

# ***MAD-NG – a standalone multiplatform tool for non-linear optics design and optimisation.***

**14<sup>th</sup> International Computational Accelerator Physics Conference.**

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**CERN-BE/ABP**

**2-5 October 2024 – Seeheim-Jugenheim**

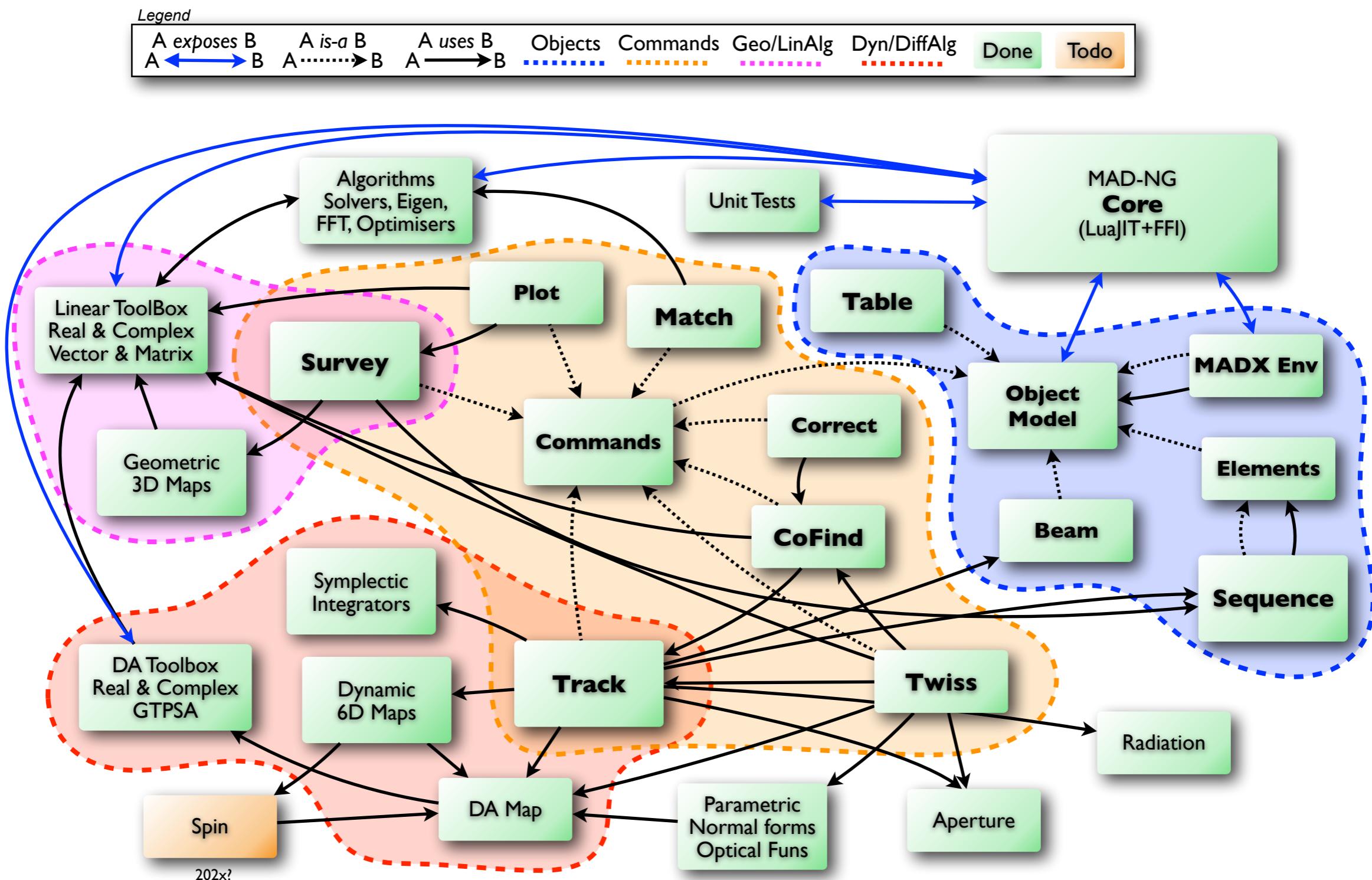
- **Long term design: easy to use and extend.**
  - **Flexible language** → **fast, simple, and general purpose scripting language.**
    - ▶ ~70% of the code is written in the Lua(JIT) scripting language, ~30% in C and C++.
  - **Flexible technologies** → **self-contained, all-in-one and modular application.**
    - ▶ Single “download & run” binary application, no dependencies (requires Gnuplot for plotting).
  - **Efficient & Portable technologies** → **embeds a Tracing Just in Time compiler.**
    - ▶ Same results everywhere (LNX, OSX, WIN), extensive unit tests (>8000) and examples.
    - ▶ Extremely simple and fast Foreign Function Interface (FFI) to C, C++, Fortran, etc...
  - **Easy to extend & support** → **embeds an online profiler and debugger.**
    - ▶ Adding and debugging new elements with new physics take less than a day.
- **5D & 6D physics using high-order differential algebra and symplectic integrators.**
  - ▶ Combined physics, combined elements, combined misalignments, local & global frames, slicing.
  - ▶ True RBend, Exact SBend (curved multipoles), Solenoid, Fringe fields for ALL, Patches, etc...
  - ▶ Physics & Maths in Lua and C/C++, **performance is x10-x80 faster than MADX-PTC.**
- **Open source software.**
  - License GPLv3, User manual (~200p, covers <25%), Lua Manual (29p).
  - Releases & Manual <https://cern.ch/mad/releases/madng/>
  - Online Manual <https://cern.ch/mad/releases/madng/html/>
  - Repository <https://github.com/MethodicalAcceleratorDesign/MAD>

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**Development started in 2016**

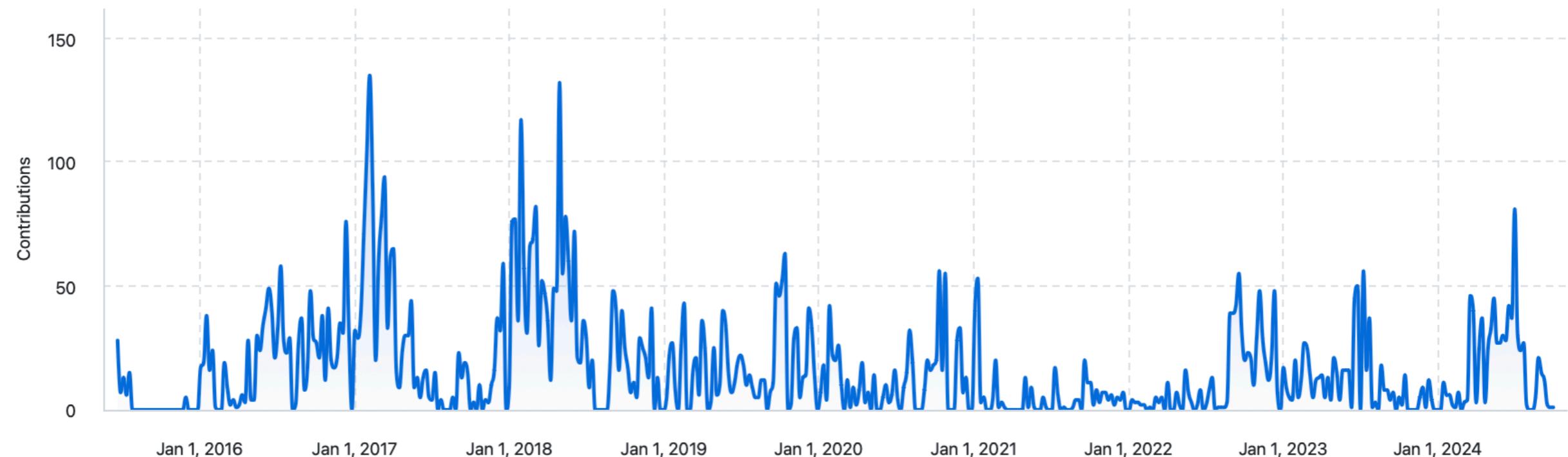
**First Twiss on LHC B1 & B2 in 2018**

# MAD-NG ecosystem



*Project Commits on Github***Commits over time**

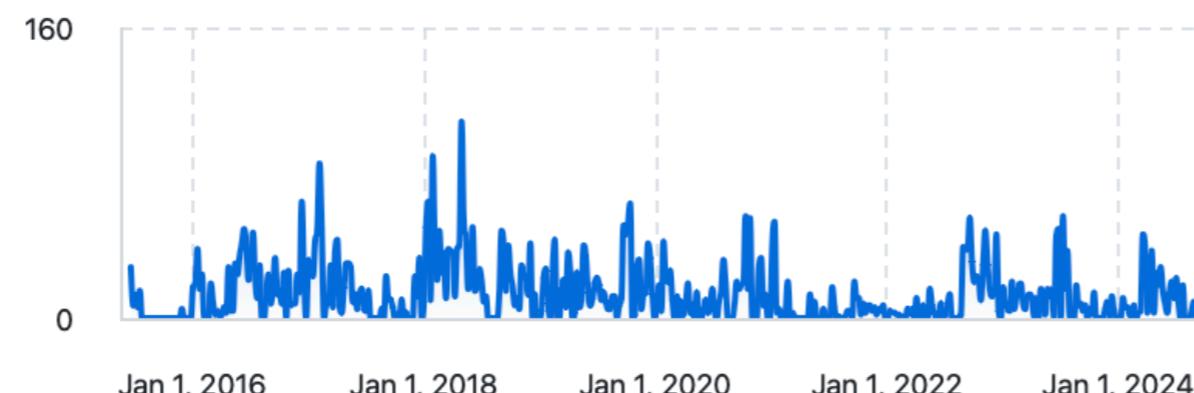
From 21 Jun 2015 to 29 Sep 2024

*Personal Commits on Github***Ideniau**6,496 commits 3,613,289 ++ 2,536,272 --

#1

...

Contributions



**~60000 lines of code  
~20000 lines in C/C++**

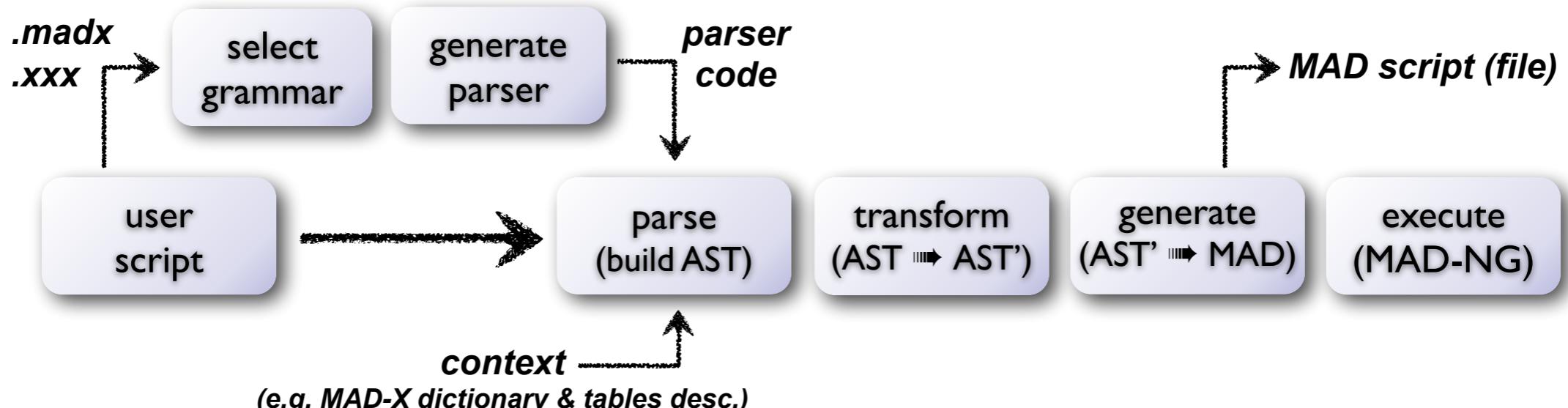
# PART I

## Design

- MAD-NG **loads and converts** MAD-X and MAD8 sequences, elements and variables, ***including deferred expressions***, **on-the-fly** into the MADX workspace (a MAD-NG context that emulates MAD-X global workspace) and optionally save conversion to files.

```
! convert MAD-X files on need, save to MAD file (disk), load to MADX workspace (memory)
MADX:load('lhc_as-built.seq'          , 'lhc_as-built.mad')
MADX:load('opticsfile.22_ctpps2'     , 'opticsfile.22_ctpps2.mad')
MADX:load('FCCee_z_213_nosol_18.seq', 'FCCee_z_213_nosol_18.mad')
```

- MAD-NG embeds technologies to **parse arbitrary language** that can be **described with PEG** (parser expression grammar > RegEx) to generate AST (abstract syntax tree), and apply transformations and/or evaluations, translating > 400 000 lines/sec.

