

# MRI: Speed, Phase, Echo

Zhengguo Tan

Artificial Intelligence in Biomedical Engineering (AIBE)  
Friedrich-Alexander-Universität Erlangen-Nürnberg (FAU)

June 28, 2023

# Outline

## Self Introduction

What I have done

in Frahm lab

jointly in Frahm & Uecker lab

in Knoll lab

Inspirations

Deep Learning Empowered Image Reconstruction

## Summary

# Self Introduction

# Zhengguo ↔ Jung Gwoh



how to pronounce the chinese name Zheng Guo



The Chinese name "Zheng Guo" is pronounced as "jung gwoh."

The pronunciation of "Zheng" is similar to the English word "jungle," but with a sharper "j" sound at the beginning, like the "s" in "measure." It is followed by a short "uh" sound.

The pronunciation of "Guo" sounds like the English word "go," but with a slight "w" sound at the end. The "o" is pronounced as a short "oh" sound.

Put together, "Zheng Guo" is pronounced as "jung gwoh."

# Academic Background

## 1. Chronologically,

- ▶ 2022 - now, senior postdoc in Prof. Florian Knoll's lab in Erlangen
- ▶ 2019 - 2021, DFG <sup>1</sup> funded temporary principal investigator <sup>2</sup> in Prof. Martin Uecker's lab in University Medical Center Göttingen
- ▶ 2012 - 2016, PhD in Prof. Jens Frahm's lab in Max Planck Institute

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<sup>1</sup>DFG: Deutsche Forschungsgemeinschaft, <https://www.dfg.de/>

<sup>2</sup>project number: 427934942

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- ▶ 2012 - 2016, PhD in Prof. Jens Frahm's lab in Max Planck Institute

## 2. Technically,

- ▶ Pulse sequence programming skill trained by the FLASH inventor
- ▶ Iterative image reconstruction skill trained by the BART inventor
- ▶ Artificial intelligence skill trained by the VarNet inventor

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# Collaboration & Teaching

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- ▶ UHF Predevelopment Team at Siemens
- ▶ Prof. Frederik Laun at University Hospital Erlangen
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## 2. Teaching at FAU

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- ▶ Pulseq (together with Prof. Moritz Zaiss) for master students
- ▶ Medical Engineering II (blackboard exercises) for bachelor students

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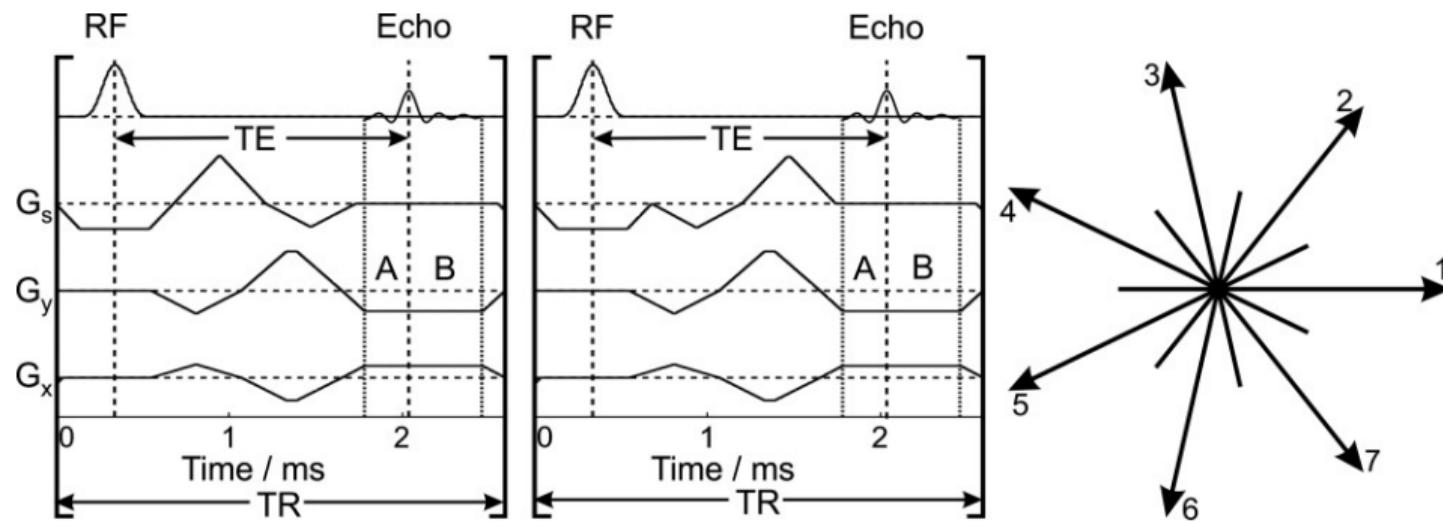
## 3. Master thesis at FAU

- ▶ Ms. Soundarya Soundarresan
- ▶ Mr. Kai Zhao

## What I have done

# Real-Time Flow MRI based on Asymmetric-Echo Radial Sampling<sup>3</sup>

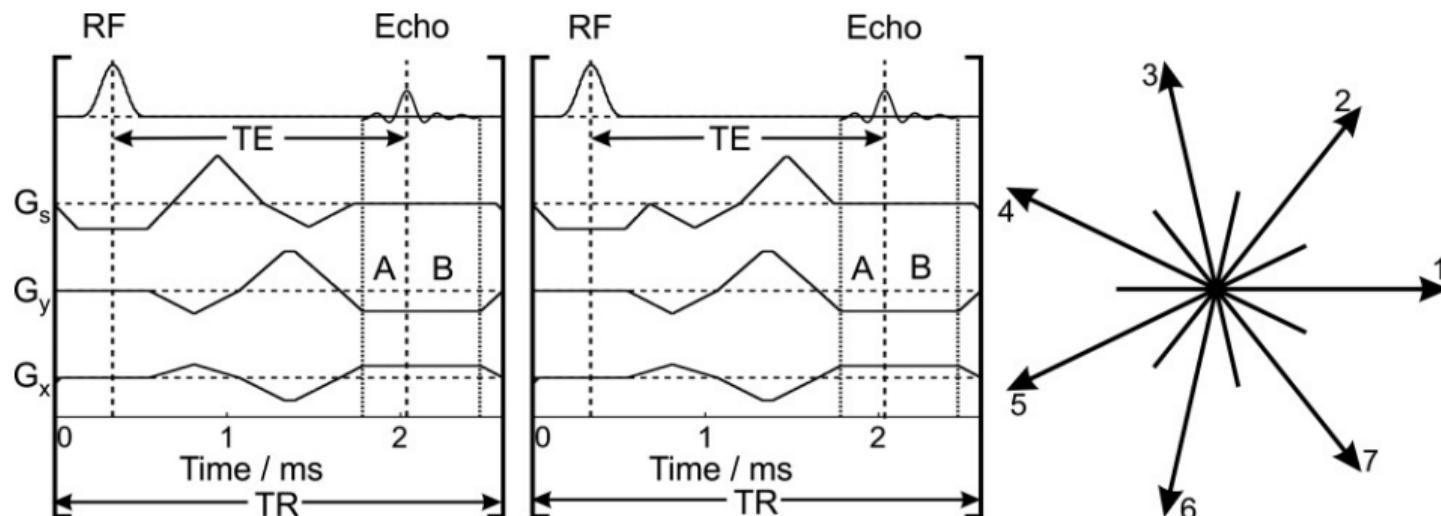
- ▶ Interleaved acquisition: 1x flow-compensated ( $S = 0$ ) + 1x flow-encoded ( $S = 1$ )



<sup>3</sup>Untenberger M #, Tan Z #, et al. Advances in real-time phase-contrast flow MRI using asymmetric radial gradient echoes. *Magn Reson Med* (2016). # equal contribution

