

**Diffusion weighted imaging for detection and assessment of response to treatment of cancer in the body**

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THE UNIVERSITY OF TEXAS  
**MD Anderson**  
Cancer Center

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**Disclaimers**

- Research support from and intellectual property licensing to GE Healthcare and Siemens Healthineers

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**Outline**

- Some basics on diffusion
- Some technical consideration for diffusion-weighted imaging (DWI) and quantitation
  - Acquisition
  - Analysis
- Some clinical applications of DWI in the body

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### What is diffusion?

- In MRI, diffusion refers to the Brownian motion of water molecules
  - self-propelled by thermal energy
  - First discovered and named after the botanist Robert Brown who observed the life-like but random movement of pollen grains in water (1827)
  - The Fick's laws provide a phenomenological description of diffusion in terms of particle movement from high to low concentrations without bulk motion (1855)
  - Modern framework is attributed to Einstein (1905)

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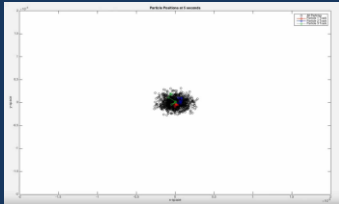
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### Random walks

<http://youtube.com>

- The mean displacement of diffusion is 0
- The mean squared displacement is given by Einstein Equation:
 
$$\langle r^2 \rangle = 6D\Delta t$$

for diffusion in a homogeneous medium with no boundaries  
 D is the diffusion coefficient, which is dependent on temperature, viscosity, and other properties of the medium and has a unit of mm<sup>2</sup>/s (in contrast to velocity, in unit of mm/s)

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### Diffusion in tissues

- For pure water at a body temperature of 37 °C,  $D \approx 30 \times 10^{-3} \text{ mm}^2/\text{s}$ :

$$\sqrt{\langle \delta r^2 \rangle} \approx 30 \times 10^{-3} \text{ mm}$$

for a time interval of 50 ms (typical echo time for diffusion imaging).

- Fortuitously, this distance is the size of multiple cells:
  - “restricted” intracellular diffusion when H<sub>2</sub>O crosses cell membranes and intracellular organelles
  - “impeded” extracellular diffusion when H<sub>2</sub>O encounters the tortuosity of extracellular matrix

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## Propagator function

- aka conditional probability or van Hove correlation function:

$$P(\mathbf{r}, \mathbf{r}_0, t)$$

the probability of finding a particular particle at location  $\mathbf{r}$  after a time interval  $t$  when it is first at location  $\mathbf{r}_0$ ?

- Mathematically derivable from the Fick's Law
- Has a simple Fourier relationship with the MR signal in  $q$ -space (therefore directly measurable in so called  $q$ -space imaging)

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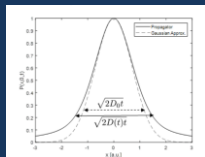
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## Gaussianity

- In the simplest case of free diffusion without boundaries:

$$P(\mathbf{r}, \mathbf{r}_0, t) = \frac{1}{\sqrt{4\pi Dt}} e^{-(\mathbf{r}-\mathbf{r}_0)^2/4Dt}$$



- The propagator is a Gaussian function
- $D$  is the width of the propagator

Jenspersen, ISMRM 2018

- In general, the propagator is not a Gaussian, and the simple diffusion coefficient is not a constant but time-dependent!
- Deviation from Gaussianity: stretched exponential, kurtosis...

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## Diffusion-weighted imaging (DWI)

Moving spins accumulate phase in the presence of magnetic gradient:

$$\varphi(\mathbf{t}) = -\gamma \int_0^t \overline{\mathbf{G}(\mathbf{t}')} \cdot \overline{\mathbf{r}(\mathbf{t}')} dt'$$

- For a large ensemble of spins with random trajectories, the **net phase is zero**.
- However, there will be a spread of phase, which results in **signal intensity reduction** (Bloch-Torey Equation):

$$S(\mathbf{t}) = S_0 e^{-D \int_0^t \overline{k(\mathbf{t}')} \cdot \overline{k(\mathbf{t}')} dt'}$$

in which:

$$\overline{k(\mathbf{t}')} = \gamma \int_0^t \overline{\mathbf{G}(\mathbf{t}')} dt'$$

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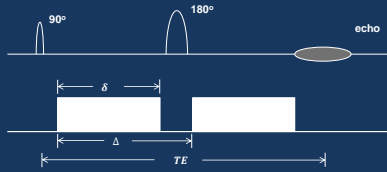
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### Stejskal-Tanner pulsed field gradient (PFG)



$$S(t) = S_0 e^{-bD}$$

$$b = \int_0^{TE} \overline{k(t')} \cdot \overline{k(t')} dt' = (\gamma G \delta)^2 \left[ \Delta - \frac{\delta}{3} \right]$$

*b-value is a scan parameter, and D is the property of the tissue*

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### Diffusion measurement

Quantitation of diffusion (simplest case):

$$D = -\frac{1}{(b_2 - b_1)} \ln \left[ \frac{S(b_2)}{S(b_1)} \right]$$

Alternatively, a linear fit can be used if measurements at more b-values are available.

