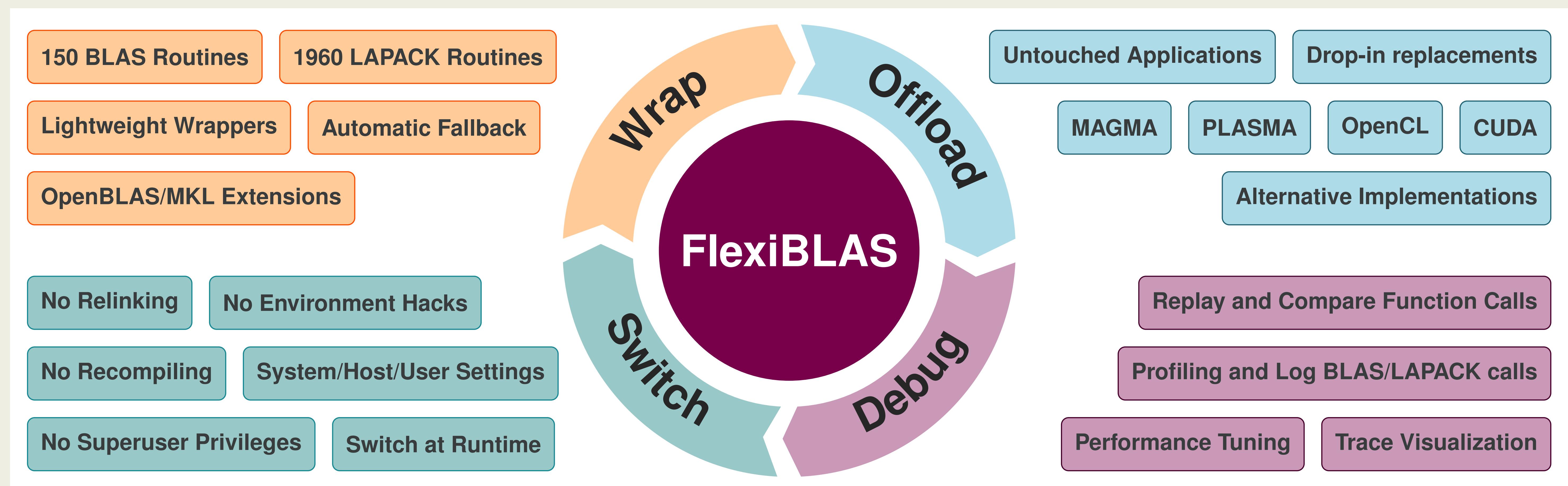


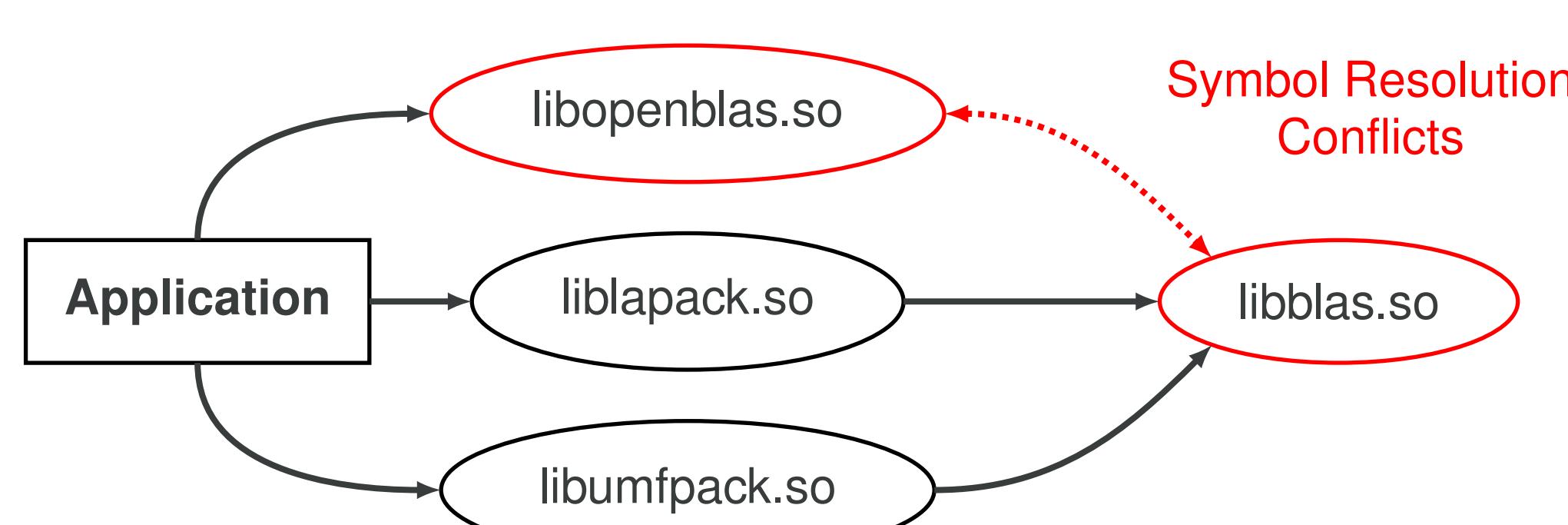
# Profiling and Inspecting Linear Algebra Applications using FlexiBLAS

Christian Himpe, **Martin Köhler**, Jörn Papenbroock, Jens Saak

Max Planck Institute for Dynamics of Complex Technical Systems, Computational Methods in Systems and Control Theory, Magdeburg