# Real-Time Flow MRI based on Asymmetric-Echo Radial Sampling<sup>3</sup>

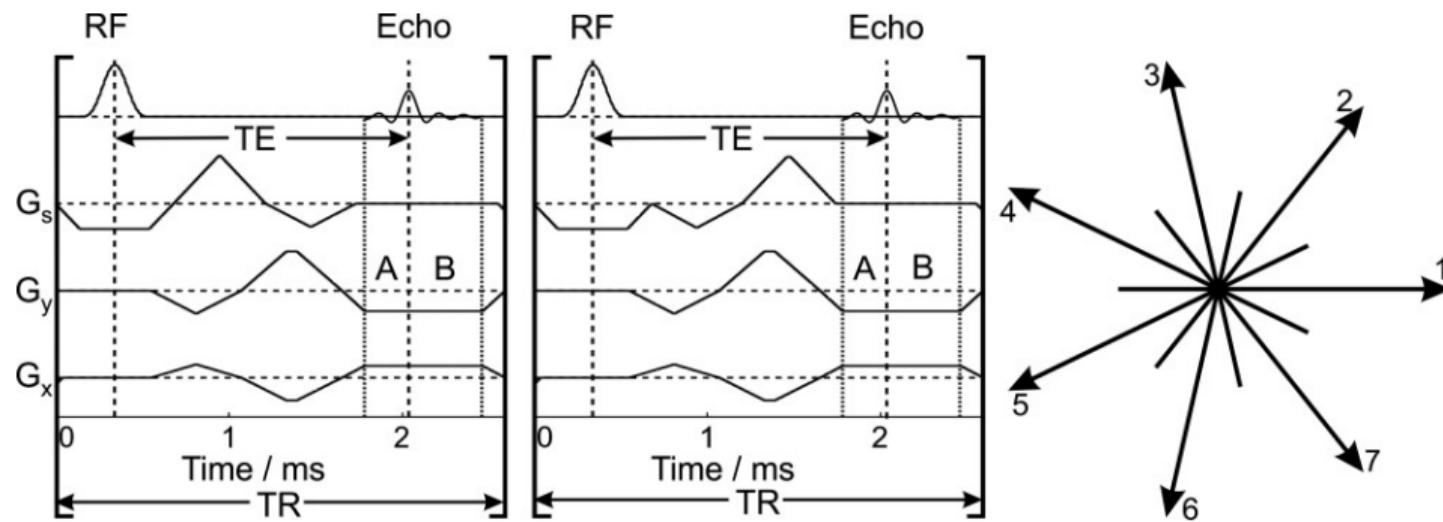
- ▶ Interleaved acquisition: 1x flow-compensated ( $S = 0$ ) + 1x flow-encoded ( $S = 1$ )
- ▶ Asymmetric-echo readout to reduce TR



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# Real-Time Flow MRI based on Asymmetric-Echo Radial Sampling<sup>3</sup>

- ▶ Interleaved acquisition: 1x flow-compensated ( $S = 0$ ) + 1x flow-encoded ( $S = 1$ )
- ▶ Asymmetric-echo readout to reduce TR
- ▶ Temporal resolution: 36 ms per velocity map



<sup>3</sup>Untenberger M #, Tan Z #, et al. Advances in real-time phase-contrast flow MRI using asymmetric radial gradient echoes. *Magn Reson Med* (2016). # equal contribution

# Real-Time Flow MRI: Model-based Reconstruction<sup>4,5</sup>

- ▶ Idea: to jointly estimate phase-difference maps

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<sup>4</sup>Tan Z, et al. Model-based reconstruction for real-time phase-contrast flow MRI: Improved spatiotemporal accuracy. *Magn Reson Med* (2017).

<sup>5</sup>Wang X, Tan Z, et al. Physics-based reconstruction methods for MRI. *Philos Trans Royal Soc A* (2021).

# Real-Time Flow MRI: Model-based Reconstruction<sup>4,5</sup>

- ▶ Idea: to jointly estimate phase-difference maps
- ▶ Solution: to solve a nonlinear least square problem

$$\begin{aligned}\Phi(x) = \operatorname{argmin}_x & \left\| \mathbf{y} - \mathbf{PFC} \{ \rho \cdot e^{i \Delta \phi \cdot S} \} \right\|_2^2 + \lambda \|x\|_2^2 \\ x &= (\rho, \Delta \phi, c_1, \dots, c_N)^T\end{aligned}\tag{1}$$

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- ▶ Pros: enable the regularization of phase-difference maps ( $\Delta\phi$ )

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- ▶ Pros: enable the regularization of phase-difference maps ( $\Delta\phi$ )
- ▶ Cons: require the implementation of the Jacobian matrix and the balance of partial derivatives

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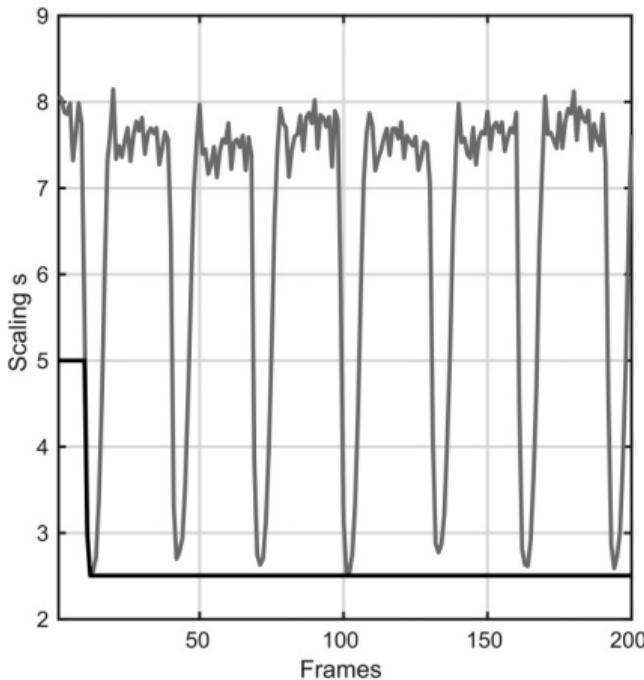
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# Balancing Partial Derivatives: Data-Driven Approach<sup>6</sup>

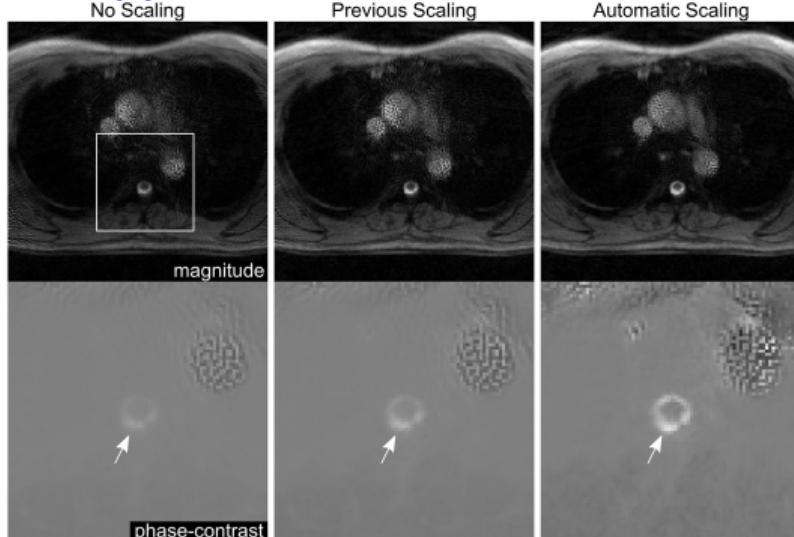
- ▶ kind of self-gating,  
like XD-GRASP or GRASP-Pro
- ▶ Solution: to track the scaling value from  
measured  $k$ -space data

$$s = 0.5 \cdot \frac{\|y_1\|_2 + \|y_2\|_2}{\|y_1 - y_2\|_2} \quad (2)$$

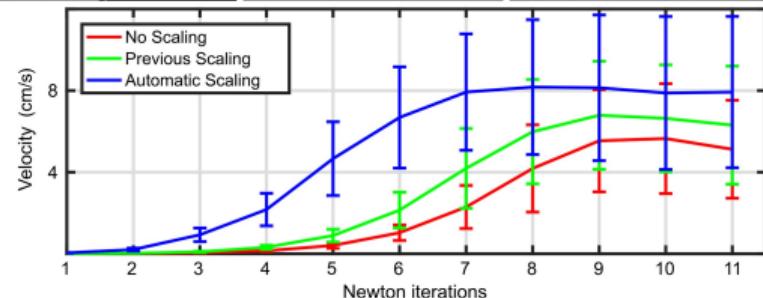


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# Balancing Partial Derivatives: Eigenvalue Approach <sup>7</sup>