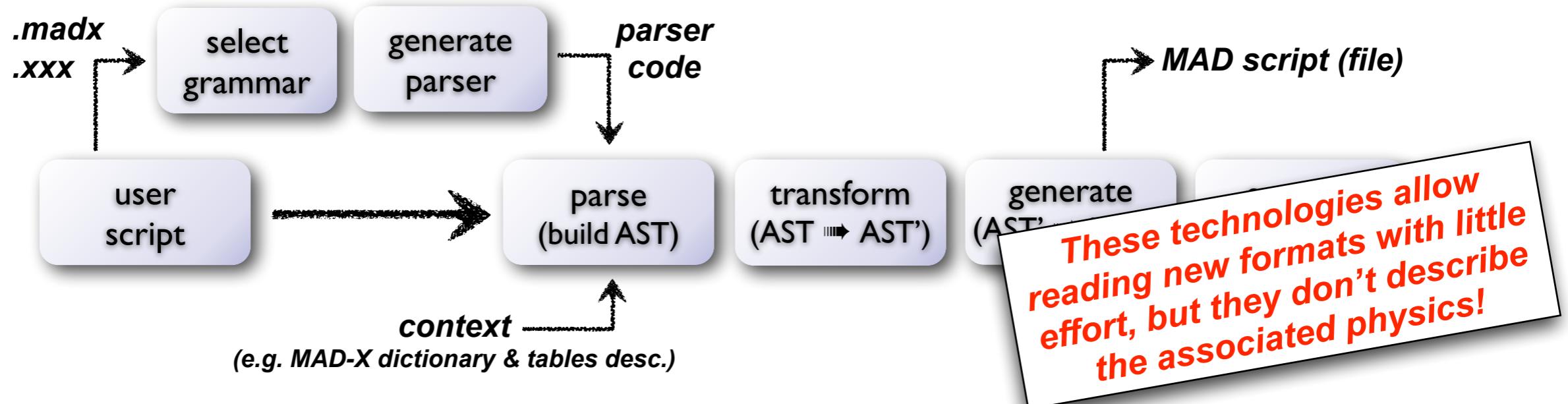


- MAD-NG can load MAD-X as a shared library (not as a subprocess like CPyMad) with direct fast access to MAD-X sequences, elements and variables, running at the speed of MAD-X itself (i.e. MAD-NG & FFI are faster than MAD-X).

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- Lattices definition as simple as in MAD-X but more flexible (syntax is very close)

- Sequences are **containers** (e.g. access elements) that can store arbitrary objects.
  - E.g. can store their **beam** or their own list of **knobs**.
- Elements are **containers** (e.g. access attributes) that can store arbitrary objects.
- Sequence can include **subsequences**, **beam lines**, **elements** (and **subelements**).
- **Operator overloading** (+, -, ×) allows to create sequences with the flexibility of *lines*.
- Names are optional and can be non-unique with support for *relative* or *absolute* counts.
  - Positions 'AT' can be absolute or relative 'FROM' names with absolute or relative counts.

- Manage arbitrary number of sequences to model an entire accelerators complex.

- **Shared sequences**, e.g. LHC B1 & B2.
  - Provides few sharing policies and name mangling.
- **Chained sequences**, e.g. Linac4+PSB+PS+SPS+LHC.
- **Conditionally chained sequences** (e.g. RaceTrack).
  - Based on special **s-link element**
  - Conditions for transition and lattice connections are performed through arbitrary user-defined functions.

<pre> SPS:   LINE = (6*SUPER); SUPER: LINE = (7*p44, INSERT, 7*p44); INSERT: LINE = (p24, 2*p00, p42); P00:   LINE = (qf, dl, qd, dl); P24:   LINE = (qf, dm, 2*b2, ds, pd); P42:   LINE = (pf, qd, 2*b2, dm, ds); P44:   LINE = (pf, pd); PD:    LINE = (qd, 2*b2, 2*b1, ds); PF:    LINE = (qf, 2*b1, 2*b2, ds); </pre>	<i>SPS in MAD-X</i>
<pre> pf      = bline {qf,2*b1,2*b2,ds} pd      = bline {qd,2*b2,2*b1,ds} p24     = bline {qf,dm,2*b2,ds,pd} p42     = bline {pf,qd,2*b2,dm,ds} p00     = bline {qf,dl,qd,dl} p44     = bline {pf,pd} insert  = bline {p24,2*p00,p42} super   = bline {7*p44,insert,7*p44} SPS     = sequence 'SPS' {6*super} </pre>	<i>SPS in MAD-NG</i>

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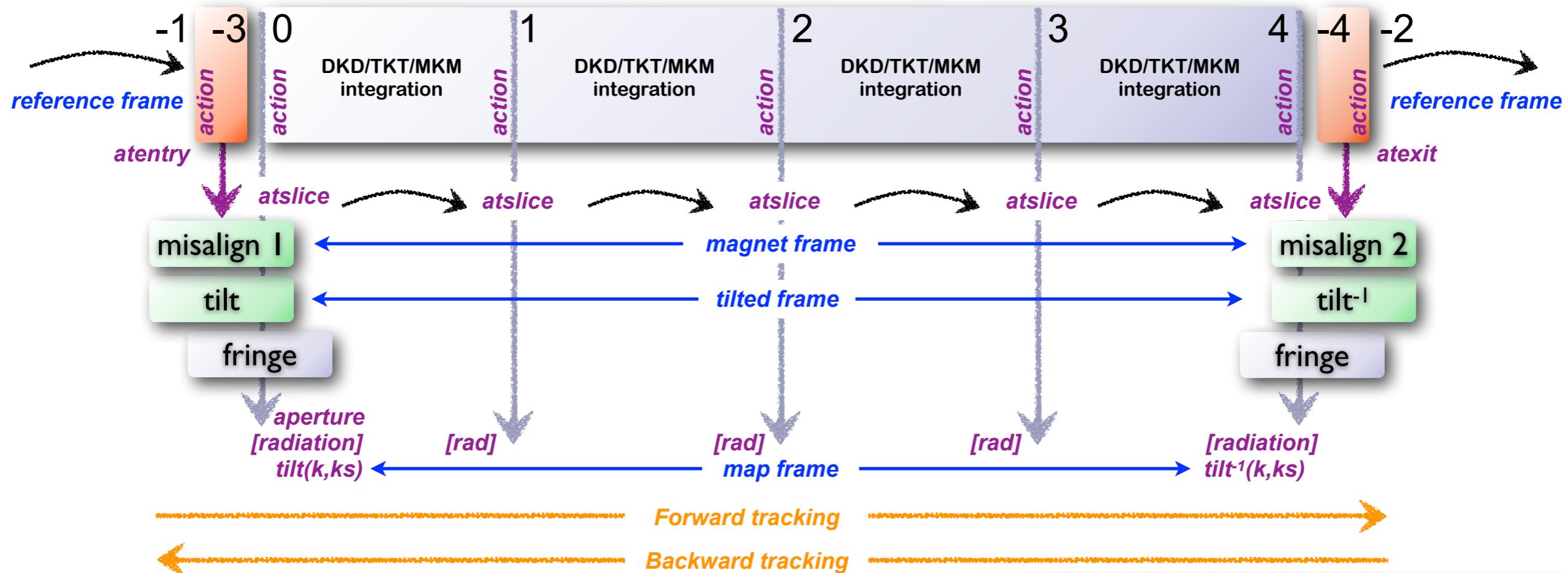
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**Unified definitions of lines and sequences with some extensions**

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# Element tracking: *frames, slices & actions*



- **Slicing** can be uniform or arbitrary (array, function).
- **Subelements** (thick or thin) can be inserted at arbitrary relative or absolute positions inside the parent element.
- **Installing** elements in sequence automatically (user choice) insert them as subelement upon collision.
- **Misalignments** (elements vs sequences) restore the frames on exit. Permanent misalignments (element property) use **patches**. Survey can consider misalignments (user choice) for global motion inside elements.

<code>atentry(elm, mflw, sdir)</code>	
<code>misalign(elm, mflw, sdir)</code>	
<code>tilt (ang, mflw, sdir)</code>	
<code>fringe (elm, mflw, sdir)</code>	DKD/TKT/MKM
<code>integr (elm, mflw, 1, thick, kick)</code>	
<code>fringe (elm, mflw, -sdir)</code>	atslice
<code>tilt (ang, mflw, -sdir)</code>	
<code>misalign(elm, mflw, -sdir)</code>	
<code>atexit (elm, mflw, -sdir)</code>	

## ● Actions are functions

- MAD-NG functions are *first class lexical closures* (fun & env) and can do everything...
  - ▶ i.e. **high order functions that can receive and return multiple arguments.**
- actions kinds: *atentry, atslice, atexit, ataper, atsave, atdebug*.
- **mechanism to customise or extend commands** (e.g. **Twiss** with **Track** and **Cofind**).

## ● Actions can be **combined** with combinators (and selectors).

- ▶ **chain(f<sub>1</sub>,f<sub>2</sub>)** → f<sub>1</sub>() ; return f<sub>2</sub>().
- ▶ **achain(f<sub>1</sub>,f<sub>2</sub>)** → return f<sub>1</sub>() **and** f<sub>2</sub>().
- ▶ **ochain(f<sub>1</sub>,f<sub>2</sub>)** → return f<sub>1</sub>() **or** f<sub>2</sub>().
- ▶ **compose(f<sub>1</sub>,f<sub>2</sub>)** → return f<sub>1</sub>(f<sub>2</sub>()).
- ▶ **ftrue, ffalse, fnil.**

## ● Actions can be **selected** by **selectors**:

- Selectors are functions to enable/disable actions based on some particular criteria  
e.g. slices number or any other user-defined criteria.  
*24 predefined selectors: atall, atentry, atbegin, atbody, atbound, atend, atexit, atmid, atcore, atstd, actionat, etc...*

## ● **Actions are triggered by Survey and Track engines during tracking**

- actions are chained so they are independent from each other.
- default for *ataper*: check for aperture *at slice 0 (titled frame)*.
- default for *atsave*: save data *at exit (reference frame)*.