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### Diffusion anisotropy

Diffusion in anisotropic medium may be represented by a 3x3 second order rank tensor:

$$D = \begin{bmatrix} D_{xx} & D_{xy} & D_{xz} \\ D_{yx} & D_{yy} & D_{yz} \\ D_{zx} & D_{zy} & D_{zz} \end{bmatrix}$$

Diffusion weighted imaging can be used to determine the rotationally invariant parameters like **mean diffusivity** and **fractional anisotropy**, or even the full diffusion tensor (six independent elements).

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## Apparent diffusion coefficient (ADC)

Because of its complexity compared to homogeneous media, diffusion in biological tissues is represented by ADC, instead of diffusion coefficient ( $D$ ).

Further, in vivo measurement of ADC is affected by:

- Perfusion
- Noise

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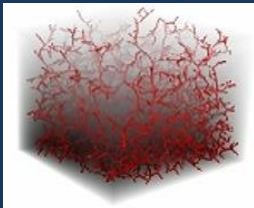
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## Perfusion



<http://iopscience.iop.org/article/10.1088/0031-9155/57/19/6103>

- Perfusion refers to blood flow in microcapillaries that are embedded in tissue
  - Has linear velocity
  - Microcapillaries can be assumed to be distributed with random orientation on a voxel scale

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## Perfusion or IVIM

- Signal contribution can be modelled as pseudodiffusion or intravoxel incoherent motion (IVIM) in the bi-exponential model:

$$S(b) = (1 - f)e^{-bD} + fe^{-bD^*}$$

$f$  is the perfusion fraction and  $D^*$  is the pseudodiffusion constant

Le Bihan, D., et al. (1988). "Separation of diffusion and perfusion in intravoxel incoherent motion MRI imaging." *Magnetic Resonance in Medicine* 16(2): 497-505.

Keep in mind that in the presence of perfusion:

- tissue diffusion may be overestimated without IVIM
- Perfusion usually affects signals at only low  $b$ -values ( $\leq 100$ - $200 \times 10^3$  s/mm<sup>2</sup>)

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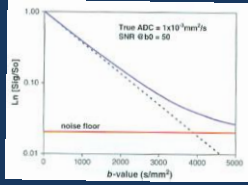
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**SNR**



Chenevert, *Diffusion Weighted MRI – Applications in the Body*

- Noise floor raises the signal at high b-values → lower ADC
- Calculated ADC is dependent on baseline SNR, selected b-values and true ADC (which is unknown and different for different tissues) → protocol optimization

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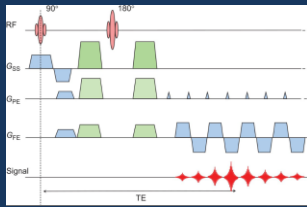
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**DWI acquisition**

- most commonly performed with the single shot echo planar imaging (ssEPI) sequence because of its speed



- ssEPI is prone to image distortion and ghosting
  - sensitive to B₀ inhomogeneity or chemical shift
  - sensitive to eddy currents

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**DWI acquisition**

- Other pulse sequences:
  - spiral/radial/propeller
  - SSFP/FSE
- Hardware improvements:
  - Stronger, faster, higher-fidelity gradients
  - Multi-channel transmit and receive RF
- Software improvements:
  - parallel imaging
  - Reduced FOV through 2D spatially selective excitation or outer volume signal suppression
  - Multishot imaging with navigators for phase correction
  - Simultaneous multislice (SMS)
  - More robust fat suppression strategies

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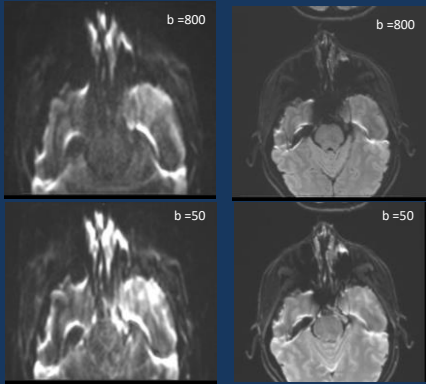
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### SS DWI vs MS DWI



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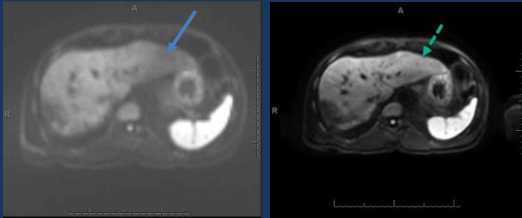
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### Free breathing DWI vs navigated SMS DWI