## Motivation

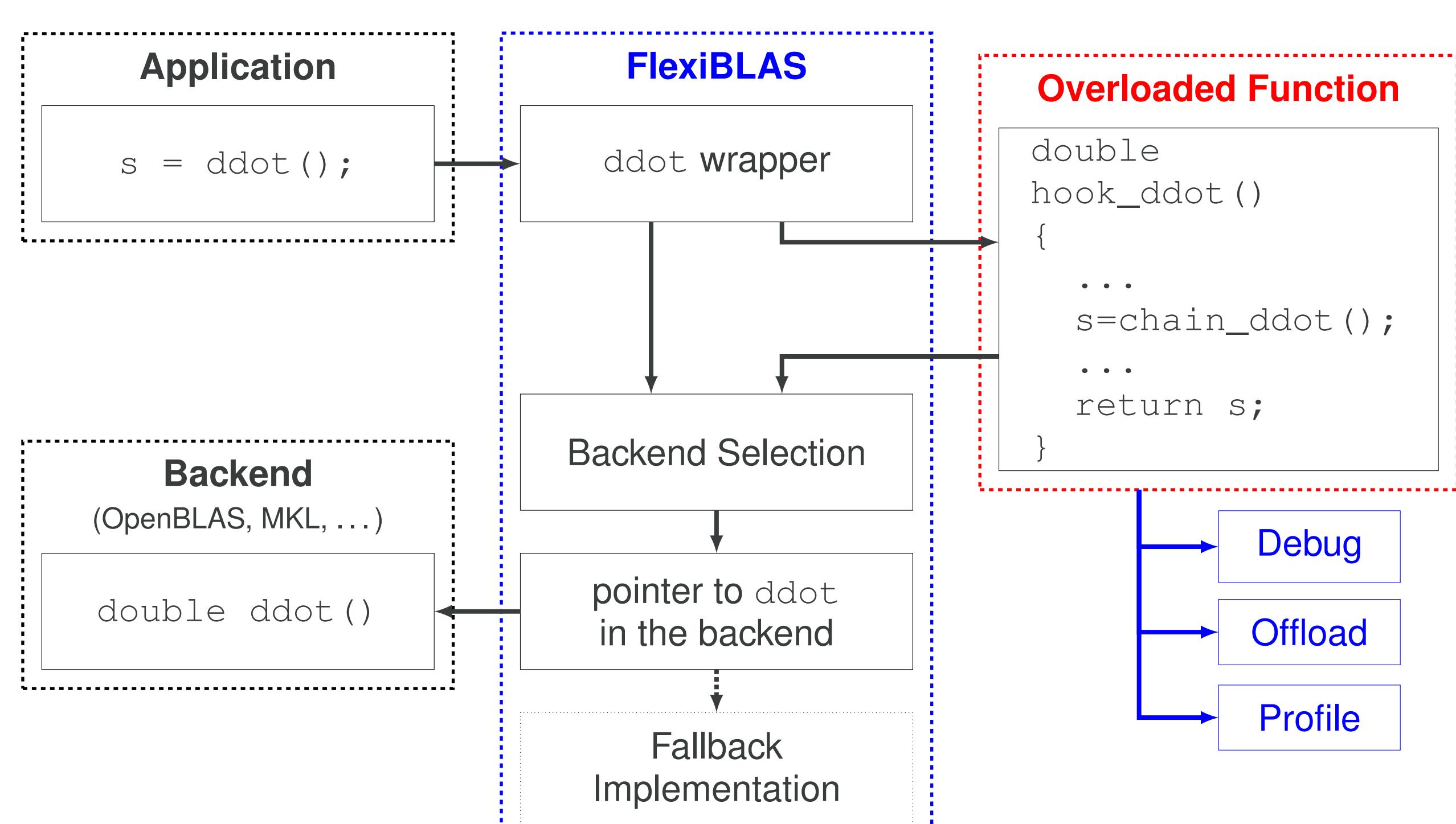


Internal dependencies and wrong linker calls may cause the integration of the same routine (symbols) from different libraries.

### Other Problems:

- Compatibility: Intel/GNU interface style
- Vendor extensions: AXBPY, OMATCOPY, ...
- Multi-library implementations: MKL, ATLAS
- Incomplete implementations: IBM ESSL
- Time consuming recompilation
- Superuser-only solutions: update-alternatives, eselect, ...
- Error-prone solutions: LD\_PRELOAD, LD\_LIBRARY\_PATH

## Implementation



Our wrapper uses the POSIX `dlopen` mechanism to load the selected BLAS/LAPACK backend. Each symbol is resolved using `dlsym` when the application starts. These symbols are used to call the real BLAS function from the wrapper functions in our library. Multiple overloaded functions are arranged in chains to execute several of them for each function call.

## Usage

### Compile Time:

Link everything against FlexiBLAS instead of BLAS and LAPACK:

`gcc ... -lflexiblas`

or use an operating system mechanism, like `update-alternatives` or `eselect`, to set it system-wide.

### Runtime:

Everything is managed via the `flexiblas` tool:

- List all BLAS/LAPACK backends:  
`flexiblas list`
- Set the default backend:  
`flexiblas set BACKEND`
- Add a new BLAS/LAPACK library:  
`flexiblas add NAME blas.so`