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- actions kinds: atentry, atslice, atexit, *ataper*, *atsave*
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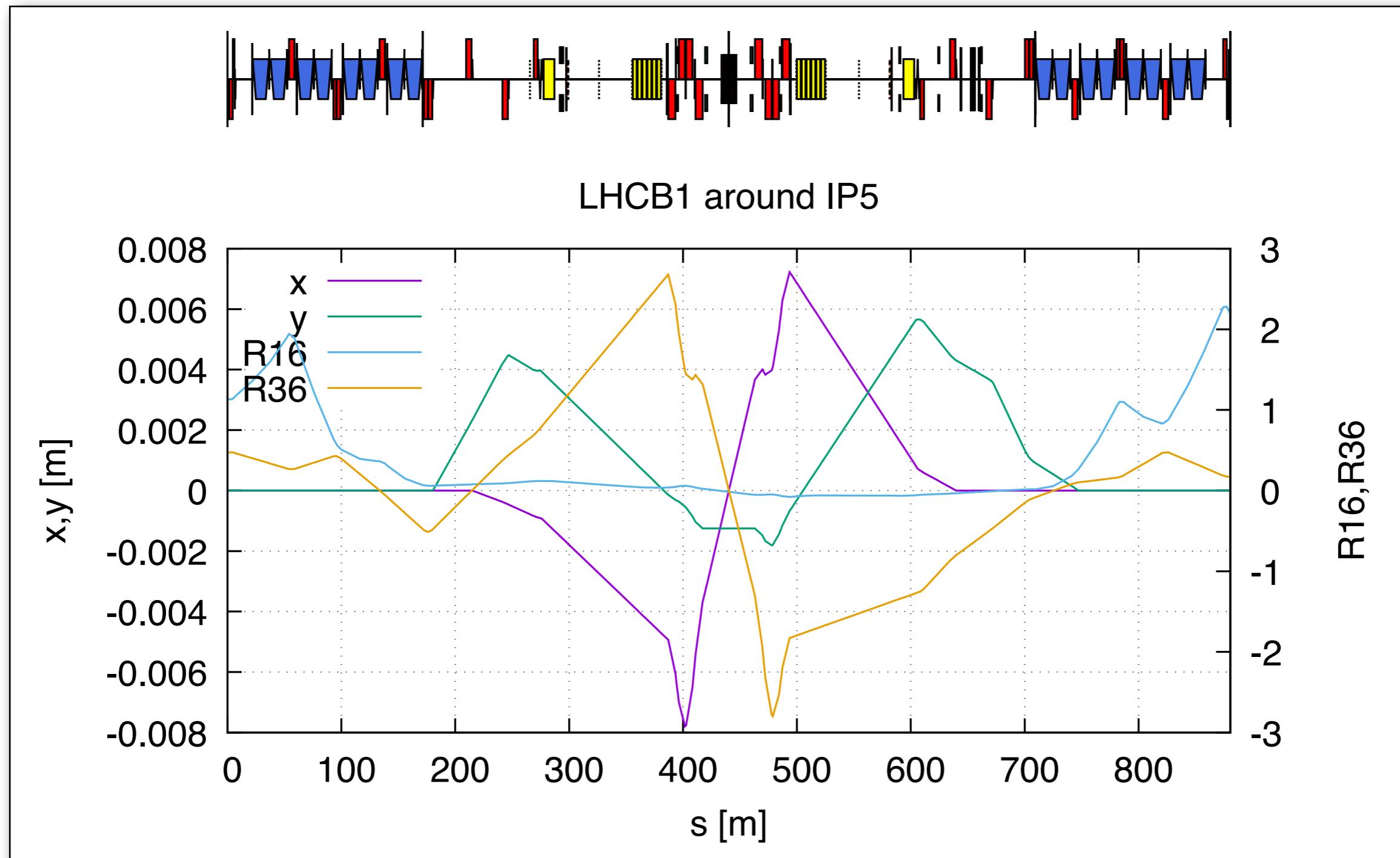
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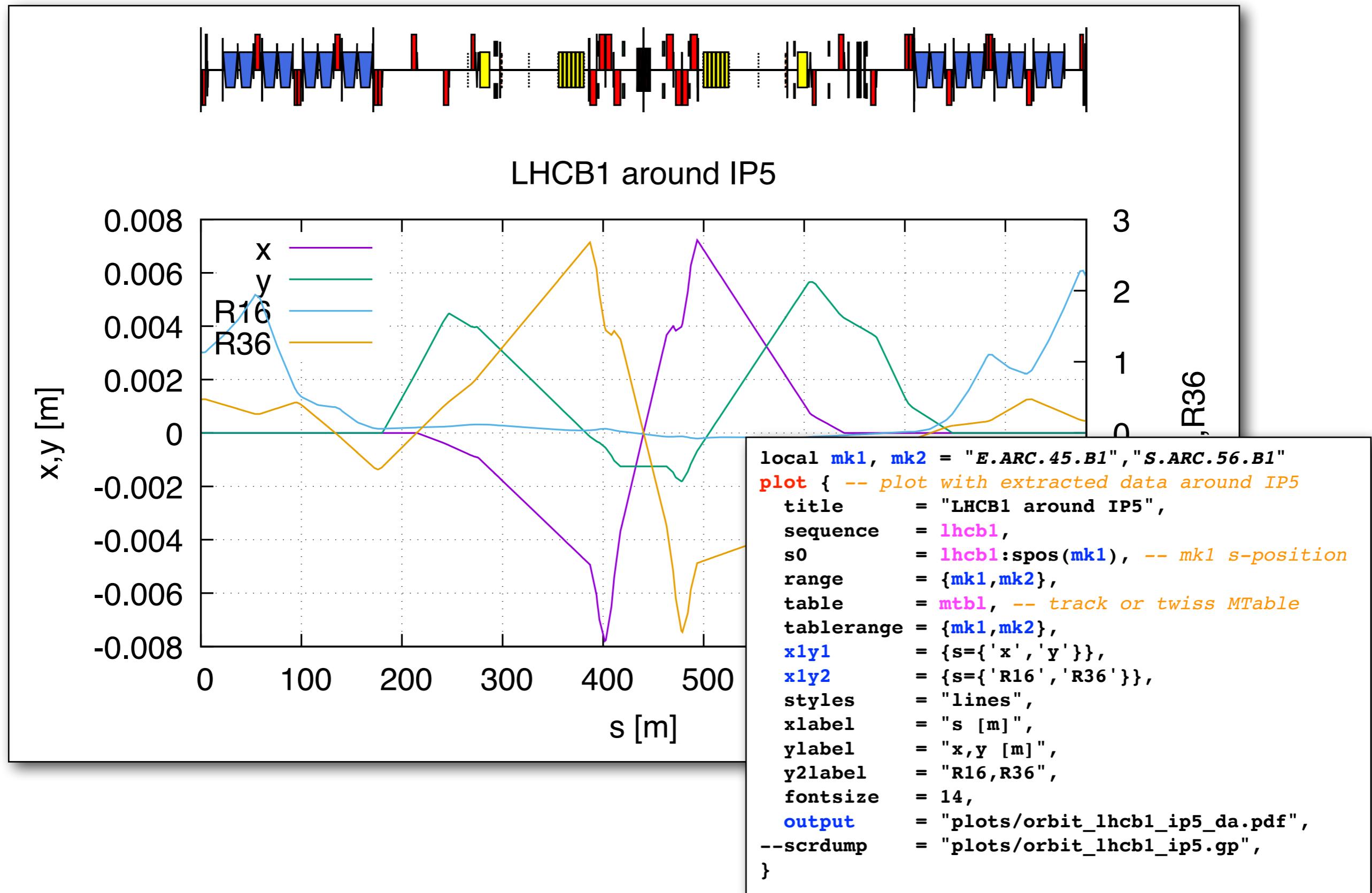
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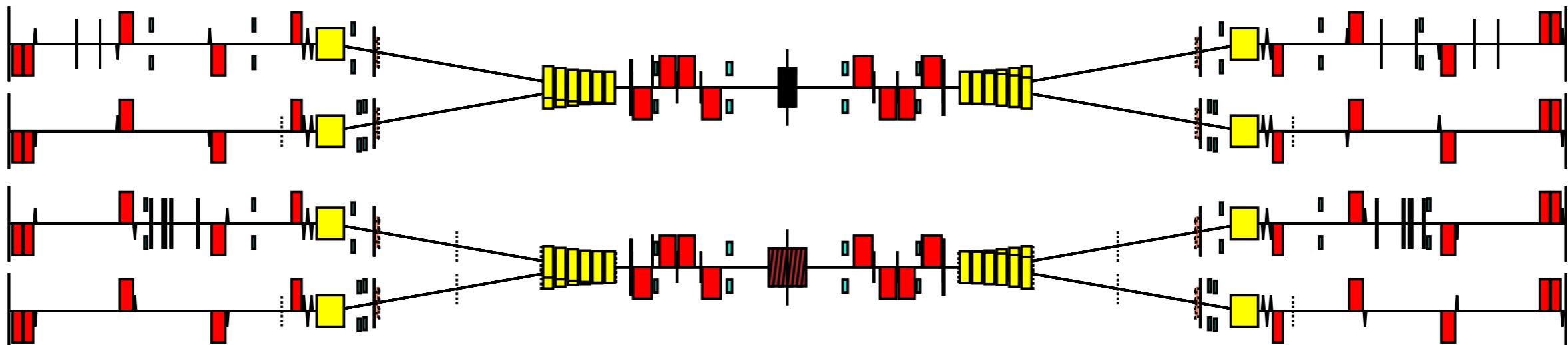
**Actions are lambda functions extending Survey and Track tracking engines:**

- radiation and aperture check are actions
- optic calculation (twiss) are actions
- saving data to MTable (TFS) are actions
- connecting sequences for parallel tracking
- replace, extend or wrap computations
- add extra physics locally or globally
- add multi-particles or DA maps physics
- etc...

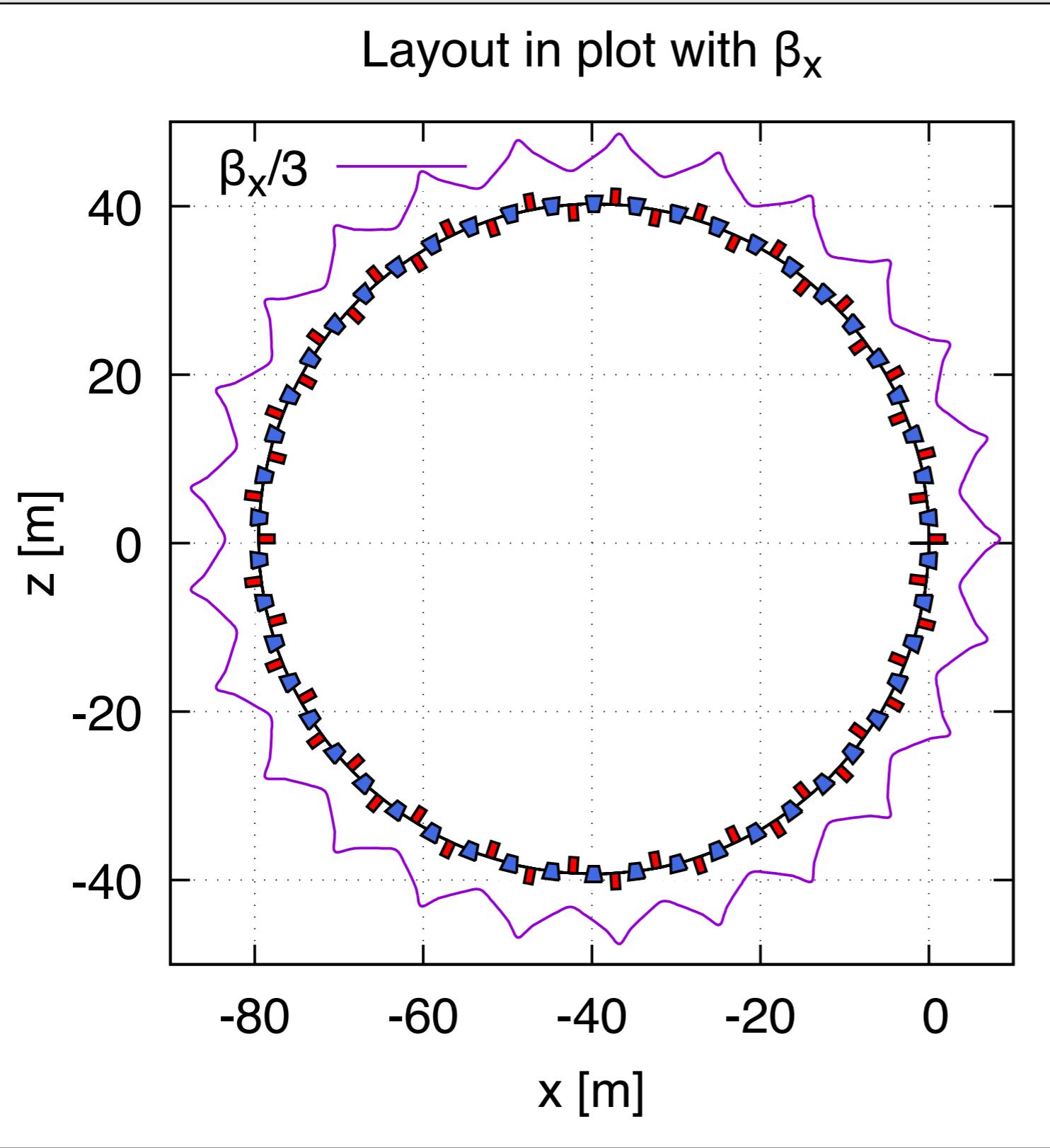


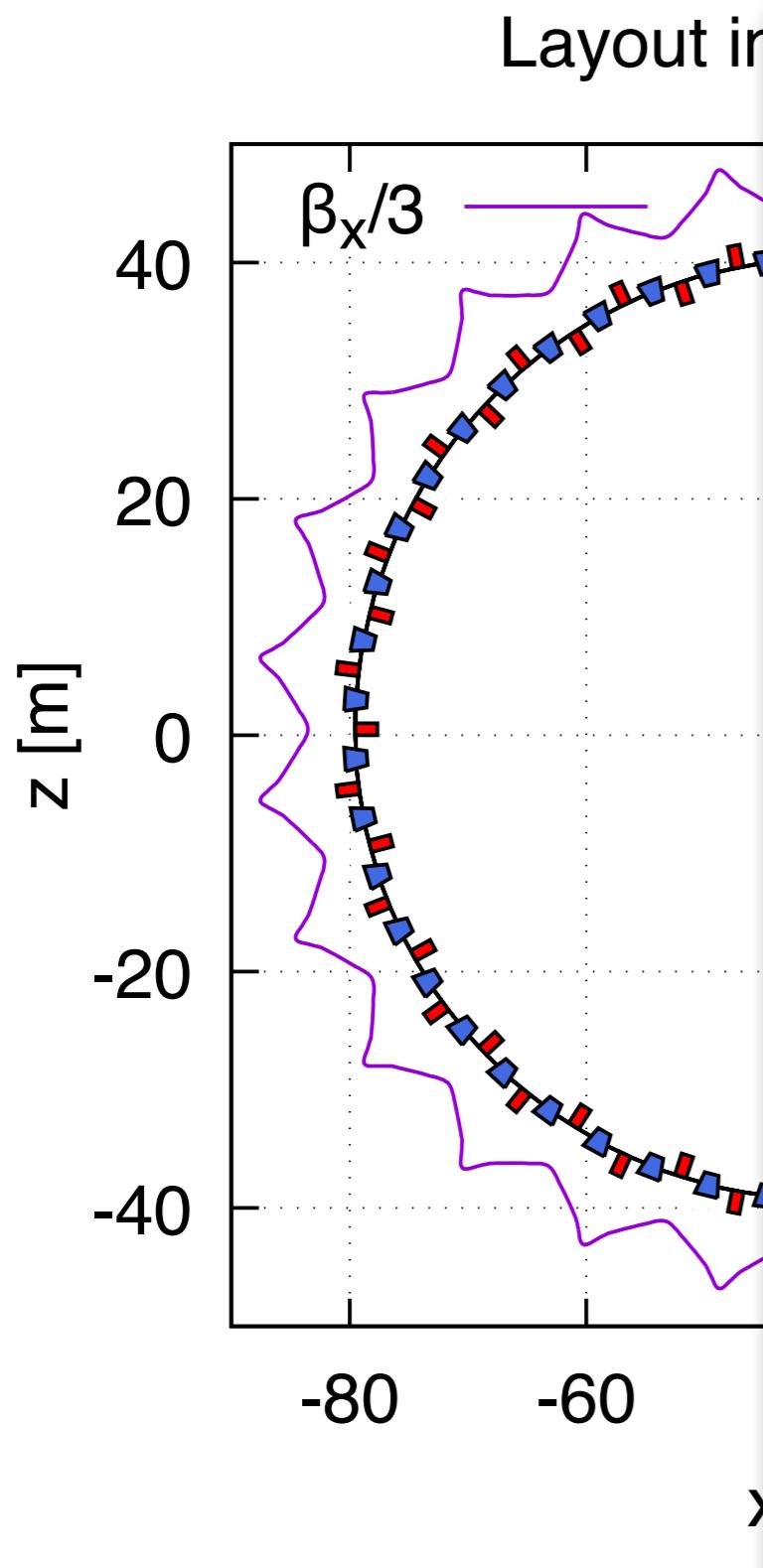






```
plot {
    sequence = { lhcb1, lhcb2, lhcb1, lhcb2 },
    range   = { ! Ranges for the 4 sequences above
                {"E.DS.L1.B1", "S.DS.R1.B1"}, {"E.DS.L1.B2", "S.DS.R1.B2"},
                {"E.DS.L5.B1", "S.DS.R5.B1"}, {"E.DS.L5.B2", "S.DS.R5.B2"} },
    laydisty = {
        lhcb2["E.DS.L1.B2"].mech_sep,           ! Second bline y-shift [m]
        -0.4,                                     ! Third bline y-shift [m]
        -0.4 + lhcb2['E.DS.L5.B2'].mech_sep ! Fourth bline y-shift [m]
    },
}
```





```

local ncell = 25
local mb = sbend { l=2 }
local mq = quadrupole { l=1 }
local cell = sequence { l=10, refer='entry',
    mq 'mq1' { at=0, k1=0.29601 },
    mb 'mb1' { at=2, angle := pi/ncell },
    mq 'mq2' { at=5, k1=-0.30242 },
    mb 'mb2' { at=7, angle := pi/ncell },
}
local seq = sequence 'seq' { ncell*cell, beam=beam }
local sv = survey { sequence=seq, nslice=5, save="atstd", mapsave=true }
local tw = twiss { sequence=seq, nslice=5, save="atstd" }

! compute betx in global frame
local bet11 = { x=vector(#sv), z=vector(#sv) }
local v, scl = vector(3), round(tw.bet11:max()/5)
for i=1,#sv do
    v = sv.W[i] * v:fill{3+tw.bet11[i]/scl, 0, 0}
    bet11.x[i], bet11.z[i] = v[1], v[3]
end
bet11.x = bet11.x+sv.x
bet11.z = bet11.z+sv.z

! plot layout of the ring and the betx
plot {
    sequence = seq,
    laypos   = "in",
    layonly  = false,
    title    = "Layout in plot with \u03b2_x",
    data     = { x=bet11.x, z=bet11.z },
    x1y1    = { x = 'z' },
    styles   = 'lines',
    xlabel   = "x [m]",
    ylabel   = "z [m]",
    legend   = { z = '\u03b2_x/'..scl },
}