1. kind of numerical methods,  
like batch normalization
2. to compute the matrix norm of the  
derivative operator



<sup>7</sup>Tan Z, et al. An eigenvalue approach for the automatic scaling of unknowns in model-based reconstructions: Application to real-time phase-contrast flow MRI. *NMR Biomed* (2017).

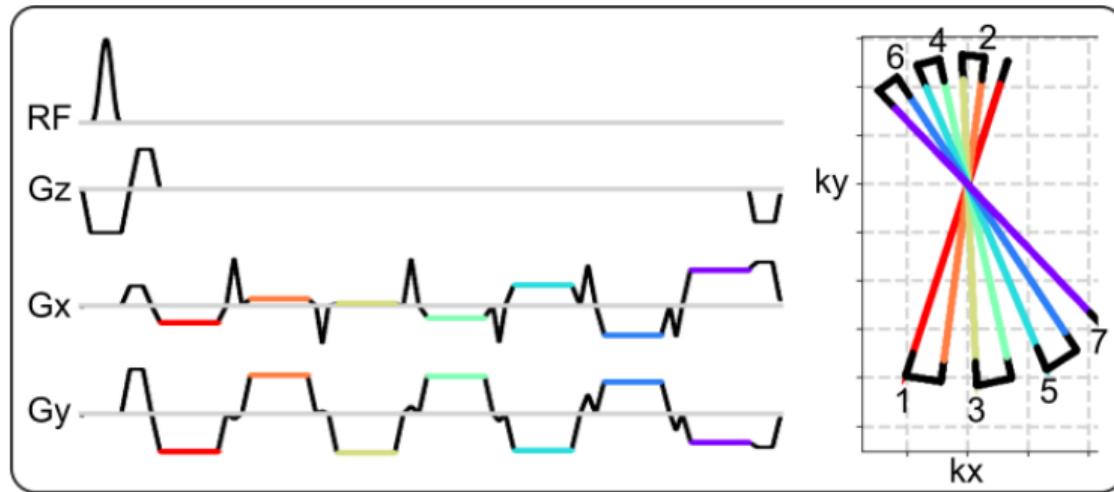
## Real-Time Aortic Blood Flow MRI at 36 ms

magnitude images

phase-difference maps

# Multi-Echo Radial Sampling<sup>8,9</sup>

- ▶ use blip gradients to traverse among echoes
- ▶ use spoiler gradients for stack-of-stars volumetric acquisition



<sup>8</sup>Tan Z, et al. Dynamic water/fat separation and  $B_0$  inhomogeneity mapping – joint estimation using undersampled triple-echo multi-spoke radial FLASH. *Magn Reson Med* (2019).

<sup>9</sup>Tan Z, et al. Free-breathing liver fat,  $R_2^*$  and  $B_0$  field mapping using multi-echo radial FLASH and regularized model-based reconstruction. *IEEE Trans Med Imaging* (2023).

## Application #1: Free-Breathing Liver Fat & $R_2^*$ Quantification

- ▶ to solve a generalized nonlinear inverse problem

$$\begin{aligned}\Phi(x) &= \operatorname{argmin}_x \|\mathbf{y} - \mathbf{PFCB}(x)\|_2^2 + \lambda R(x) \\ x &= (W, F, R_2^*, f_{B_0}, c_1, \dots, c_N)^T\end{aligned}\tag{3}$$

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- ▶ multi-echo gradient echo signal model

$$B(x) : \rho_m = (W + F \cdot z_m) \cdot e^{-R_2^* \text{TE}_m} \cdot e^{i2\pi f_{B_0} \text{TE}_m}\tag{4}$$

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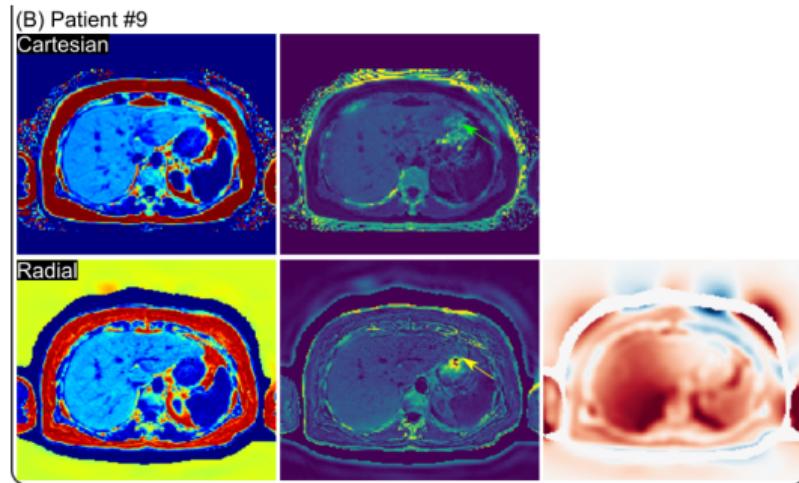
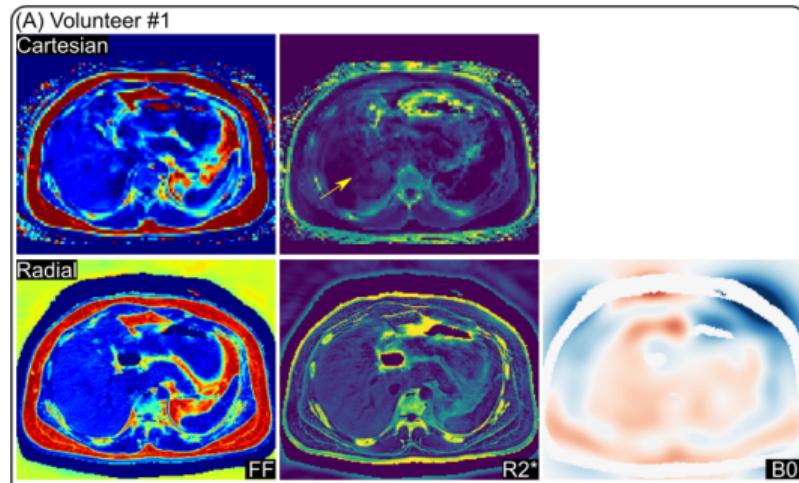
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- ▶ Cons: the field inhomogeneity map ( $f_{B_0}$ ) is sensitive to initial guess

# Application #1: Free-Breathing Liver Fat & $R_2^*$ Quantification



## Appliation #2: Volumetric Brain $T_2^*$ -Weighted Imaging<sup>10</sup>

- ▶ spatial resolution 1 mm isotropic
- ▶ 35 echoes per excitation and 7 shots per partition
- ▶ use linear subspace modeling and reconstruction instead