## Debug Data Acquisition and Analysis

### Technical Details:

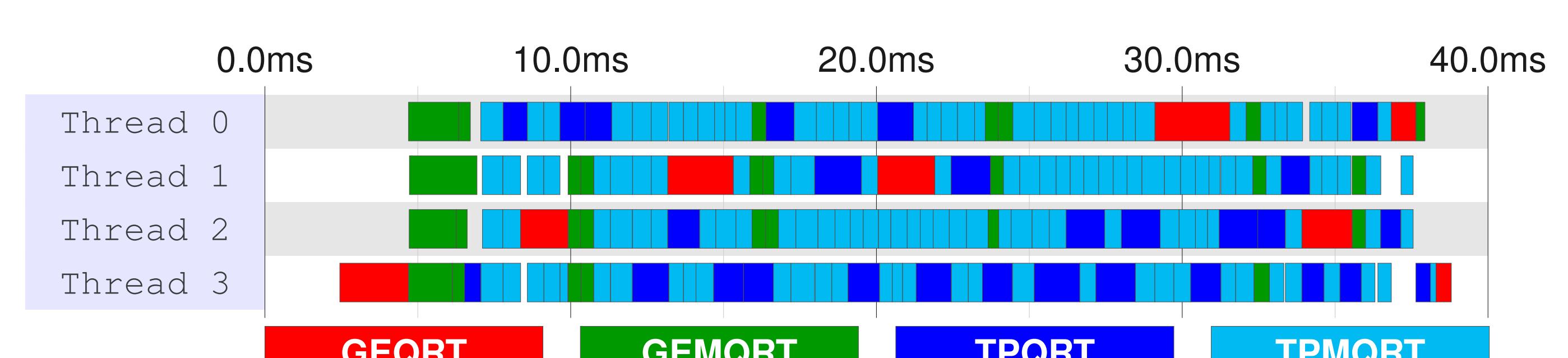
- Data acquisition through overloaded functions
- Combination with offloading and other hooks
- SQLite-based data store
- No binary patching required
- Negligible overhead

### Features:

- Python tools to analyze data
- Traces as TikZ/Latex/PDF graphic
- Only one program run for trace generation, profiling, and inspecting
- No commercial tools required

## Trace Visualization, Profiling, and Inspecting

### Example 1 – TileQR Implementation on top of OpenMP4



### Example 2 – CG in GNU Octave

```

function [x] = conjgrad(A, b, x)
r = b - A * x;
p = r;
rsold = r' * r;
for i = 1:length(b)
Ap = A * p;
alpha = rsold / (p' * Ap);
x = x + alpha * p;
r = r - alpha * Ap;
rsnew = r' * r;
if sqrt(rsnew) < 1e-10
break;
end;
p = r + (rsnew / rsold) * p;
rsold = rsnew;
end
end

A = full(sprandsym(1000, 1.0));
b = A*ones(1000, 1);
x = conjgrad(A,b, zeros(1000,1));
norm(A * x-b)/norm(b)

```

### Profiling:

Subroutine	# Calls	acc. Time
dlamch	5	2.69e-05s
<b>ddot</b>	<b>1000</b>	<b>1.11e-03s</b>
<b>dsyrk</b>	<b>1001</b>	<b>5.61e-03s</b>
<b>dgemv</b>	<b>1003</b>	<b>4.04e-01s</b>

### Inspecting:

- DAXPY and DNRM2 not used at all
  - DSYRK computes
- $C := \alpha A^T A + \beta C$  if  $\text{trans} = 'N'$   
or  
 $C := \alpha A^T A + \beta C$ , if  $\text{trans} = 'T'$   
with  $A \in \mathbb{R}^{n \times k}$  or  $A \in \mathbb{R}^{k \times n}$  and  $C \in \mathbb{R}^{n \times n}$ .

All 1001 DSYRK calls use  $\text{trans} = 'T'$ ,  $n = 1$ ,  $k = 1000$ ,  $\alpha = 1.0$ , and  $\beta = 0$ .

**Misuse of DSYRK in Octave!**  
⇒ `ddot` would be correct.

## Resources



- Web: <https://www.mpi-magdeburg.mpg.de/projects/flexiblas/>
- Contact: [koechler@mpi-magdeburg.mpg.de](mailto:koechler@mpi-magdeburg.mpg.de)
- Martin Köhler and Jens Saak, FlexiBLAS 2.0 – A runtime BLAS switch, 2017, <https://doi.org/10.5281/zenodo.569102>
- Martin Köhler and Jens Saak, FlexiBLAS - A flexible BLAS library with runtime exchangeable backends, LAPACK Working Note #284, 2014, <http://www.netlib.org/lapack/lawnspdf/lawn284.pdf>