```

Plots are gnuplot based, .gp script can  
be generated for further customisation.

```
from pymadng import MAD
-- create an instance of MAD-NG
madng = MAD()
```

*PyMAD-NG doc  
from Joshua Gray*

```
-- send script to MAD-NG
madng.send('''
MADX:load("lhc.seq" , "lhc.mad" ) -- load LHC B1 & B2 highly configurable through ~30000 deferred expr.
MADX:load("optics.madx", "optics.mad") -- load optics, e.g. variables & strengths involved in deferred expr.
MADX:load("knobs.madx" , "knobs.mad" ) -- load knobs, e.g. crossing-angle setup for collision optics
```

```
local damap, twiss, pymad in MAD
local lhcb1 in MADX
```

```
-- list of octupolar RDTs
local rdts = {"f4000", "f3100", "f2020", "f1120"}
```

```
-- create phase-space damap at 4th order
local x0 = damap {nv=6, mo=4}
```

```
-- twiss with RDTs along the ring
local mtbl = twiss {sequence=lhcb1, x0=x0, trkrdt=rdts}
```

```
-- send selected columns of MTable to Python
pymad:send{mtbl.s, mtbl.betall, mtbl.beta22, mtbl.f4000, mtbl.f3100, mtbl.f2020, mtbl.f1120}
```

```
-- send entire MTable to Python
pymad:send(mtbl)
```

*MAD-NG script*

```
)
```

```
-- receive selected columns of MTable from MAD-NG as Numpy arrays (vectors)
s, betall, beta22, f4000, f3100, f2020, f1120 = madng.recv()
```

```
-- receive entire MTable from MAD-NG and convert it to Pandas DataFrame
mtbl = madng.recv().to_df()
```

*Python script*

## PART II

# Physics

- **5D-6D PTC physics using differential algebra and symplectic integrators.**
  - ▶ combined physics & elements, slicing & frames, easy to extend, etc...
  - ▶ x10-30 faster than MADX-PTC for TPSA tracking.
- **Survey: geometrical tracking**
  - ▶ Survey supports **multi-turns**, **ranged** and step-by-step **forward**, **backward** and **reverse** geometrical tracking.
  - ▶ Support **exact** misalignments, **permanent** misalignments, and patches.
  - ▶ Output MTable (TFS) fully compatible with Track for combining observable points (*smooth plots, slicing, actions, sub-elements, combining local & global frame, etc...*)
- **Track: dynamical tracking**
  - ▶ Track supports **multi-particles** or **multi-damaps**, **multi-turns**, **ranged** and step-by-step **forward**, **backward** and **reverse** dynamical tracking of **charged** particles to **arbitrary differential order** with an arbitrary number of **parameters** (few hundreds).
  - ▶ Support **exact** misalignments, **permanent** misalignments, combined **multipoles** & field errors **for all elements**, and **patches** (frame changes).
  - ▶ **Symplectic integrators up to 8th (12th) order** on 5D and 6D phase space (*PTC-like exact=true, time=true, totalpath e.g. for thick RF*).
  - ▶ Support both **thick** and **thin** lens models, **radiation** (including photons tracking), **fringe fields** for all elements, **mutable particles** (multiple beams), **exact patches** (translations, rotations & time-energy), weak-strong beam-beam, any aperture shape.
  - ▶ Output MTable (TFS) fully compatible with Survey for combining observable points.

### ● **Cofind: fix point search**

- ▶ Meta command that extends **Track** with actions and run a Newton-based optimiser iteratively calling **Track** with either (user-choice):
  - 1st order DA map (TPSAs)
  - 13 particles with 2nd order central finite differences (less stable) to obtain the Jacobian.

### ● **Twiss: normal form tracking**

- ▶ Meta command that extends **Track** with actions to compute optics on-the-fly and fill the twiss MTable (extended track MTable) by running the following commands:
  - **Cofind** iterates over Track to find a closed orbit.
  - **Track** DA maps on the closed orbit to obtain high order one-turn map (OTM).
  - **Normal** to obtain the linear & non-linear normal forms from the OTM.
  - **Track** normalising forms and compute optical functions and RDTs.
- ▶ Computes coupled linear and non-linear optical functions, tunes, chromaticities, Generating Functions (RDTs), Hamiltonian Terms, synchrotron integrals, compaction factor, phase slip factor, gamma transition, Montague functions, etc...

### ● **Correct: orbit correction**

- ▶ Provides few algorithms (e.g. SVD, Micado) and many options to correct the orbit using Beam Position Monitors (BPM) and Correctors (H-V Kickers).

- **Match: highly configurable optimiser**

- ▶ On the model of MAD-X use \_macro approach, but with arbitrary user's setups & runs.
- ▶ Provides all kinds of local & global, linear & non-linear, optimiser (~20 algorithms).
- ▶ Very flexible, highly configurable with many **physics-oriented** constraints and objectives, i.e. not just a penalty-function to minimise.

- **Normal: parametric normal forms & analysis**

- ▶ Provides linear and **non-linear parametric normal forms** on high order DA maps to compute RDTs and perform analysis. Can be triggered at observable points only to speed up the matching of local constraints.  
**Non-linear normal forms and RDTs tracking are *x50-80 faster than MADX-PTC*,** fast enough to train **machine learning models** that we use extensively at CERN.

- Generalised Truncated Power Series Algebra

IPAC 2015

- Multivariate Taylor polynomials of order  $n$  in  $\mathbb{R} & \mathbb{C}$ .

2017-2018

- Powerful tool for solving differential equations (e.g. motion equations).

Github MAD

TPSA coefficients

1 variable  $x$  at order  $n$  in the *neighbourhood* of the point  $a$  in the domain of the function  $f$ :

$$T_f^n(x; a) = f(a) + f'(a)(x - a) + \frac{f''(a)}{2!}(x - a)^2 + \dots + \frac{f^{(n)}(a)}{n!}(x - a)^n = \sum_{k=0}^n \frac{f_a^{(k)}}{k!}(x - a)^k$$

convergence of the remainder (i.e. truncation error):

$$\lim_{n \rightarrow \infty} R_f^n(x; a) = \lim_{n \rightarrow \infty} f(x) - T_f^n(x; a) = 0$$

*f(x) is an analytic function,  $T_f^n(x; a)$  is a polynomial approximation nearby  $a$  with radius of convergence  $h$ :  $\min_{h>0} \lim_{n \rightarrow \infty} R_f^n(a \pm h; a) \neq 0$ .*

2 variables  $(x, y)$  at order 2 nearby  $(a, b)$ :

$$T_f^2(x, y; a, b) = f(a, b) + \frac{\partial f}{\partial x} \Big|_{(a,b)} (x - a) + \frac{\partial f}{\partial y} \Big|_{(a,b)} (y - b) + \dots$$

*homogeneous polynomials*

$$+ \frac{1}{2!} \left( \frac{\partial^2 f}{\partial x^2} \Big|_{(a,b)} (x - a)^2 + 2 \frac{\partial^2 f}{\partial x \partial y} \Big|_{(a,b)} (x - a)(y - b) + \frac{\partial^2 f}{\partial y^2} \Big|_{(a,b)} (y - b)^2 \right)$$

*f must not depend on the integration path*

$v$  variables  $X$  at order  $n$  nearby  $A$ :

$$T_f^n(X; A) = \sum_{k=0}^n \frac{f_A^{(k)}}{k!} (X; A)^k = \sum_{k=0}^n \frac{1}{k!} \sum_{|\vec{m}|=k} \binom{k}{\vec{m}} \frac{\partial^k f}{\partial X^{\vec{m}}} \Big|_A (X; A)^{\vec{m}}$$

*monomials of order k*

*TPSA coefficients*

with  $\binom{k}{\vec{m}} = \frac{k!}{c_1! c_2! \dots c_v!}$

*multinomial*

- GTPSA are **exact** to machine precision, **no** approximation for orders 0..n
  - Differential algebra (DA) is computed using **automatic differentiation** (AD).

*from Wikipedia*

AD exploits the fact that every computer program, no matter how complicated, executes a sequence of elementary arithmetic operations (addition, subtraction, multiplication, division, etc.) and elementary functions (exp, log, sin, cos, etc.). By applying the **chain rule** repeatedly to these operations, **derivatives of arbitrary order can be computed automatically, accurately to working precision**, and using at most a small constant factor more arithmetic operations than the original program.

**Symbolic differentiation** can lead to **inefficient code** and faces the difficulty of converting a computer program into a single expression, while **numerical differentiation** can introduce **round-off errors** in the **discretization process and cancellation**. **Both classical methods have problems with calculating higher derivatives, where complexity and errors increase.**

- MAD-NG includes a complete toolbox (i.e. module) to handle DA using AD...
  - users have full access to GTPSA and DAmaps from the scripting language.
  - users can manipulate DAmaps stored in the MTable or the MFlow returned by Track.
- *So when DAmap/TPSA introduce errors? (Something that we never do...)*
  - If they are used as *functions* (e.g. evaluated), instead of *DA* (e.g. track, twiss).
  - High orders of  $T_f^n(x; a)$  are used to interpolate at the new position by substitution, e.g. MADX.

$$T_f^n(x; a + h) = \sum_{k=0}^n \frac{f_{a+h}^{(k)}}{k!} (x - a - h)^k ; \quad f(a + h) \approx \underbrace{\sum_{k=0}^n \frac{f_a^{(k)}}{k!} h^k}_{T_f^n(a + h; a)} ; \quad f_{a+h}^{(k)} \approx \frac{d^k T_f^n(x; a)}{dx^k}(a + h)$$

*Matrix codes  
don't do better!*

*order n is constant  
order n-1 is linear in h*

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*from Wikipedia*

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Functions of TPSAs ≠ TPSAs as functions  
exact ≠ approximate

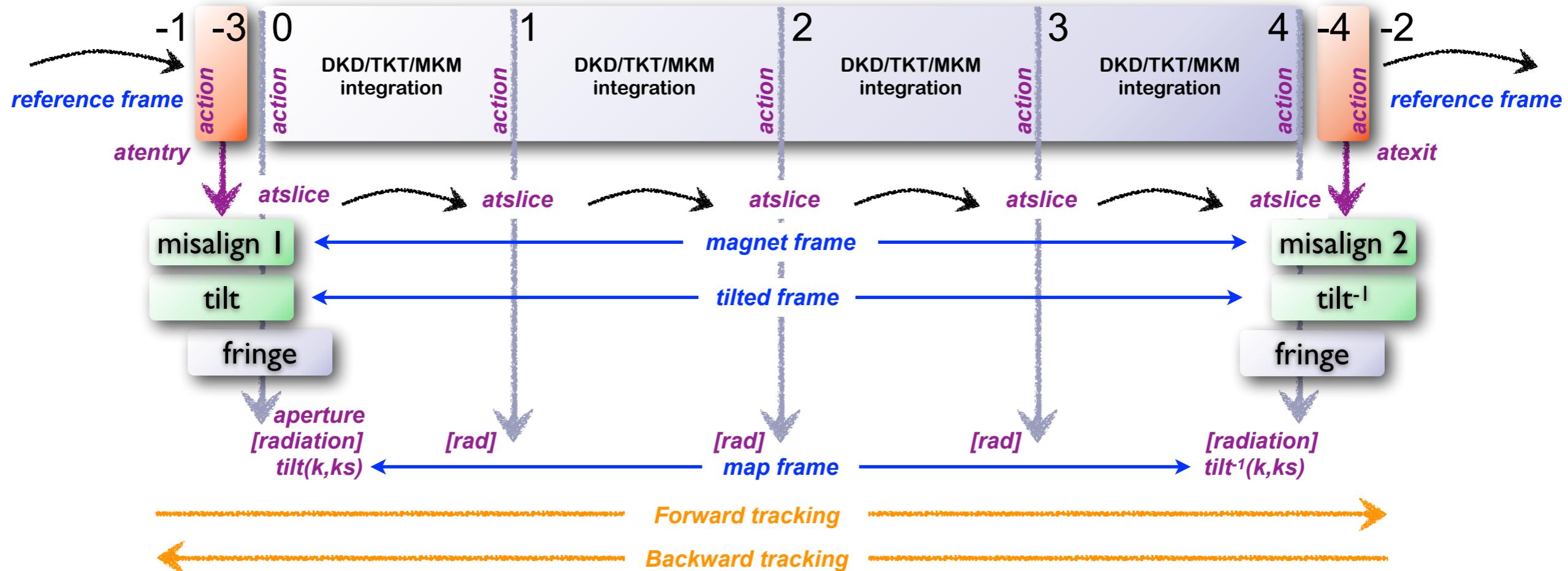
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Matrix codes  
don't do better!

order n is constant  
order n-1 is linear in h

# Element tracking: physics selection



- When entering an element (before slice -1), the Track engine delegates to the element's the responsibility to select its own physics amongst a catalogue of **physics maps** and **symplectic integrators**.
- This element-dependent selection is based on the *tracking context*, the *element attributes* retrieved and **their values when entering**, i.e. can vary during tracking.
- It selects the **tracking** engine (the box), the **DKD, TKT or MKM model**, the **integrator** scheme and its **order**, the “**thick**” and “**kick**” maps to be integrated, the “**fringe**” map, and runs the element **track**ing engine with this setup.