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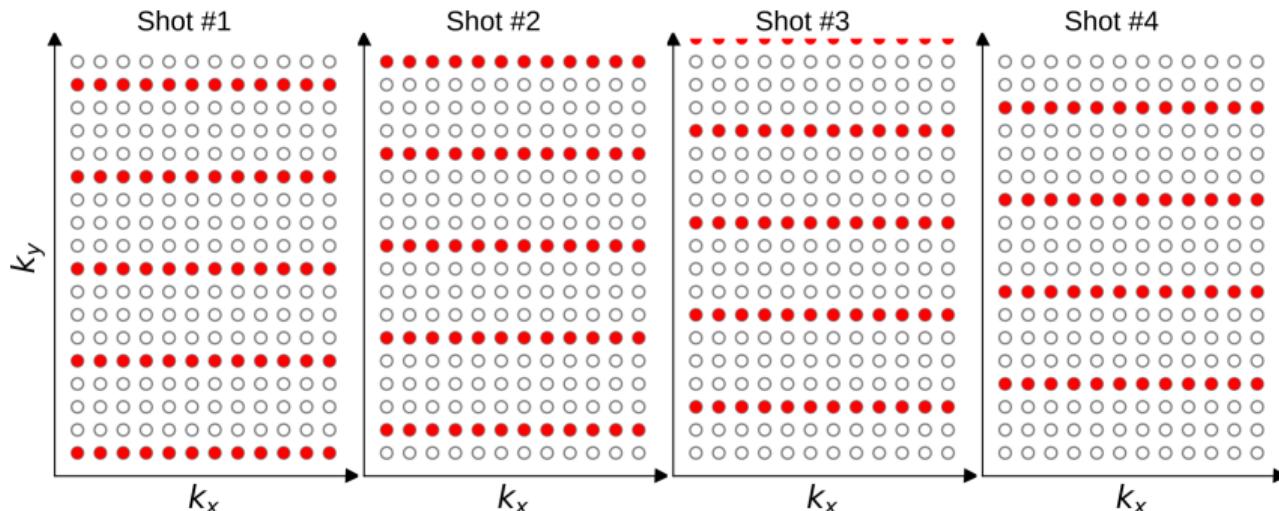
<sup>10</sup>Tan Z, et al. *under review*

# Brain Diffusion MRI at 7 T

- ▶ Challenges:
  1. Specific Absorption Rate (SAR) is linearly proportional to the square of  $B_0$
  2. Shorter  $T_2$  relaxation at 7 T
  3. Increased sensitivity to field inhomogeneity, incl.  $B_0$  and  $B_1$

# Brain Diffusion MRI State-of-the-Art: MUSE<sup>11</sup>

- ▶ uses 4-shot interleaved EPI (iEPI), resembling a fully-sampled  $k$ -space
- ▶ self-navigated shot-to-shot phase variation estimation
- ▶ limited number of shots has been reported

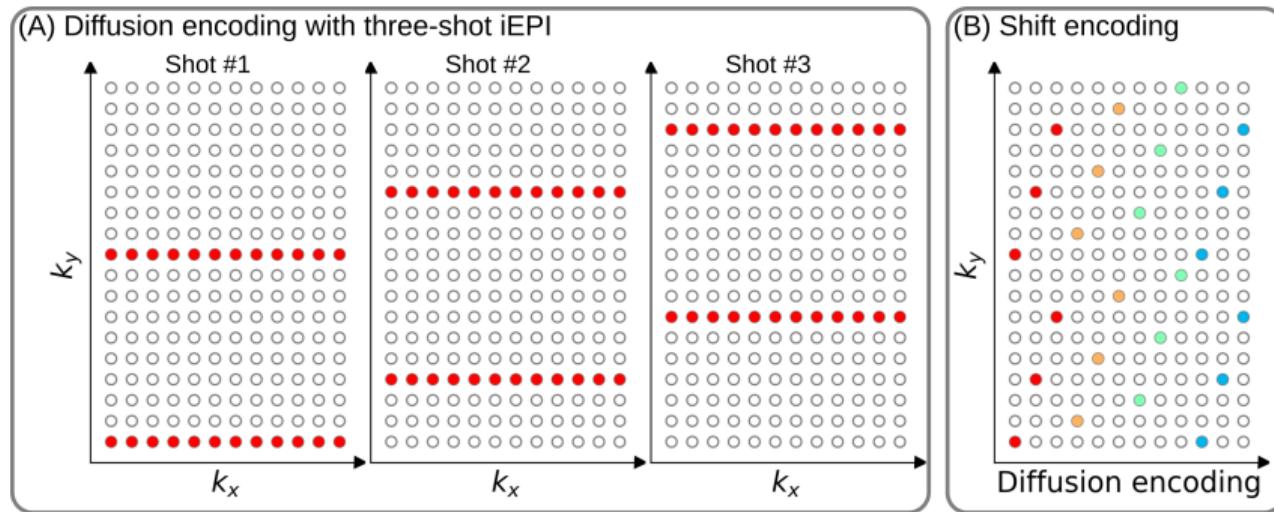


<sup>11</sup>Chen NK, et al. A robust multi-shot scan strategy for high-resolution diffusion weighted MRI enabled by multiplexed sensitivity-encoding (MUSE). *NeuroImage* (2013).

# Undersampled iEPI with $k_y$ Shift Encoding<sup>12</sup>

- ▶ Acceleration factor per shot:

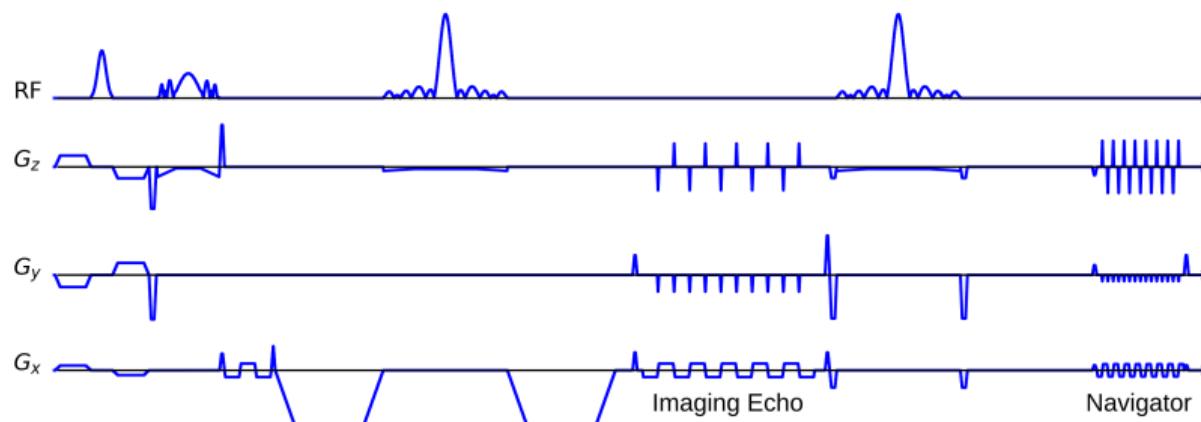
$$R_{\text{shot}} = R_{\text{in-plane}} \times N_{\text{shot}} \quad (5)$$



