int *nu, int *nb, int *nc, struct ocp_qp_solver_args *args)`.

Furthermore, the function returns an int, that is defined in the following enum (TODO change the names to something better!!!):

**ACADOS\_SUCCESS** Solution successfully found.

**ACADOS\_MAXITER** Maximum number of iterations reached.

**ACADOS\_MINSTEP** Minimum step size reached (in IPs, probably unfeasible problem).

### 1.1.1 Examples

#### MPC problem

In the MPC problem, the initial state is fixed. This is modelled by choosing  $\mathbf{nx}[0]=0$ , i.e. not considering the initial state as an optimization variable. As a consequence, e.g. the matrix  $\mathbf{A}[0]$  has size  $\mathbf{nx}[1] \times 0$ , the matrix  $\mathbf{Q}[0]$  has size  $0 \times 0$ , and the vector  $\mathbf{q}[0]$  has size  $0 \times 1$ . The information about the known value of  $x_0$  and the matrix  $A_0$  are used to compute the value of the vector  $\mathbf{b}[0]$ , that is initialized to  $b_0 + A_0 \cdot x_0$ .

## 1.2 Integrator Interface with Sensitivity Propagation

The C code interface looks like

```
int ocp_qp_SOLVERNAME(integrator_in *input,
                      struct integrator_SOLVERNAME_opts *opts, double *work);
```

where the input struct is defined as:

```
typedef struct integrator_in_{
    int nSteps, int nSystems, int nX, int nXA, int nP, int nOD,
    double *steps, int *nx, int *nxa, double **S0, double *mu,
    double **x, double **xa, double *p, double *od, double **xOut,
    double **sensOut, double *muOut, double *hessOut, int nOutputs,
    int *nGridOutputs, double **gridOutputs, double **muOutputs,
    double **valOutputs, double **sensOutputs, function_call *sys,
    function_call *out, double *variables} integrator_in;
```

where **SOLVERNAME** is the name of the specific solver. Additionally, a function struct has been defined as:

```
typedef struct function_call_{
    int dimIn, int dimOut, bool *sparsity, bool linear,
    void (*fun)(double*,double*), void (*jac)(double*,double*),
    bool forward, bool backward, bool hessian,
    void (*vde_forw)(double*,double*), void (*vde_adj)(double*,double*),
    void (*vde_hess)(double*,double*)} function_call;
```

If we like the latter embedding of structs, we can avoid some of the fields in the *integrator\_in* struct by moving them somewhere else!

For fixed step integrators:

**nSteps** [input] is the number of integration steps (in case of no step size control).

**steps** [input] is the vector of size *nSteps*, containing the step size for each integration step.

**Dimensions of the dynamic system(s):**

**nSystems** [input] is the number of dynamic subsystems in order of dependency (states of subsystem *k* only depend on subsystems  $1, 2, \dots, k - 1$  etc).

**flag\_linear** [input] is the vector of size *nSystems*, containing the flag whether the subsystem is linear or not (0 or 1, should be part of options OR see the function\_call struct).

**nx** [input] is the vector of size *nSystems*, containing the number of differential states for this integrator.

**nxa** [input] is the vector of size *nSystems*, containing the number of algebraic states for this integrator.

**nX** [input] is the **total** number of differential states for this integrator.

**nXA** [input] is the **total** number of algebraic states for this integrator.

**nP** [input] is the number of free parameters for this integrator (sensitivities with respect to these parameters are computed).

**nOD** [input] is the number of online data, i.e. fixed parameters for this integrator (no sensitivities are computed).

**Sensitivity analysis for the integrator:**

**S0** [input] is the vector of size *nSystems* of the pointers to the matrices containing the forward seeds (the dimensions of these matrices are  $nx[0] \times (nx[0] + np)$ ,  $nx[1] \times (nx[0] + nx[1] + np)$ , ... etc).

**mu** [input] is the vector of dimension *nX*, containing the backward seed.

**flag\_forward** [input] is the flag for first order forward sensitivity propagation (0 or 1, should be part of options OR see the function\_call struct).

**flag\_backward** [input] is the flag for first order backward sensitivity propagation (0 or 1, should be part of options OR see the function\_call struct).