Simplified element Tracking engine

```

atentry(elm, mflw, sdir)
misalign(elm, mflw, sdir)
tilt (ang, mflw, sdir)
fringe (elm, mflw, sdir) DKD/TKT/MKM
integr (elm, mflw, 1, thick, kick)
fringe (elm, mflw, -sdir) atslice
tilt (ang, mflw, -sdir)
misalign(elm, mflw, -sdir)
atexit (elm, mflw, -sdir)

```

```

local function curex_drift (elm, m, lw, istp)

local ld = (m.eld or m.el)*lw
local ang, rho = m.eh*m.el*lw*m.edir, 1/m.eh*m.edir
local ca, sa, sa2 = cos(ang), sin(ang), sin(ang/2)
local beta = m.beam.beta — cache value of beta

for i=1,m.npar do
  local x, px, y, py, t, pt in m[i]

  local dpp1 = 1 + 2/beta*pt + pt^2
  local pz = sqrt(dpp1 - px^2 - py^2)
  local _pz = 1/pz
  local pxt = px*_pz
  local _ptt = 1/(ca - sa*pxt)
  local pst = (x+rho)*sa*_pz*_ptt

  m[i].x = (x + rho*(2*sa2^2 + sa*pxt))*_ptt
  m[i].px = ca*px + sa*pz
  m[i].y = y + pst*py
  m[i].t = t - pst*(1/beta+pt) + (1-m.T)/beta*ld
end

end

```

```

template <typename M,           — type of map flow
          typename T=M::T,   — type of variable
          typename P=M::P,   — type of parameter
          typename R=M::R>  — type of parameter reference
inline void curex_drift (cflw<M> &m, num_t lw, int istp)
{
  P ld  = (fval(m.eld) ? R(m.eld) : R(m.el))*lw;
  P ang = R(m.eh)*R(m.el)*lw*m.edir, rho = 1/R(m.eh)*m.edir;
  P ca  = cos(ang), sa = sin(ang), sa2 = sin(ang/2);

  FOR(i,m.npar) {
    M p(m,i);

    T dpp1 = 1 + 2/m.beta*p.pt + sqr(p.pt);
    T pz = sqrt(dpp1 - sqr(p.px) - sqr(p.py));
    T _pz = 1/pz;
    T pxt = p.px*_pz;
    T _ptt = 1/(ca - sa*pxt);
    T pst = (p.x+rho)*sa*_pz*_ptt;

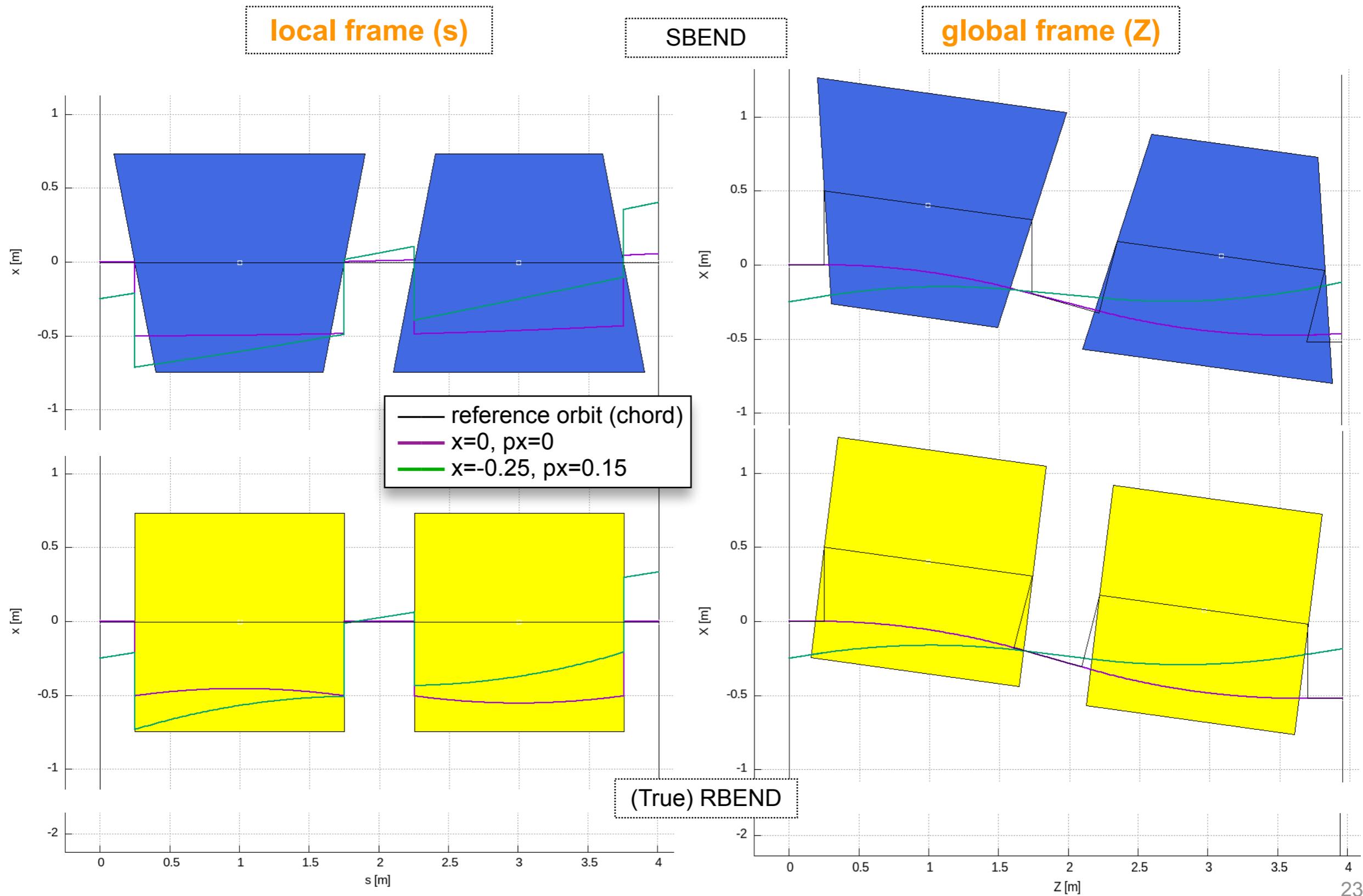
    p.x = (p.x + rho*(2*sqr(sa2) + sa*pxt))*_ptt;
    p.px = ca*p.px + sa*pz;
    p.y += pst*p.py;
    p.t -= pst*(1/m.beta+p.pt) - (1-m.T)/m.beta*ld;
  }
}

```

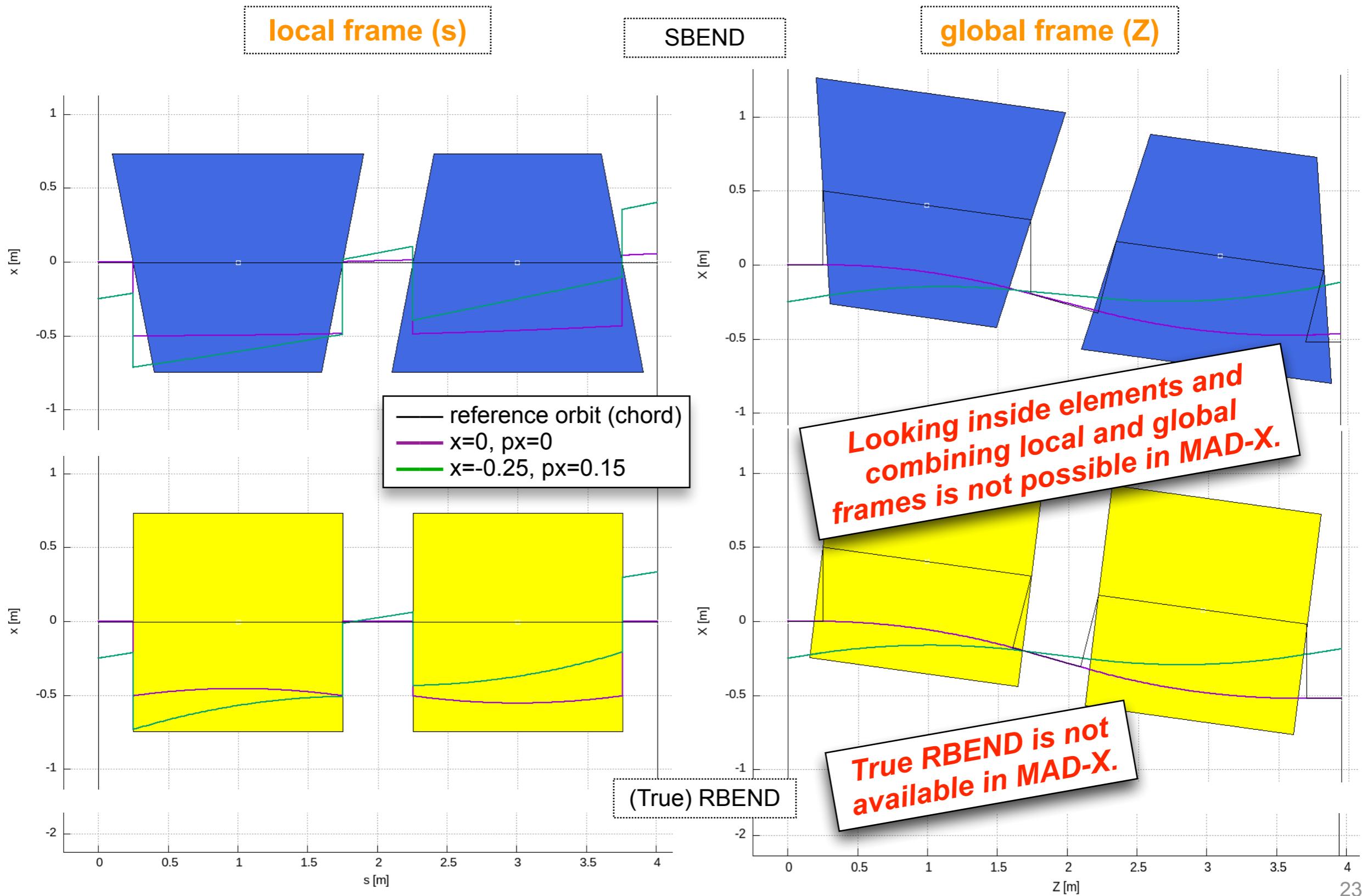
Map for the exact drift in a curved frame,  
e.g. selected by the sector bend for DKD.

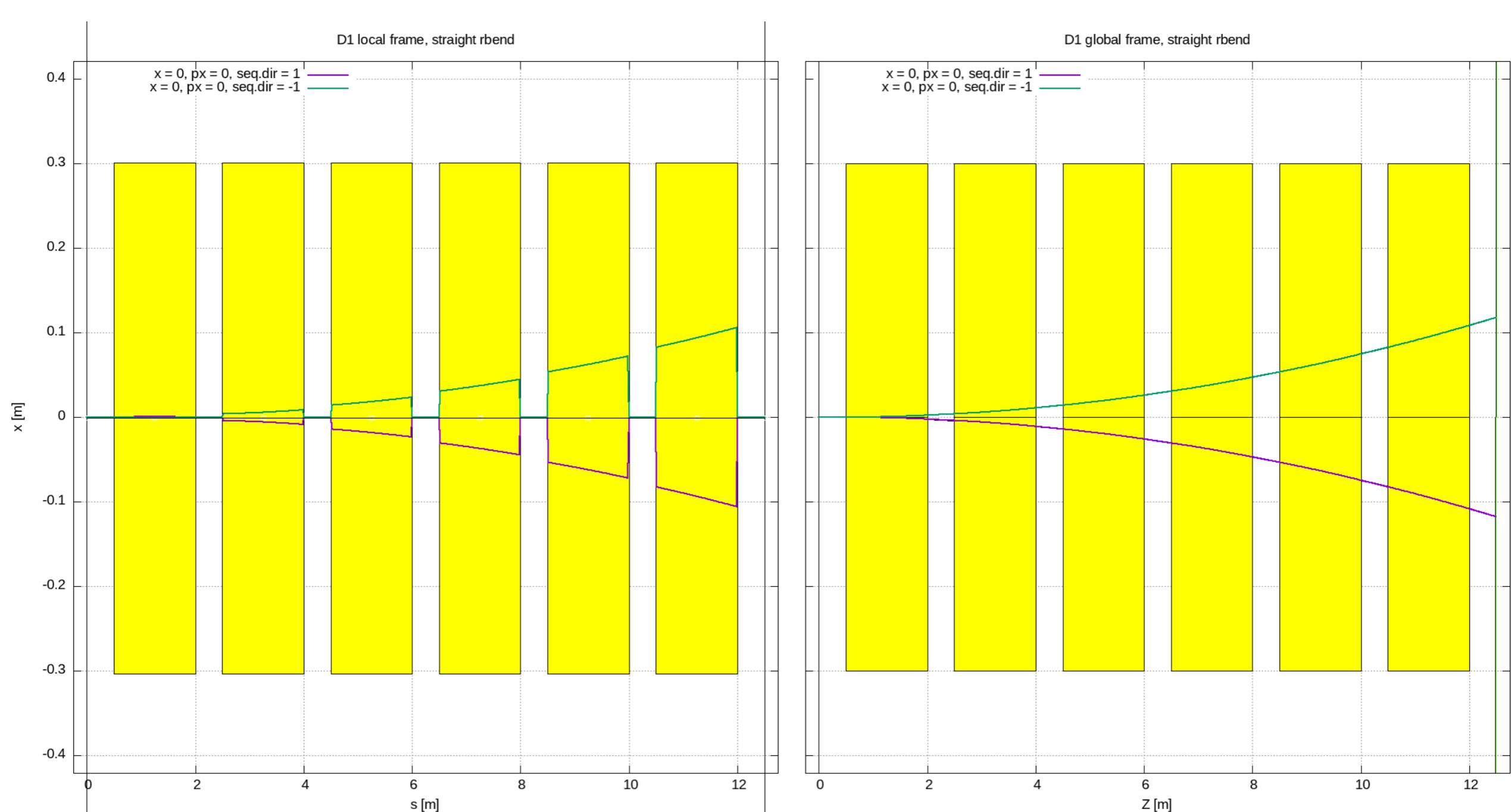
## ● C++ vs Lua code

- Both are simple to read: extensive use of **operator overloading**.
- Both are fully polymorphic: same code for particles, DA maps, and ***parametric DA maps***.
- Performances: GTPSA C++ classes use **better memory management** than Lua's garbage collector, resulting in a ***speed improvement of x7***.
- cmap=true/false: both codes can be used for crosscheck or **rapid development**.