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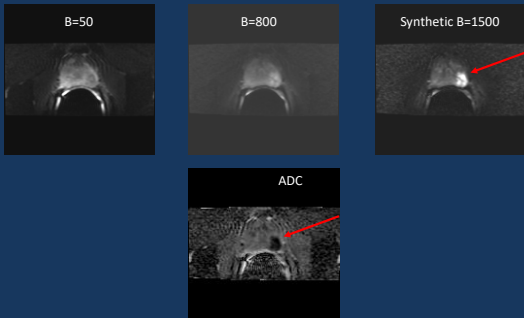
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### Calculated FOCUS DWI of prostate



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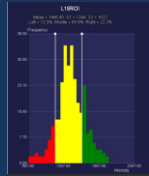
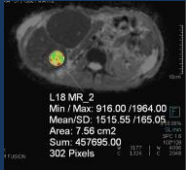
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## DWI – quantitative analysis

- Model based or data-driven
  - Mono- or bi-exponential
  - Non-Gaussian models
- Measurement can be
  - ROI based
  - Pixel or histogram based
  - Radiomics feature analysis




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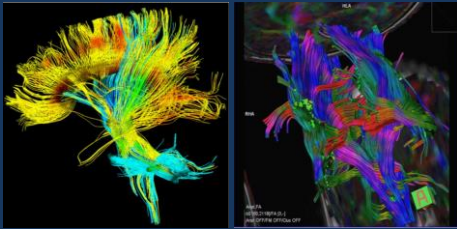
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## Clinical applications of DWI

- First successful application of DWI is the early detection of stroke
- Another major application of DWI in the brain is white matter fiber tracking



<https://usa.healthcare.siemens.com/>

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## Technical challenges of extracranial DWI

- Lower SNR
- Motion (respiratory, cardiac, and involuntary motion)
- Large field inhomogeneity
- Fat contamination

High quality DWI images have been achieved in nearly every anatomical areas due to the technical advances

- Liver/pancreas
- prostate
- breast
- spine
- MSK

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### ***Oncological applications of DWI***

- Lesion detection and characterization
  - Improved sensitivity and specificity
- Assessment and prediction of treatment response
  - Changes in diffusion precedes changes in sizes
- The exact biophysical basis is still unclear
  - Malignance or aggressiveness is associated with higher cellularity, tissue disorganization, and increase in extracellular tortuosity → low diffusion
  - Tumors responding to treatment have increased cell death → increased diffusion
    - Diffusion measurement may depend on the timing of imaging during the treatment

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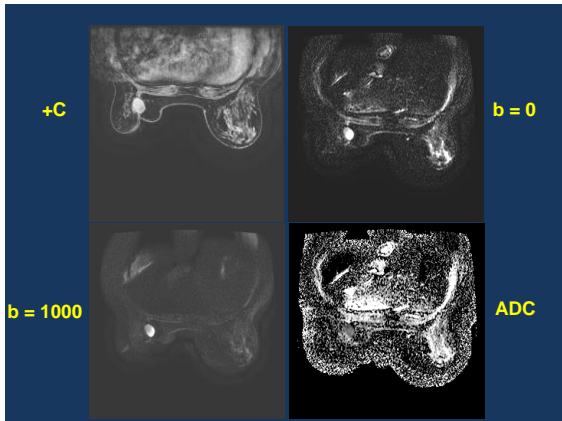
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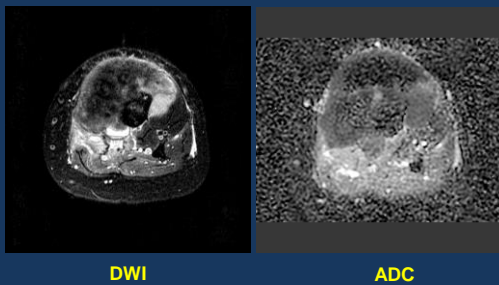


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### ***DWI of sarcoma***




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### Myometrial invasion of endometrial cancer

- 51 patients under rFOV DWI in addition to conventional T2W and DCE MRI
- Surgical pathological findings as gold standard
- rFOV DWI gave statistically better accuracy, sensitivity, specificity than T2W combined with DCE

Reader and modality		Accuracy	Sensitivity	Specificity	Percent	
					Positive predictive value	Negative predictive value
Reader 1						
T2W1 + DCE MRI	84	100	82.2	42.8	100	
rFOV	92	100	90	60	100	
Reader 2						
T2W1 + DCE MRI	96	83.3	97.8	83.3	97.8	
rFOV	98	100	97.8	85.7	100	

The rFOV sequence had a better accuracy and positive predictive value for DWI for Reader 1 and had a higher sensitivity for Reader 2.