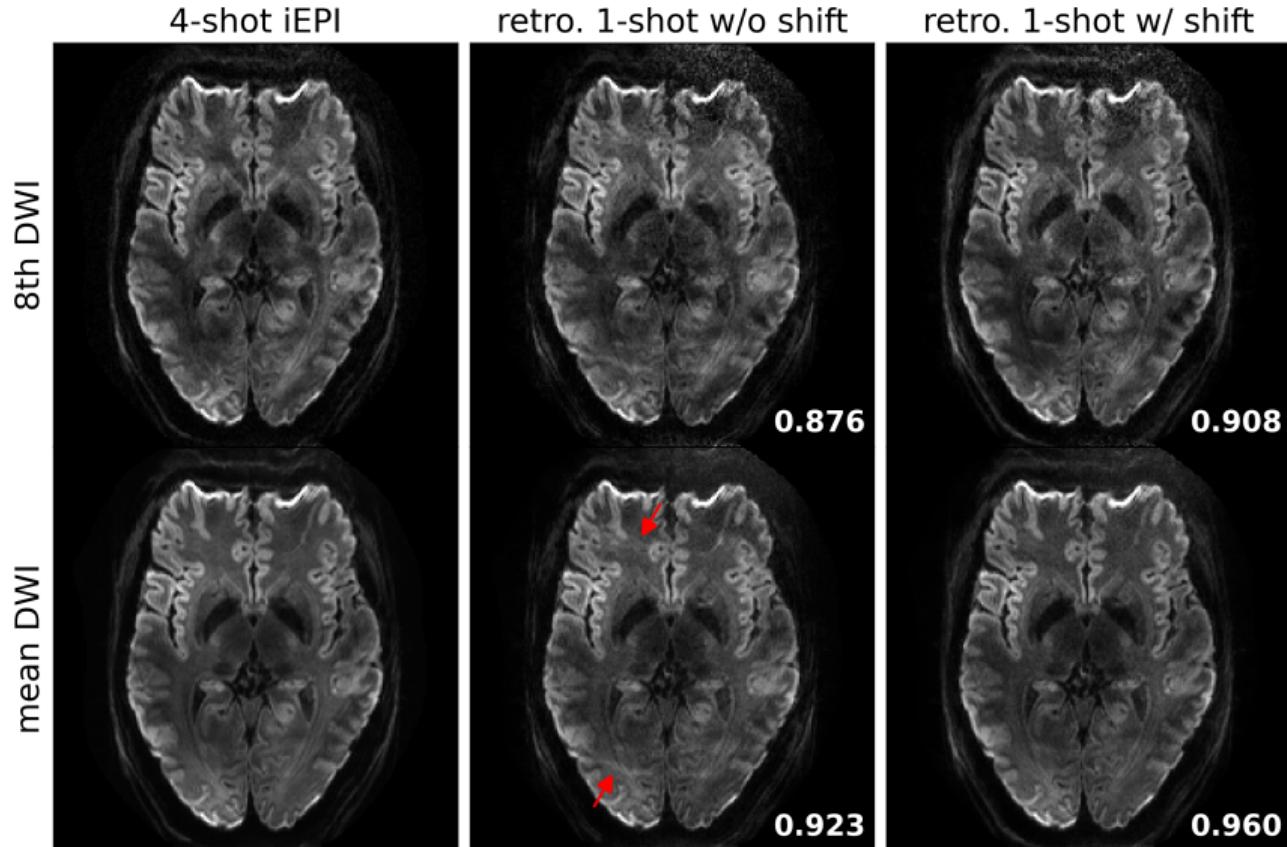
<sup>12</sup>Tan Z, et al. *under review*.

# NAVIEPI: where iEPI meets rsEPI

- ▶ Navigator-based iEPI with consistent effective ESP between echoes
- ▶ enables:
  1. minimal distortion mismatch between echoes
  2. flexible number of shots
  3. reliable shot-to-shot phase estimation

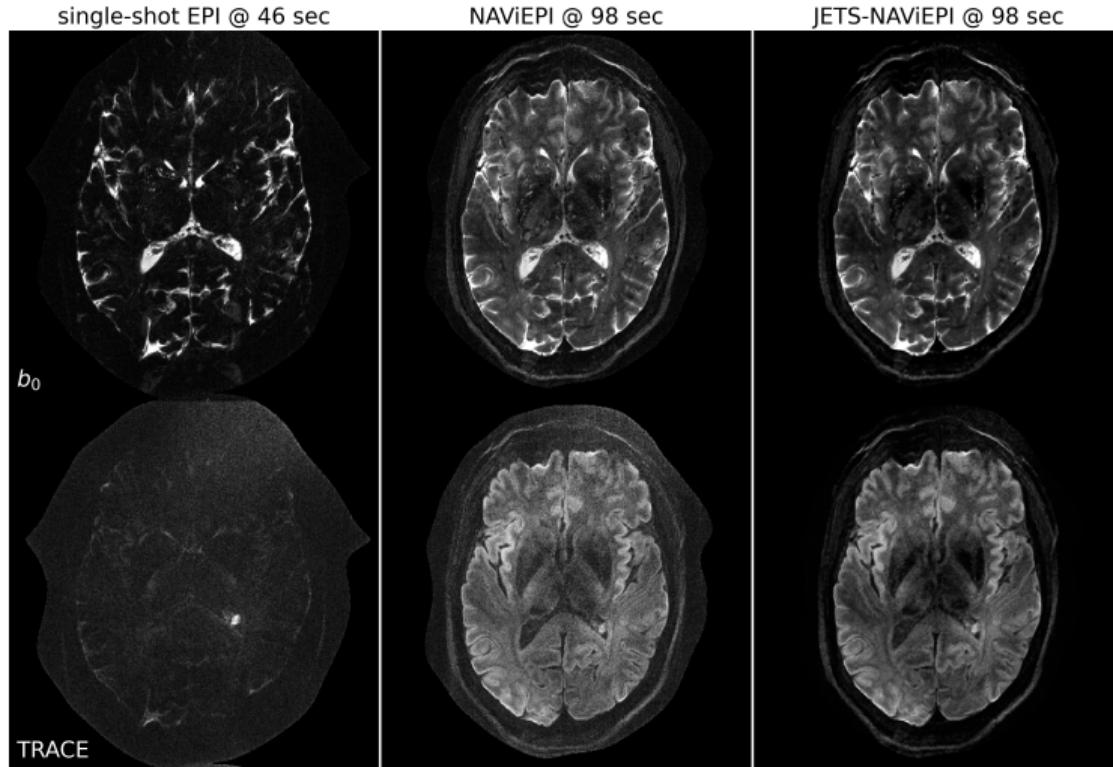


# $k_y$ Shifting is Beneficial in Joint $k$ - $q$ -Slice Reconstruction



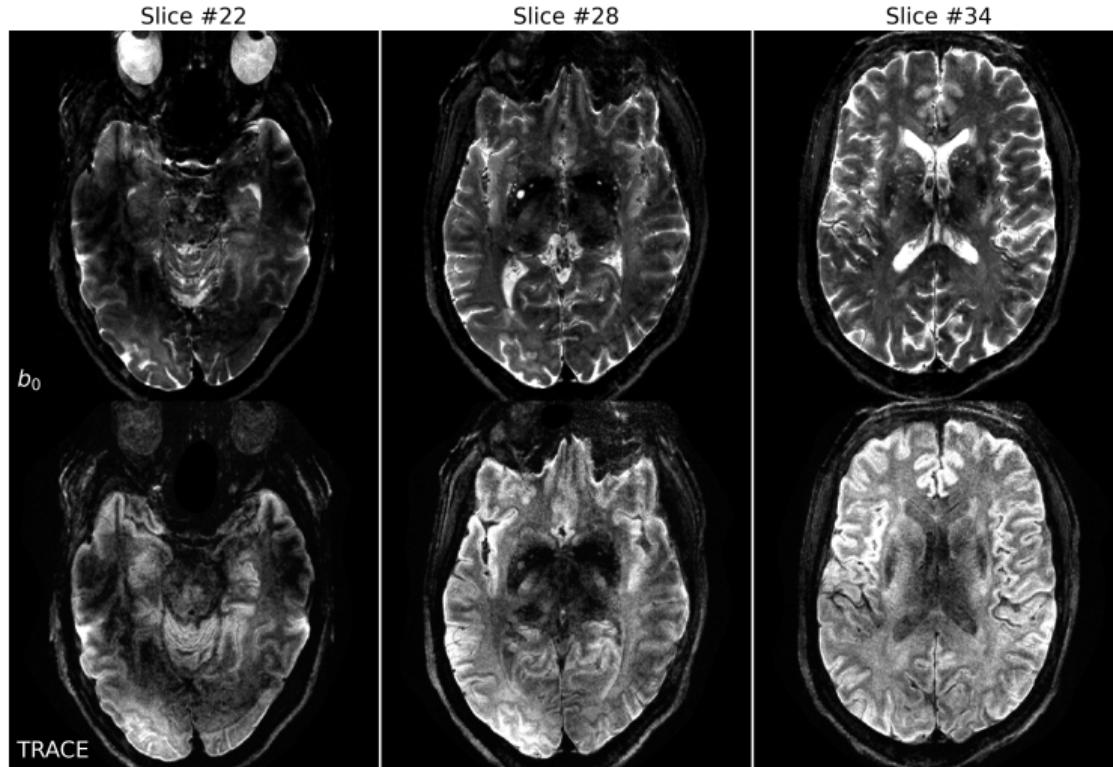
# Efficiency of NAViEPI

3-scan trace acquisition with voxel size  $0.5 \times 0.5 \times 2.0 \text{ mm}^3$