# Local & Global Frames: combining misalignments





- reference orbit
- seq1.dir=1, x=0, px=0
- seq2.dir=-1, x=0, px=0

## PART III

# Applications

```

-- set knobs: scalar + TPSA -> TPSA
MADX.sk1r = MADX.sk1r + X0.sk1r
MADX.sk2r = MADX.sk2r + X0.sk2r
MADX.sk3r = MADX.sk3r + X0.sk3r
MADX.sk4r = MADX.sk4r + X0.sk4r

match {
  command := track {sequence=lhcbl, X0=X0, savemap=true},

  jacobian = \t,_,jac => -- gradient not used, fill only Jacobian
    jac:setrow(1.. 8, t['S.DS.L2.B1'].__map:getm(mjac) )
    jac:setrow(9..16, t['E.DS.L2.B1'].__map:getm(mjac) )
end,

variables = { rtol=1e-6, -- 1 ppm
  { name='sk1r', var='MADX.sk1r' },
  { name='sk2r', var='MADX.sk2r' },
  { name='sk3r', var='MADX.sk3r' },
  { name='sk4r', var='MADX.sk4r' },
},

local x0 = damap {nv=6, mo=2, np=4, po=1,
  pn={'sk1r','sk2r','sk3r','sk4r'}}

local mjac = { ---> variables & knobs
  { var='x' , '0010001','00100001','001000001','0010000001' }, --
  { var='x' , '0001001','00010001','000100001','0001000001' }, --
  { var='px', '0010001','00100001','001000001','0010000001' }, --
  { var='px', '0001001','00010001','000100001','0001000001' }, -- v constraints
}

equalities = {
  { name='S.R11.x', expr = \t -> t['S.DS.L2.B1'].__map.x :get'0010' },
  { name='S.R12.x', expr = \t -> t['S.DS.L2.B1'].__map.x :get'0001' },
  { name='S.R21.x', expr = \t -> t['S.DS.L2.B1'].__map.px:get'0010' },
  { name='S.R22.x', expr = \t -> t['S.DS.L2.B1'].__map.px:get'0001' },

  { name='E.R11.x', expr = \t -> t['E.DS.L2.B1'].__map.x :get'0010' },
  { name='E.R12.x', expr = \t -> t['E.DS.L2.B1'].__map.x :get'0001' },
  { name='E.R21.x', expr = \t -> t['E.DS.L2.B1'].__map.px:get'0010' },
  { name='E.R22.x', expr = \t -> t['E.DS.L2.B1'].__map.px:get'0001' },
},
objective = { fmin=1e-12 },
maxcall=100, info=2
}

-- unset knobs: restore scalar values from TPSA
MADX.sk1r = MADX.sk1r:get0()
MADX.sk2r = MADX.sk2r:get0()
MADX.sk3r = MADX.sk3r:get0()
MADX.sk4r = MADX.sk4r:get0()

```

### Timing summary and links to codes:

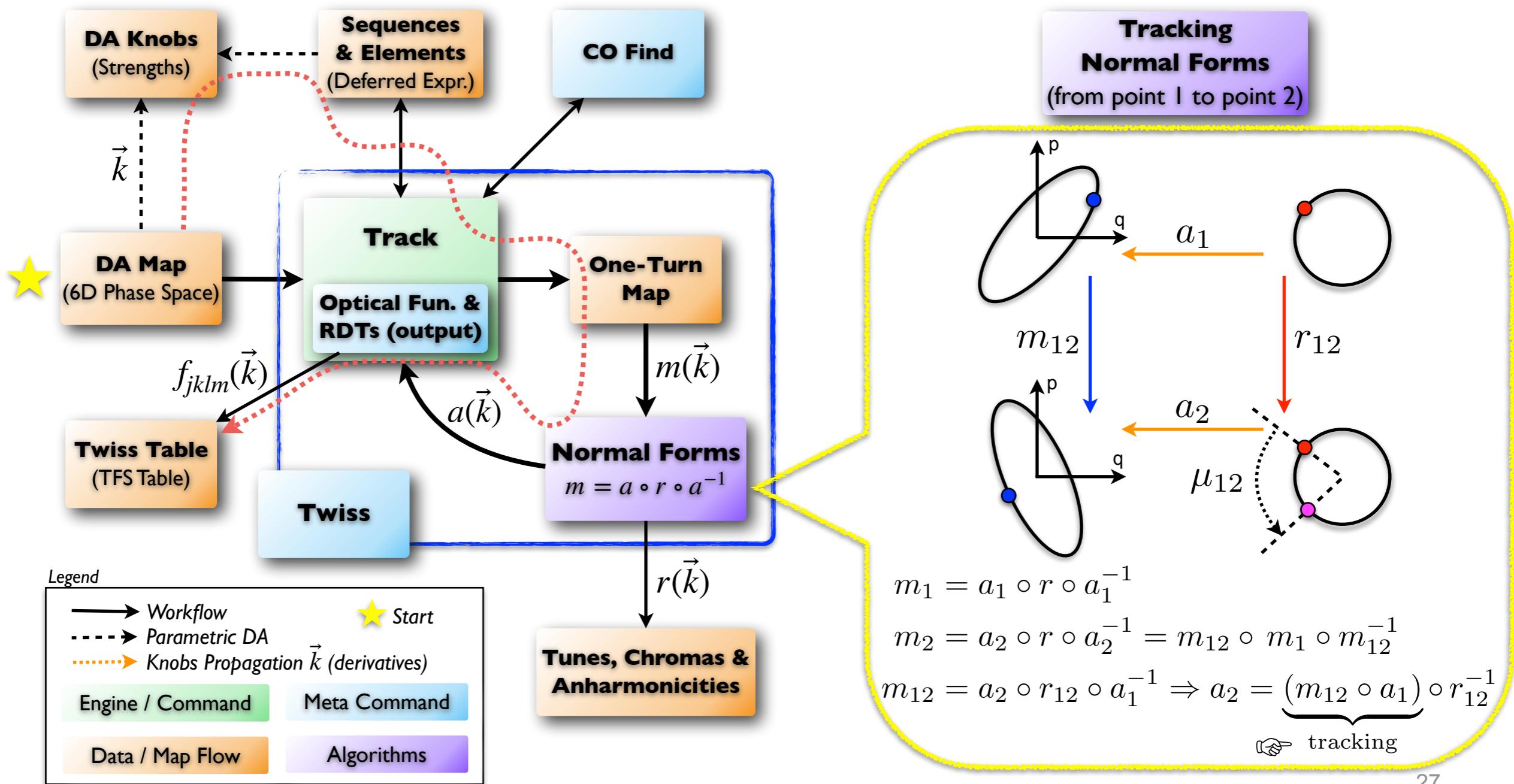
MAD-X using R matrix **1 min 55s**

MAD-NG using R matrix **21s**

MAD-NG using R matrix & knobs **10s**

MADX-PTC using alphas-betas **~ 50 min**

Track a **high-order differential algebra** (DA) map on the closed orbit (optionally) equipped with **parameters** (knobs) to obtain the **one-turn map**  $m$ , then compute the **closed non-linear normal form**  $m = a \circ r \circ a^{-1}$  and track the normalising map  $a$  to extract the **optical functions** ( $\alpha, \beta, \mu$ , etc.) and the **resonant driving terms** (RDTs) along the lattice.



# MAD-NG studies: RDTs for HL-LHC

```
-- HL-LHC setup
MADX:load("hlhc_saved.seq", "hlhc_saved.mad")
MADX.lhcb1.beam = beam {particle="proton", energy=450}
MADX.lhcb2.beam = beam {particle="proton", energy=450}
MADX.lhcb2.dir = -1 -- bv = -1

-- list of RDTs
local rdts = {"f4000", "f3100", "f2020", "f1120"}

-- loop over lhcb1 and lhcb2
for _,lhc in ipairs{MADX.lhcb1, MADX.lhcb2} do

    -- create phase-space damap at 4th order
    local x0 = damap {nv=6, mo=4}

    -- compute RDTs along HL-LHC
    local mtbl = twiss {sequence=lhc, x0=x0, trkrdt=rdts}

    -- plot RDTs along HL-LHC
    plot_rdt(mtbl, rdts)

end -- end of loop
```

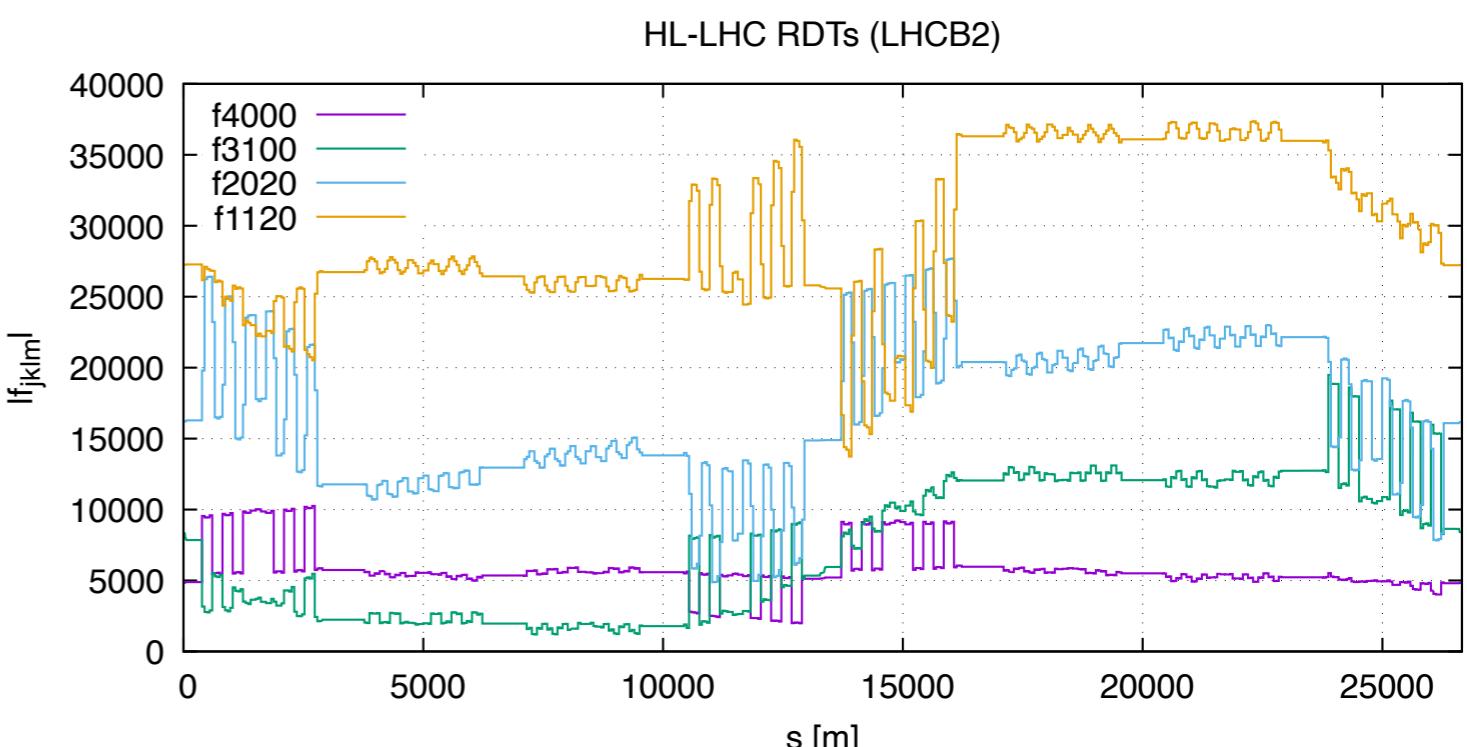
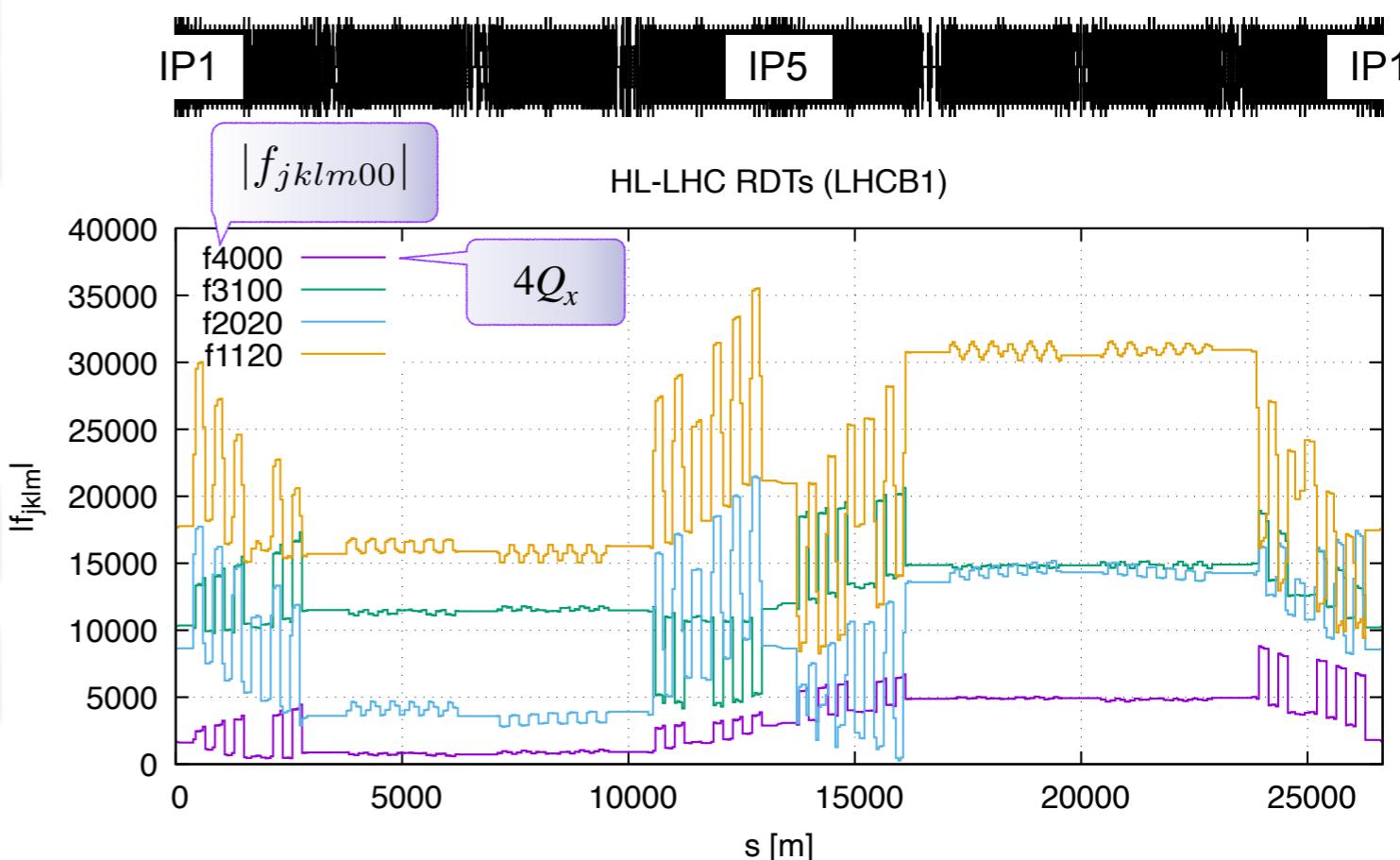
$$f_{jklm} = \frac{h_{jklm}}{1 - e^{2\pi i[(j-k)\nu_x + (l-m)\nu_y]}}$$

