

# Introduction to the BART Toolbox

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# BART Toolbox for Computational MRI

- ▶ **For research use**
- ▶ Available for Linux, MacOS X, (Windows), ...
- ▶ BSD license (free for commercial use)
- ▶ <https://mrirecon.github.io/bart/>

## Contributors:

Jon Tamir, Christian Holme, Moritz Blumenthal, Nick Scholand, Philip Schaten, Daniel Mackner, ... many more (see ACKNOWLEDGMENTS)

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# Motivation

- ▶ **Rapid prototyping**  
(similar to Matlab, octave, ...)
- ▶ **Reproducible research**  
(i.e. scripts to reproduce experiments)
- ▶ **Robustness and clinically feasible runtime**  
(C/C++, OpenMP, GPU programming)
- ▶ Educational tool
- ▶ Platform for collaboration

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## Programming library

- ▶ Consistent API based on multi-dimensional arrays
- ▶ Fast transforms: FFT, nuFFT, wavelet
- ▶ Generic iterative (matrix-free) algorithms (conjugate gradients, FISTA, IRGNM, ADMM, iPALM, ...)
- ▶ Composable operators / algorithms
- ▶ Transparent GPU acceleration of most functions
- ▶ Cluster support (MPI)
- ▶ Neural networks
- ▶ MRI sequences

## Command-line tools

- ▶ Simple file format
- ▶ Looping, parallelization, streaming
- ▶ Interoperability with Matlab, Python
- ▶ Basic operations: fft, resize, slice, ...
- ▶ Sensitivity, motion, etc. calibration and image reconstruction

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## Generic Tools

fft	FFT
slice	extract slice
extract	extract block
resize	crop / zeropad
flip	reverse dimensions
join	merge files
zeros/ones	create files
circshift	circular shift
conv	convolution
scale	scale
conj	complex conjugate
fmac	fused multiply-add
saxpy	scalar mult. and add
sdot	dot product
rss	root-sum-of-squares
repmat	repmat
svd	singular-value d.

## MRI Tools

cc	channel compression
walsh	Walsh method
whiten	whiten k-space
caldir	Direct calibration
ecalib	ESPIRiT calibration
ncalib	non-linear calibration
pics	$\ell_1$ -SENSE/ESPIRiT
moba	model-based recon
reconet	deep-learning recon
nlinv	non-linear inversion
nufft	non-uniform FFT
pocsense	POCSense
fovshift	Retro-shift FOV
pattern	extract pattern
poisson	Poisson-disc pattern
signal	create signal curves

# pics: Parallel Imaging Compressed Sensing

> bart pics -RA:B:C:D -R ... [-t trj] [-B basis] kspace sens image

- ▶ parallel imaging and compressed sensing
- ▶ non-Cartesian k-space trajectories
- ▶ subspace reconstruction
- ▶ multiple regularization terms
- ▶ A: different types of regularization:  
 $\ell_2$ ,  $\ell_1$ , total (generalized) variation, infimal convolution,  
 $\ell_1$ -wavelet, (multi-scale) low-rank, deep priors
- ▶ B: transforms along arbitrary dimensions (space, time, etc.)
- ▶ C: joint-thresholding along arbitrary dimensions
- ▶ D: regularization parameter



# moba: Model-Based Reconstruction

```
> bart moba - model -r ... [-t trj] kspace enc output [sens]
```

- ▶ signal model ( $T_1$ ,  $T_2$ ,  $T_2^*$ ,  $T_2^* + \delta B_0$ , Bloch)
- ▶ parallel imaging and compressed sensing
- ▶ non-Cartesian k-space trajectories
- ▶ A, B, C, D: regularization

# reconet: Deep-Learning Reconstruction

```
> bart reconet -network ... [-trajectory trj]  
               kspace sens weights out/ref
```

- ▶ network (VarNet, MoDL)
- ▶ parallel imaging
- ▶ non-Cartesian k-space trajectories

# Resources

1. README, doc/
2. Website: <https://mrirecon.github.io/bart>
3. Source code: <https://github.com/mrirecon/bart>
4. Mailing list with public archive (see website)
5. Workshops:  
<https://github.com/mrirecon/bart-workshop>
6. Webinars:  
<https://github.com/mrirecon/bart-webinars>
7. Help: Each command has '-h' option for a very brief help.

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# DACH+NORDIC ISMRM: OpenMR Days

[https://github.com/mritogether/bart-workshop/dach\\_ismrm2025/](https://github.com/mritogether/bart-workshop/dach_ismrm2025/)

## Schedule

- ▶ Introduction to the BART Toolbox (Martin Uecker)
- ▶ Break
- ▶ Sequence Framework (**New!**) (Daniel Mackner)
- ▶ Scanning
- ▶ Subspace Tutorial (Vitali Telezki)