# $B_1^+$ Field Inhomogeneity Challenge

3-scan trace acquisition with voxel size  $0.5 \times 0.5 \times 2.0 \text{ mm}^3$



# JETS-NAViEPI: Reproducibility

The screenshot shows a GitHub repository page for 'demo\_jets\_diffusion\_mri\_7'. The repository is public and was created by ZhengguoTan. It contains four commits:

- ZhengguoTan add the plot of sampling patterns - 3 weeks ago
- LICENSE Initial commit - last month
- README.md update README - last month
- ZhengguoTan add the plot of sampling patterns - 3 weeks ago

The README.md file is displayed, containing the following text:

## JETS for Diffusion MRI at 7 T

Demonstration on Joint k-q-slice rEconsTruction framework for Shift-encoded (JETS) Diffusion MRI at 7 T

### ISMRM 2023

MR-Pub III Competition for the Development of Interactive Open-source Code Demos

- Interactive code demo: [Open in Colab](#)
- Data: [DOI 10.5281/zenodo.7989635](#)

On the right side of the page, there is an 'About' section with the following details:

- Demonstration on Joint k-q-slice rEconsTruction framework for Shift-encoded (JETS) Diffusion MRI at 7 T
- Readme
- MIT license
- Activity
- 0 stars
- 2 watching
- 0 forks

Below the 'About' section, there are sections for 'Releases' (No releases published), 'Packages' (No packages published), and 'Languages' (Jupyter Notebook 100.0%).

# Is NAViEPI a Reasonable Approach?

- ▶ In the sub-mm case, the base resolution is  $440 \times 440$

	Required phase-encoding lines (ETL)		
	1-Shot EPI	4-Shot MUSE	5-Shot NAViEPI
partial Fourier ( $\times(6/8)$ )		330	
Acceleration ( $/R_{\text{in-plane}}$ )	110	330	110
Shots ( $/N_{\text{shot}}$ )	110	$\approx 82$	22

- Much reduced spatial distortion with NAViEPI

# Inspirations: Speed, Phase, Echo

Max-Planck-Institut für biophysikalische Chemie  
H. Jähnig Göttingen Ausgabe Nr. 9 September 2012

Berichte aus Abteilungen und Forschungsgruppen

Real-time MRI –  
the ultimate quest for speed

Jens Frahm  
Biomedizinische NMR Forschung GmbH (@JenesNMR)

**A** little 10 years ago it was assumed that nuclear magnetic resonance (NMR) in magnetic resonance imaging (MRI) to explore new horizons by studying biological structures and functions in vivo. In about 10 years time, the maximum echo time of a typical measuring time of a cross-sectional image was about 5 minutes – or 300,000 milliseconds. This made studies on our nervous system in MRI difficult. MRI systems that offer a 30,000-fold acceleration, meaning times of 10 milliseconds or less, the new method allows for dynamic imaging of specific biological processes using fast MRI methods. Typically, 10 to 30 times faster than standard MRI methods based on slow magnetization.

The basis of the so-called time-resolved MRI was established in 1995 when a small government-funded group of junior researchers here at this institute invented the low-angle shot (FLASH) gradient echo MRI [1,2]. This was a major breakthrough in MRI, because it allowed to overcome the insurmountable physical obstacles and led to at least 100-fold gain in speed compared to established MRI sequences. The general physical approach and its

method applications rapidly broadened the spectrum of clinical MRI examinations and changed the way medical manufacturers developed their MRI systems. For the first time, it allowed for three-dimensional MRI. The first FLASH sequence was using ECG-triggered MRI acquisitions. In retrospect, the FLASH success strongly stimulated worldwide academic interest in MRI and triggered a revolution in both diagnostic and translational biomedical research. Prominent examples of subsequent breakthroughs are developments in angiographic processes using fast MRI methods and diffusion-based nerve fiber tractography.

Nevertheless, the maximal measuring time of the high-resolution MRI sequences was limited to at least a few hundred milliseconds. This is mainly because the MRI raw data typically requires up to 25% more data than the image itself, due to the spatial encoding. Our new concept therefore embraces the following idea: While FLASH acquisitions minimize the time for a single experiment to about 2 to 3 milliseconds, any further acceleration must

reduce the number of experiments, for example from 250 to only about 10. Indeed our current advances combine physical and mathematical strategies that drastically minimize the raw data necessary for a single image. This is called "undersampling" or "partial Fourier" – a scenario of an MRI mode – a scenario typically described as "undersampling".

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# Inspirations: Speed, Phase, Echo

Berichte aus Abteilungen und Forschungsgruppen

**Real-time MRI – the ultimate quest for speed**

Jens Frahm  
Biomedizinische NMR Forschung GmbH (@JonestNMR)

**A** little 10 years ago it was invented that nuclear magnetic resonance (NMR) as magnetic resonance imaging (MRI) explores new horizons by studying biological structures and functions in vivo. In about 10 years time, the time constant for the typical measuring time of a cross-section in retrospect, the FLASH was about 5 minutes... or 300,000 milliseconds. This made it possible that after a 30,000-fold acceleration, enough time of 10 milliseconds or less, the new method allows for dynamic imaging of rapid biological processes using MRI. MRI needs FLASH methods typically 10 times faster.

The basis of the so-called time-resolved MRI was established in 1985 when a small government-funded group of junior researchers here at this institute invented fast low-angle shot (FLASH) gradient echo MRI [1,2]. This was a principle of measurement which believed to be a measurable physical obstacle and led to at least 100-fold gain in speed compared to established MRI sequences. The general physical approach and its

marketable applications widely broadened the spectrum of clinical MRI examinations and changed the way medical manufacturers developed their MRI systems. For the first time, it allowed for three-dimensional MRI. The FLASH sequence was developed using ECG-triggered MRI acquisitions. In retrospect, the FLASH sequence strongly stimulated worldwide academic interest and had a major impact on clinical medical diagnostics and translational biomedical research. Prominent examples of subsequent breakthroughs are developments in angiographic processes using MR angiography, MR spectroscopy and functional brain mapping.