Resonances:  $N = (j - k)Q_x + (l - m)Q_y$

Spectral lines:  $H(1 + k - j, m - l)$

$V(k - j, 1 + m - l)$

These 2 RDTs' plots take  
32 sec in MAD-NG  
40 min in MADX-PTC



```
-- HL-LHC setup
MADX:load("hllhc_saved.seq", "hllhc_saved.mad")
MADX.lhcb1.beam = beam {particle="proton", energy=450}
MADX.lhcb2.beam = beam {particle="proton", energy=450}
MADX.lhcb2.dir = -1 -- bv = -1

-- list of knobs for both sequences
local knbs = { LHCB1 = {'ksf1.a45b1', 'ksf2.a45b1'},
                LHCB2 = {'ksf1.a45b2', 'ksf2.a45b2'} }

-- list of RDTs: 4Qx w 1st and 2nd derivatives vs knobs
local rdts = {"f40000000", "f40000010", "f40000020",
               "f40000011", "f40000001", "f40000002", }

-- loop over lhcb1 and lhcb2
for _,lhc in ipairs{MADX.lhcb1, MADX.lhcb2}

    -- select knobs
    local knb = knbs[lhc.name]

    -- create phase-space damap at 6th order (mo=4th+po)
    local x0 = damap {nv=6, mo=6, np=#knb, po=2, pn=knb}

    -- set knobs: scalar + TPSA -> TPSA
    for _,k in ipairs(knb) do MADX[k] = MADX[k]+x0[k] end

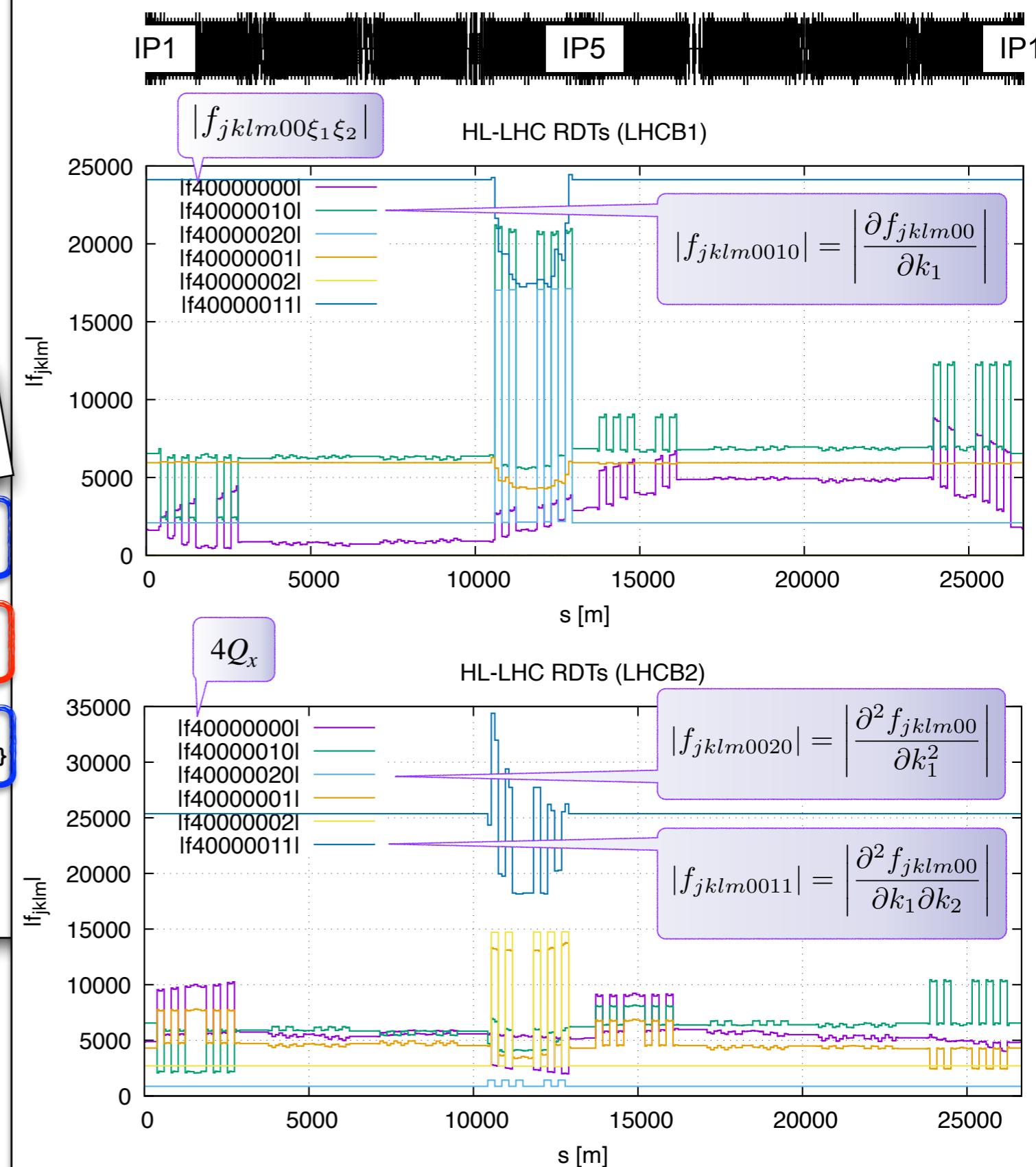
    -- compute RDTs along HL-LHC
    local mtbl = twiss {sequence=lhc, X0=x0, trkrdt=rdts }

    -- plot RDTs along HL-LHC
    plot_rdt(mtbl, rdts)

end -- end of loop
```

$$f_{jklmno\xi_1\xi_2} = \frac{\partial^{\xi_1+\xi_2} f_{jklmno}}{\partial k_1^{\xi_1} \partial k_2^{\xi_2}}$$

DA map order =  $j + k + l + m + n + o + \sum_i \xi_i$



## Loading LHC Sequences & Optics (1)

```
MADX:load'lhc_seq.madx'
MADX:load'inj_optics.madx'
MADX.lhcb1.beam = beam {particle='proton', energy=450}
MADX.lhcb2.beam = beam {particle='proton', energy=450}
MADX.lhcb2.dir = -1 -- set LHCb2 as reversed
```

## Building Parametric DA Map (2)

```
local prms = { -- param./knob names (strings)
    -- 16 strengths of trim quadrupoles families
    'kqtf.a12b1', 'kqtf.a23b1', ..., 'kqtf.a81b1',
    'kqtd.a12b1', 'kqtd.a23b1', ..., 'kqtd.a81b1',
    -- 16 strengths of octupoles families
    'kof.a12b1', 'kof.a23b1', ..., 'kof.a81b1',
    'kod.a12b1', 'kod.a23b1', ..., 'kod.a81b1',
}

-- DA map representing parametric phase-space
local X0 = damap {nv=6, mo=5, np=#prms, po=1, pn=prms}

-- convert scalars to GTPSAs within MADX env.
for _, knb in pairs(prms) do
    MADX[knb] = MADX[knb] + X0[knb]
end
```

32 Circuit Knobs  
16 MQT + 16 MO

5th-order  
parametric  
DA map

Use strengths as  
DA map parameters

## Parametric Normal Forms & Setup (3)

```
-- function to compute non-linear normal forms
local function get_nf (lhc, X0)
    local _, mflw = track {sequence=lhc, X0=X0}
    return normal(mflw[1]):analyse("all")
end

-- save reference values
local nf = get_nf(X0, MADX.lhcb1)
local q1ref = nf:q1{1}
local q2ref = nf:q2{1}
local q1jref = nf:anhx{1,0}
local q2jref = nf:anhy{0,1}
```

Twiss-like RDTs @ IP1  
(faster for single point)

A solution is found by:  
MAD-NG in 3 min  
MADX-PTC in 45 min  
(using finite difference approx.)

## Optimizing RDTs (4 & 5)

```
match {
    -- compute non-linear normal forms
    command := get_nf(), -- returns nf used below

    -- compute Jacobian from parametric maps
    jacobian = \nf, _, J =>
        for k=1,32 do -- fill [10x32] J matrix
            J:set(1,k, nf:q1{1,k} or 0)
            J:set(2,k, nf:q2{1,k} or 0)
            J:set(3,k, nf:anhx{1,0,0,k})
            J:set(4,k, nf:anhy{0,1,0,k})
            J:set(5,k, nf:gnfu{"2002",k}.re)
            J:set(6,k, nf:gnfu{"2002",k}.im)
            J:set(7,k, nf:gnfu{"4000",k}.re)
            J:set(8,k, nf:gnfu{"4000",k}.im)
            J:set(9,k, nf:gnfu{"0040",k}.re)
            J:set(10,k,nf:gnfu{"0040",k}.im)
        end
    end,
```

$$\frac{\partial Q_x}{\partial k_i}, \frac{\partial Q_y}{\partial k_i}, \frac{\partial^2 Q_x}{\partial J_x \partial k_i}, \frac{\partial^2 Q_y}{\partial J_y \partial k_i}$$

$$\frac{\partial f_{2002}}{\partial k_i}, \frac{\partial f_{4000}}{\partial k_i}, \frac{\partial f_{0040}}{\partial k_i}$$

32 knobs to vary

10 constraints  
to satisfy

```
-- variables in MADX env. to use as knobs
variables = {
    {name=prms[1], var='MADX[prms[1]]'},
    ...,
    {name=prms[32], var='MADX[prms[32]]'},
},
```

```
-- target constraints as equalities to zero
equalities = {
    {name = 'q1' , expr = \nf -> nf:q1{1} - q1ref},
    {name = 'q2' , expr = \nf -> nf:q2{1} - q2ref},
    {name = 'q1j1' , expr = \nf -> nf:anhx{1,0} - q1jref},
    {name = 'q2j2' , expr = \nf -> nf:anhy{0,1} - q2jref},
    {name = 'f2002r' , expr = \nf -> nf:gnfu{"2002"}.re - 0},
    {name = 'f2002i' , expr = \nf -> nf:gnfu{"2002"}.im - 0},
    {name = 'f4000r' , expr = \nf -> nf:gnfu{"4000"}.re - 0},
    {name = 'f4000i' , expr = \nf -> nf:gnfu{"4000"}.im - 0},
    {name = 'f0040r' , expr = \nf -> nf:gnfu{"0040"}.re - 0},
    {name = 'f0040i' , expr = \nf -> nf:gnfu{"0040"}.im - 0},
},
} -- close match
```

Invariant

$$Q_x, Q_y, \frac{\partial Q_x}{\partial J_x}, \frac{\partial Q_y}{\partial J_y}$$