**flag\_hessian** [input] is the flag for second order Hessian propagation (0 or 1, should be part of options OR see the function\_call struct).

**Input and output data to the integrator:**

**x** [input] is the vector of size *nSystems* of the pointers to the initial values of the differential states for this integrator.

**xOut** [output] is the vector of size  $nSystems$  of the pointers to the end values of the differential states as a result of calling this integrator.

**sensOut** [output] is the vector of size  $nSystems$  of the pointers to the end values of the forward sensitivities as a result of calling this integrator.

**muOut** [output] is the vector of size  $nX + nP$  containing the backward derivatives as a result of calling this integrator.

**hessOut** [output] is the matrix of size  $(nX + nP) \times (nX + nP)p$  containing the second order derivatives as a result of calling this integrator.

**xa** [input,output] is the vector of size  $nSystems$  of the pointers to the initial **guess** of the algebraic states for this integrator (the guess can be updated by the integrator).

**p** [input] is the vector of size  $nP$  containing the free parameters for this integrator (sensitivities can be computed).

**od** [input] is the vector of size  $nOD$  containing the online data, i.e. fixed parameters for this integrator (no sensitivities are computed).

**Extra outputs to be evaluated:**

**nOutputs** [input] is the number of extra output functions (with each their own dimension).

**dimOutputs** [input] is the vector of size  $nOutputs$ , containing the dimension for each of the output functions (moved to function\_call struct!).

**sparsityOutputs** [input] is the matrix of dimension  $nOutputs \times (nX + nXA + nX)$ , defining the sparsity pattern for each output function with respect to the differential states, the algebraic variables and the state derivatives (moved to function\_call struct!).

**nGridOutputs** [input] is the vector of size  $nOutputs$ , containing the number of grid points on which each output function should be evaluated.

**gridOutputs** [input] is the vector of size  $nOutputs$  of the pointers to the grid points on which each output function should be evaluated.

**muOutputs** [input] is the vector of size  $nOutputs$  of the pointers to the backward seeds for each of the grid points defined by *gridOutputs*.

**valOutputs** [output] is the vector of size  $nOutputs$  of the pointers to the outputs evaluated on the grid points defined by *gridOutputs*.

**sensOutputs** [output] is the vector of size  $nOutputs$  of the pointers to the forward sensitivities of the outputs evaluated on the grid points defined by *gridOutputs*.



The functions (including AD) to be evaluated:

(This changed using the function\_call struct!!)

**rhs** [input] the function pointer to evaluate the right-hand side.

**jac** [input] the function pointer to evaluate the full Jacobian.

**vde\_forw** [input] the function pointer to evaluate the forward variational differential equations.

**vde\_adj** [input] the function pointer to evaluate the adjoint equations.

**vde\_hess** [input] the function pointer to evaluate the second order sensitivity equations.

**out\_vde\_forw** [input] is the vector of size *nOutputs*, containing the function pointers to evaluate the forward sensitivity equations for the outputs.

**out\_vde\_adj** [input] is the vector of size *nOutputs*, containing the function pointers to evaluate the adjoint equations for the output functions.

**out\_vde\_hess** [input] is the vector of size *nOutputs*, containing the function pointers to evaluate the second order sensitivity equations for the outputs.

Other memory:

**variables** [input,output] is the pointer to the warm variables space used by the specific solver from one call to the other. The variables space size (in doubles) is returned by a call to the function `integrator_SOLVERNAME_variables_double(integrator_in *input, struct integrator_solver_opts *opts)`.

**opts** [input] is the pointer to a structure of type `integrator_SOLVERNAME_opts` that defines the arguments (as e.g. maximum number of steps, minimum step size, desired tolerance, ... ) passed to the specific solver.

**work** [workspace] is the pointer to the working space used by the specific solver. The working space size (in doubles) is returned by a call to the function `integrator_SOLVERNAME_workspace_double(integrator_in *input, struct integrator_solver_opts *opts)`.

Furthermore, the function returns an int, that is defined in the following enum (TODO change the names to something better!!!):

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**ACADOS\_MINSTEP** Minimum step size reached.