Nevertheless, the original measuring time was still too high for many applications and was limited to at least a few hundred milliseconds. This is mainly because the MRI raw data typically requires up to 25% gradient echo MRI. This means that every MRI slice needs to be recorded with many spatial encodings. Our new concept therefore embraces the following idea: While FLASH acquisitions minimize the time for a single experiment to about 2 to 3 milliseconds, any further acceleration must

**Inhalt**

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**Magnetic Resonance in Medicine HIGHLIGHTS**

**Q&As**  
with Authors  
of Editor's Picks

**Kawin Setsompop**  
The quest for speed

Profile of  
ISMRM President  
**Jim Pipe**

**Erwin Hahn**  
AN INTERVIEW BY  
DAVID FEINBERG

ISMRM ONE COURSE

WILEY

August 2015 - April 2016

# Inspirations: Speed, Phase, Echo



# Connecting MR in a changing world: Look outwards & inwards

Dan started to appear, and the ensuing back and forth started to win over the skeptics. Klaus Prostekom and Markus Weiger had spent time at the SMASH poster in Vancouver, and they came up with the SMASH poster at CENSEN on a cruise trip following the meeting. Over the next few years, there followed a kind of tussle match, with advocates of the two techniques battling it out, which one was better. Everybody was watching to see who would come out on top, and, in retrospect, that was probably the best thing that could have happened to generate interest. From then on, a whole slew of brilliant people, both in academia and in industry, entered the fray, and parallel imaging was off to the races.

**SMASH:** Here you are alluding to the simultaneous acquisition of spatial harmonics (SMASH) method. How was that initially received?

Dan: I think that two categories of early responses were captured nicely in two opposing reviews I got for the first MRIM paper I submitted, introducing SMASH. One reviewer said, more or less, that the idea was crazy and would never work. The other said that he/she had done the same thing ten years ago. So I was tempted to respond simply by asking the two of them to talk to one another.

**Smash:** That's like asking a child how big his childhood room was. For me it felt big. There were thousands of people – but nowhere near the approximately 7000 attendees our meeting attracts today.

**SMASH:** Do you think that the level of intense discussions has decreased with an increasing attendance at the ISMRM annual meeting?

Dan: The fact that we have grown so much larger is certainly in evidence at the meetings. The poster hall used to feel manageable. Tens was, one could stand among the posters and get an immediate sense of the scope of change in the field. Now there are so many sessions at once, and so many posters, that I do think some of the early sense of intimacy has been lost. In the Annual Meeting Program Committee (AMPC), we are trying to restore some aspects of the smaller meeting, with initiatives such as program chair Karla Miller's brilliantly-conceived and highly successful Scott Sessions. Even though it is a harder endeavor to take the full measure of the meeting, the old face-to-face magic still happens in hallways and meeting rooms and exhibits/hall alleys around the convention center.

**MRIM:** How does this connect to some of the ever-changing issues that the ISMRM may be facing?

Dan: In some ways, scope and pace are indeed dominant concerns, not only in our field, but in the world at large. I feel that the issues facing our society and our field are more dramatic, more exciting, and more existential than they have ever been. We are living in a rapidly changing world. This is something that is certainly clear to our young investigators, but has also struck any number of senior members. The world is changing so fast, in fact, that, if we didn't choose our way forward well, we run the risk of losing much of our energy and our relevance. We in the ISMRM are arguably at the height of relevance. We in the ISMRM are particularly focused on our powers – look at all the high-impact innovations we have introduced, and look at all the fields we have influenced. But, at the same time, consider the industry landscape of AI nowadays, not to mention the advent of modular electronics, cheap sensors, and modern software platforms. Consider also the industrial landscape. Tech companies are moving into healthcare, and our traditional industry partners are reinventing themselves day by day. There are also dramatic economic forces driving change, including relentless downward pressure on reimbursement for imaging studies, and seismic shifts from fee-for-service to value-based medicine.

So how do we deal with these disruptive forces? We have undertaken a strategic planning process in the ISMRM this year and have four imperatives that have guided our new strategic plan (now available for review and comment by the membership at large): 1) Manage disruptive forces; 2) Marshal disruptive innovation; 3) Connect with the fields around us; and 4) Tell our story. These imperatives reflect some of our longstanding core values of innovation and connection. In order to increase the value of MR in a changing world, however, we must, increasingly, look outwards as well as inwards. Given the nature of our field and the robustness of our interactions with one another, we risk forgetting that there are forces outside of MR, and forces outside of radiology or even biomedical imaging as a whole, which will shape how we are viewed and valued in times to come. Many people, including top-notch scientists in various disciplines, still think of us more or less as quirky tweakers who don't think about real-world needs. So we need to send them a message that we can help. We need to let our academic investigators know that we can help them answer fundamental scientific questions, as opposed to merely generating pretty macroscopic pictures. And then there is the general public. Part of the reason there is such pressure to cut reimbursements for medical imaging is because the public does not have nearly as deep an appreciation of the value of imaging, nor the value of MR in particular, as we pride ourselves on having. Therefore, it is increasingly essential that we get our story out. This is who we are, this is what we do, this is the power we bring to healthcare and basic discovery, these are the patients whose lives we save. In a world increasingly flooded with information, we must be sure that we are not the only ones who know the things we think we know.

**MRIM:** What is an effective vehicle to get our story told?

Dan: We are looking to our membership to do what they do best, which is to be creative. When I talk to young scientists, each one of them may have 15 ideas, some of which I cannot even begin to understand, for ways to get our story out, using social media and other suitable platforms. If you think about it, most of our communications as a society to date have been inward-facing, directed towards our membership. We don't really have well-defined structures to broadcast information outwards to the world around us. MR Pulse is one nice example of the kind of thing we could and should be doing more of. And there are so many other things we can try. We can start writing press to our meetings. We can prepare lay summaries of some of the key articles that appear in our journals. We invite ambassadors from other fields to attend our meetings, and then sit down with them and ask them to tell what they see, or didn't see. We can invite our members to go to meetings in other fields, and to report back. I mean interest stories are also important – stories in which we can show our value. "Here is a patient whose doctor didn't know what was wrong, and here is how MR helped to solve the mystery." That is the sort of thing people relate to us all the time. I am not suggesting that all these things are bad ideas, or that we start caring a about image than about innovation. But I am suggesting that we give more attention to precisely how value add to the human experience, so that we can keep the most impact at that experience evolves.

**MRIM:** You mentioned the word "value" a number of times just now. How does this connect to the ongoing ISMRM initiative on High-Value MRI?

Dan: Value is, in many ways, the ultimate metric of success for our endeavors. As scientists and as clinicians we all want to do something of value. The ISMRM Value Initiative, launched by past president Jim Pipe, championed by numerous thought leaders in our specialty, aims to focus us on protecting as well as improving value of MR. We are a society of innovative thinkers, we lose to come up with the next pulse sequence or next coil design. But do we think hard enough about what the true impact of that innovation is, that could be in daily practice? Do we take enough care in idea, key clinical priorities, and to derive new types of scans – whether they be fast, targeted exams of limited coverage, or more expansive studies with previously inconceivable information – that address those questions head-on? And do we take the time to document the comparative effectiveness of our innovations in addressing real clinical or research questions?

**In order to increase the value of MR in a changing world [...] we must, increasingly, look outwards as well as inwards**

—Daniel Sodickson

Dan in his SMASH poster at the 1997 ISMRM Annual Meeting in Vancouver.