Minimise

$$f_{2002}$$

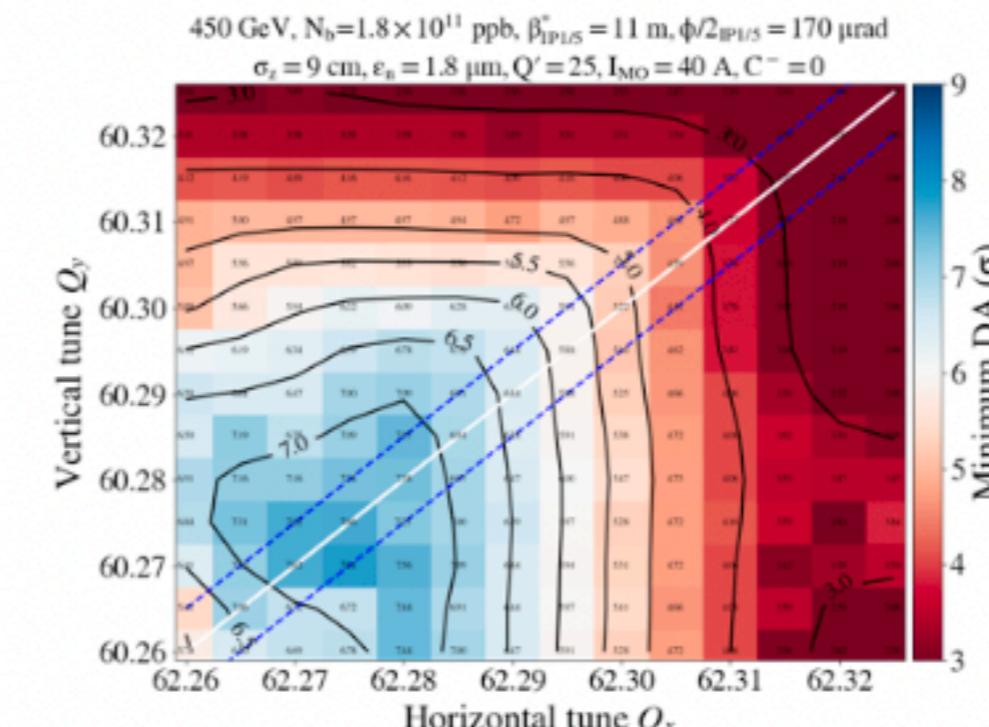
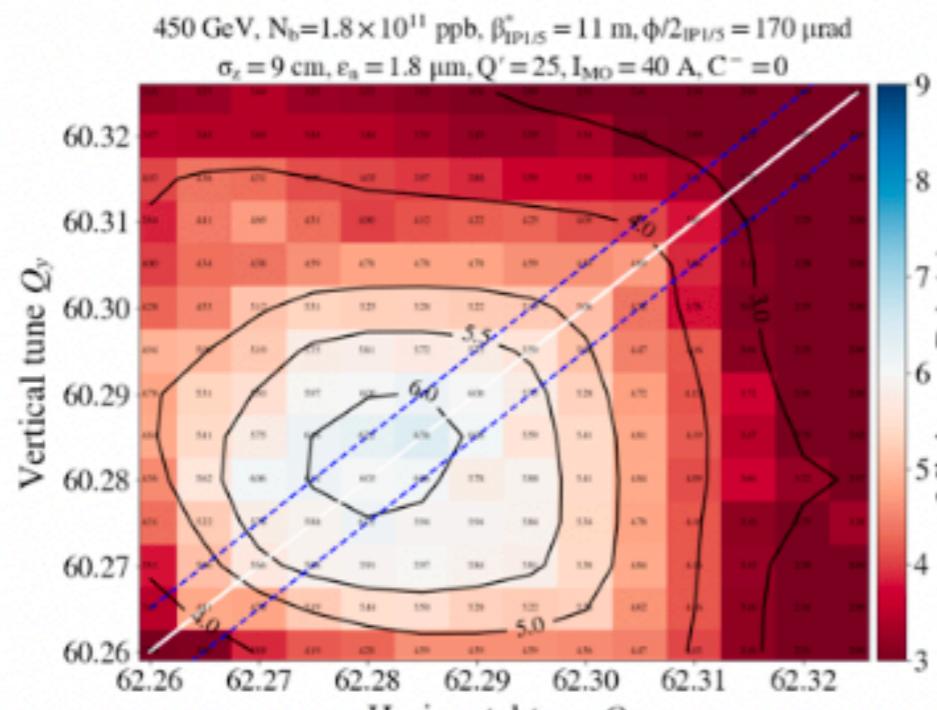
$$f_{4000}$$

$$f_{0040}$$

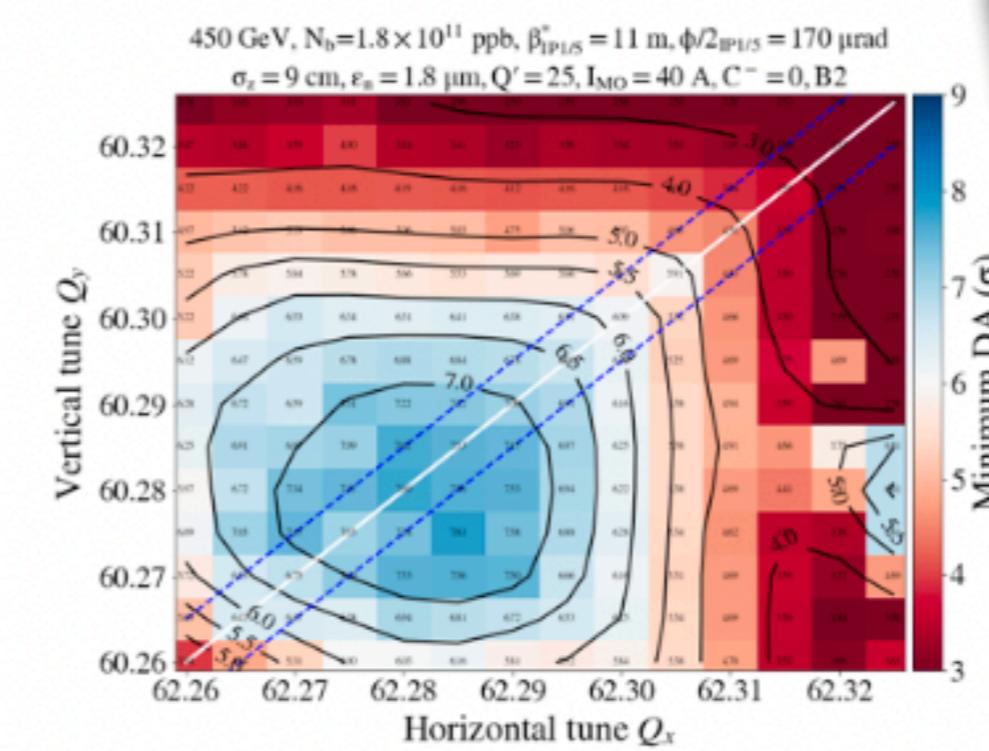
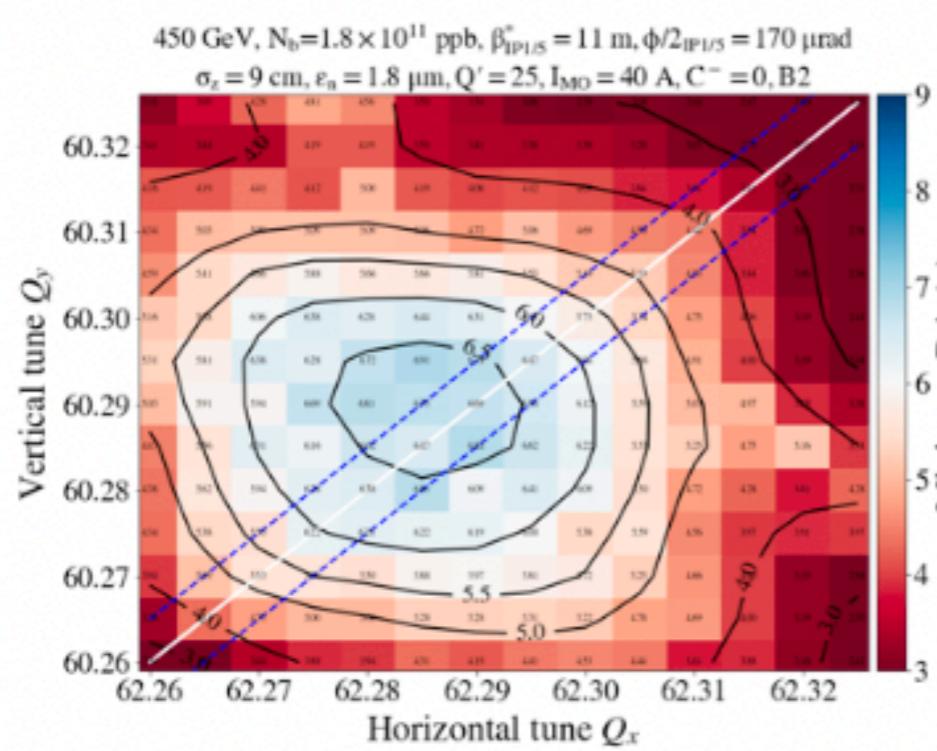
Match has the same structure  
as in MAD-X with "use\_macro"

## Dynamic Aperture Improvements

Dynamic aperture for beam 1 (top) and beam 2 (bottom) with old (left) and new (right) injection optics for LHC. Lowering the octupolar RDTs has significantly improved the dynamic aperture at injection.



**Courtesy  
S. Kostoglou**



**Beam lifetime  
x3 @ injection**

```
-- LHC setup
MADX:load("lhc_saved.seq", "lhc_saved.mad")
local lhcb1 in MADX
lhcb1.beam = beam {particle="proton", energy=450}

-- run twiss for tunes comparison
local tw = twiss {sequence=lhcb1}

-- track setup
local np = 64          -- number of particles
local nt = 1024         -- number of turns
local rho = 1e-6         -- amplitude [m]
local ang = 90/(np-1)   -- angle step [deg]
local x0 = {}            -- list of particles

-- create list of np particles (populate the phase space)
for i=1,np do
  x0[i] = {x=rho*cos(rad(ang*(i-1))),
            y=rho*sin(rad(ang*(i-1))), px=0,py=0,t=0,pt=0}
end

-- track np particles to collect turn-by-turn oscillations
local tk = track {sequence=lhcb1, nturn=nt, X0=x0}
assertf(tk.lost == 0, "unexpected %d particle(s) lost", tk.lost)

-- reshape coordinates for matrix operations
local xn = tk.x:copy():reshape(nt, np)
local yn = tk.y:copy():reshape(nt, np)

-- compute np real 1D-FFT, one for each particle (columns)
local xf = xn:rfft'col'
local yf = yn:rfft'col'

-- compute sum of amplitudes for each frequency (rows)
local qx = xf:sumabs'row':real()
local qy = yf:sumabs'row':real()

-- find max amplitude indexes (tunes)
local _, xi = qx:iminmax()
local _, yi = qy:iminmax()

-- print results
io.write("TUNES")
io.write("Qx_ref = ", tw.q1, ", Qx = ", (xi-1)*0.5/(#qx-1), "\n")
io.write("Qy_ref = ", tw.q2, ", Qy = ", (yi-1)*0.5/(#qy-1), "\n")
```

## Results

### TUNES

$Q_x \text{ ref} = 62.275051, Q_x = 0.275390625$   
 $Q_y \text{ ref} = 60.295050, Q_y = 0.294921875$

### TIMINGS

Track: 146s

Other: < 1s

= 2.2ms / particle / turn  
= 450 LHC\_turns / s / particle  
(40 min for 1 000 000 turns)

*Not so bad for a dynamic scripting language!*

## Optics Measurements and Corrections Team

**Lattice corrections based on model**

- **Huge impact from use of MAD-NG**  
(mad-x/PTC replacement in development by L.Deniau)
- **Significant reduction to simulation times needed to obtain free RDTs**
- **e.g. knobs for beam-beam 3Qy correction found in  $\approx 20$ mins compared to study likely taking  $\geq$  days with previous codes**

OMC@LMC, E. Maclean  
28/08/2024

**Other Studies**

*CLIC final focus:*  
*beam size optimisation including high order contributions (up to 7).*

*FCC-ee Q', Q'', Q'''*:  
*sextupole families optimisation, combining layouts vs tunnel.*

*PS, PSB:*  
*model improvements for combined function magnets, RDTs.*

*GTPSA & Lie algebra:*  
*used by some other codes.*

PS Nonlinear studies  
O. Naumenko, 27/09/2024

*The measurement agrees remarkably well with the PS model and the RDTs calculated by MAD-NG. The chromaticities predicted by MAD-NG also match well with the chroma measurement I have performed.*

- MAD-NG is reaching the end of its development process, **release 1.0** planned by end 2024.
- MAD-NG is now used in many CERN studies and machine optimisation and proved to be **accurate and efficient** to solve complex non-linear problems.
- MAD-NG was designed to **design methodically** new machines, where it should shine soon.
- MAD-NG **parametric normal forms** is a powerful tool to help understanding the sensitivity of quantities vs parameters (strengths, length, position, misalignments, cross-talk, etc...).
- Key features of MAD-NG vs MAD-X:
  - ▶ Better code architecture and structure, and much better physics.
  - ▶ Highly flexible and extensible for the physics (new features take a day).
  - ▶ Less surprise when **combining features** (e.g. slicing & misalign & frame & field errors).
  - ▶ Support backtracking, charged particles, parallel sequences, reversed sequences, etc...
  - ▶ Main stream programming language for scripting (save user time!) & **many toolboxes**.
  - ▶ Mature technologies, syntax error, backtrace, debugger, profiler, JIT (save user time!).