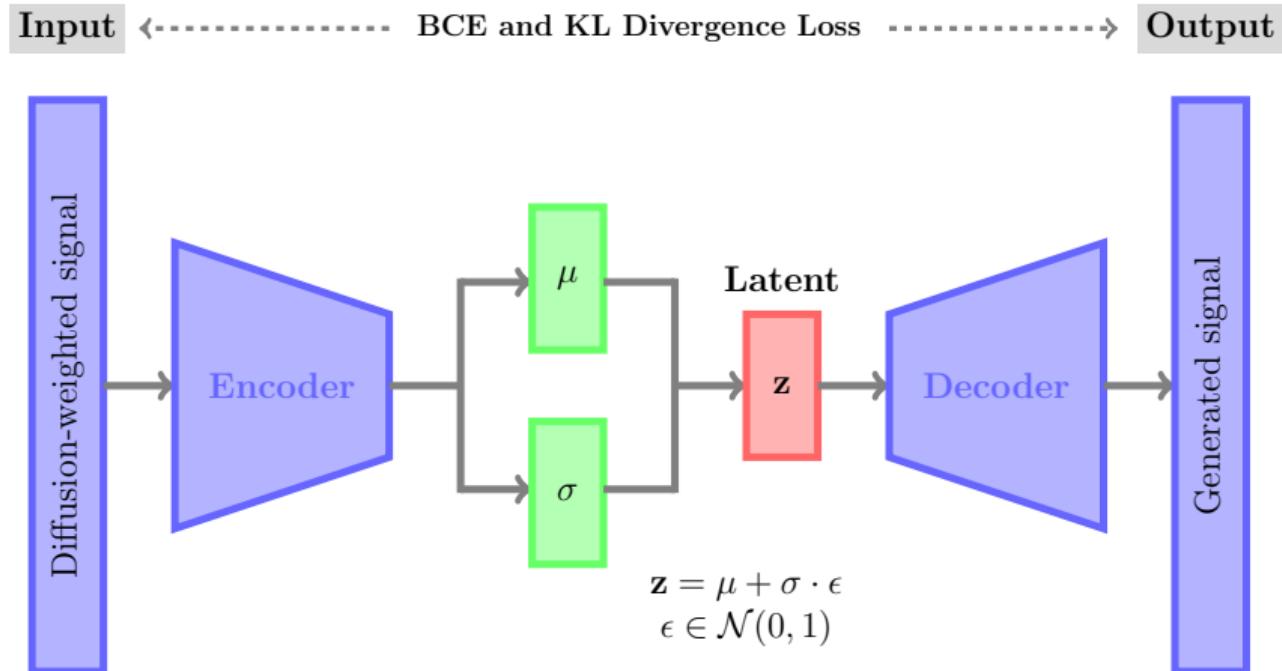
# Deep Learning: Any Novelty or Significance?

- ▶ Trustworthy
- ▶ Explainable
- ▶ Robust
- ▶ Data-Efficiency

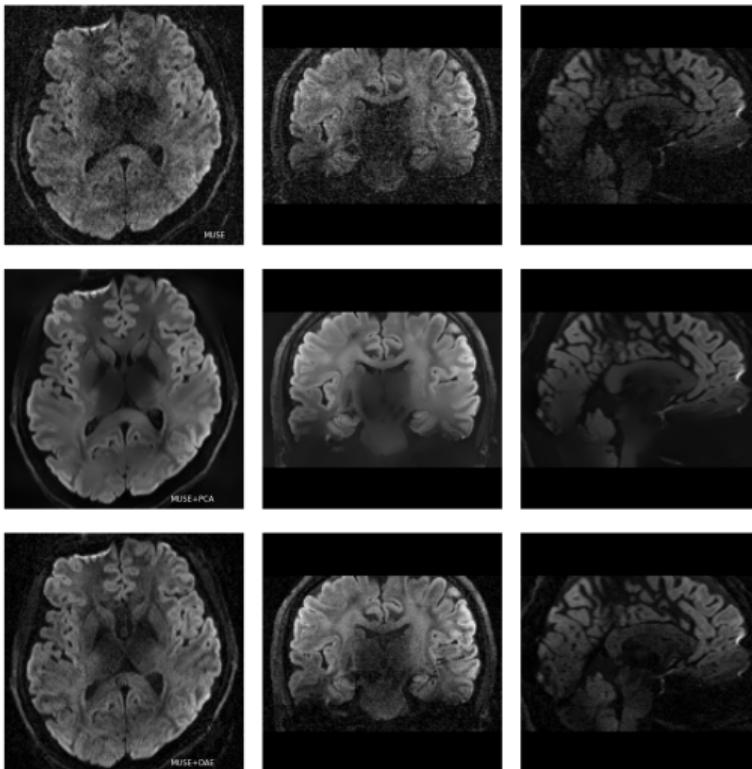
# Deep Learning: Any Novelty or Significance?

- ▶ Trustworthy
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- ▶ Robust
- ▶ Data-Efficiency
  
- ▶ nonlinear → linear → nonlinear
- ✓ Deep learning frameworks offer powerful optimizers!

# Preliminary Work on Deep Learning: AutoEncoder

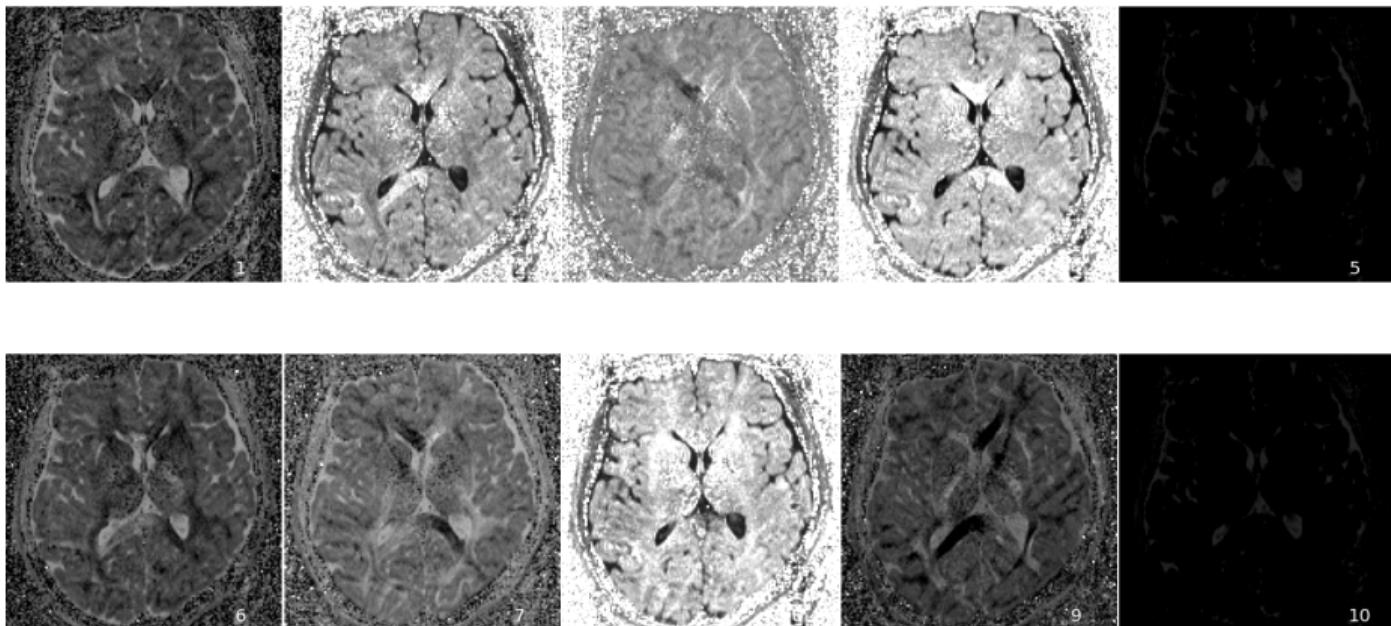


# Preliminary Work on Deep Learning: 1.2 mm Isotropic Resolution <sup>13</sup>



<sup>13</sup> Soundarresan S, Tan Z, et al. submitted to ESMRMB

# Preliminary Work on Deep Learning: Latent Signal



# Summary

# Thank You for Your Attention!

1. This talk won't be possible without these great people:
  - ▶ Dr. Jens Frahm and his team
  - ▶ Dr. Martin Uecker and his team
  - ▶ Dr. Florian Knoll and his team
  - ▶ Dr. Robin Heidemann
  - ▶ Dr. Patrick Liebig
  - ▶ Dr. Frederik Laun
  - ▶ Ms. Soundarya Soundarresan

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  - ▶ Dr. Frederik Laun
  - ▶ Ms. Soundarya Soundarresan
2. Thank you for your attention again.