Bhosale, Ma, et al, *J Magn Reson Imaging* 2016

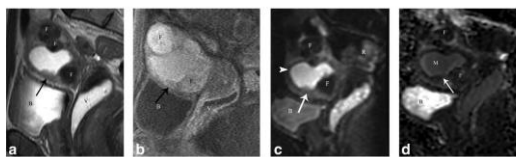


FIGURE 4: A 59-year-old woman with vaginal spotting and Grade II endometrial cancer. Sagittal T2WI (a), 3D T1-weighted DCE MRI (b), and FOCUS (d) show fibroids (F) and the tumor (arrow) in the anterior lower uterus, with superficial myometrial invasion, difficult to see on DCE MRI (b) owing to blood products in the endometrial cavity. The tumor is isointense to the myometrium on DCE and is better seen on FOCUS and T2WI (d). The apparent diffusion coefficient map, with M representing blood products. B: bladder; V: vagina with gel; R: rectum.

Bhosale, Ma, et al, *J Magn Reson Imaging* 2016



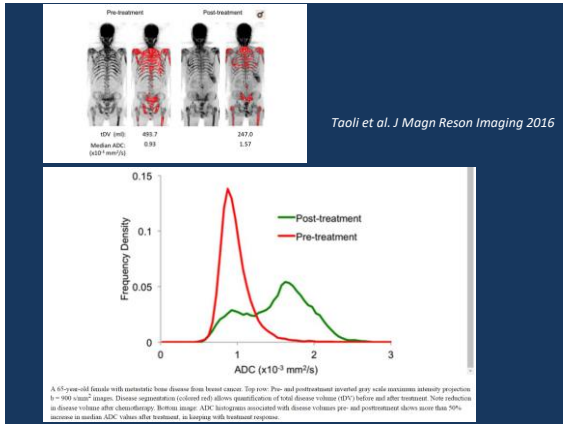
### Whole body DWI



A 69-year-old male with multiple myeloma. Coronal reformatted whole-body DWI image with inverted gray scale contrast for b = 800 s/mm<sup>2</sup>. Abnormal intense diffuse tumor foci are in low signal in the bone marrow.

Taali et al, *J Magn Reson Imaging* 2016





Taoli et al. J Magn Reson Imaging 2016

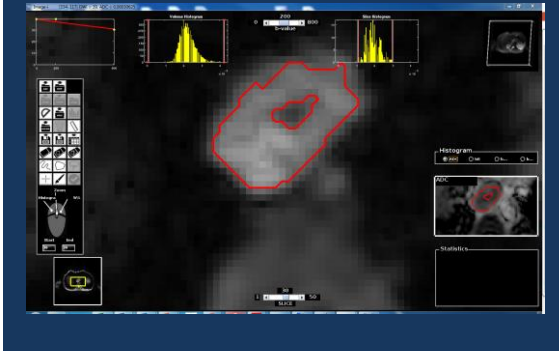
## Early marker of response of esophageal cancer to adjuvant chemoradiation

- Esophageal cancer is a leading cause of cancer death worldwide
- The current standard of care is neoadjuvant chemoradiation followed by surgery
- Complete pathological response (pCR) is achieved in ~30% of the patients, for whom surgery presumably may not be needed or can be delayed
- Early prediction of the treatment response is lacking but would have a significant impact on the patient management

## Study design

- DWI was performed at baseline, at interim (during 3<sup>rd</sup> week of CRT), and at followup before surgery
- Quantitative ADC was extracted from the entire tumor volume
- Histopathological results grouped into pCR and non-pCR groups as gold standards
- 20 patients were enrolled the study

## In-house built software Image-i




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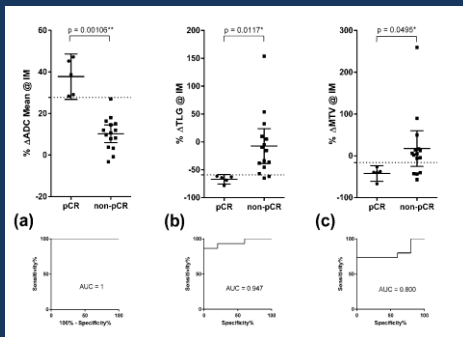
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Fang, Musall, et al. *Int J Radiation Oncology, Biology, Physics*, 2018 (in press)

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## Summary

- Diffusion provides a fundamentally different contrast mechanism that is sensitive to cellular microenvironment of water molecules
- DWI allows quantitative measurement that is repeatable, standardizable, and requires no exogenous contrast agent
- Technical advancement has enabled diffusion imaging with high quality in many extracranial anatomical regions
- Improved lesion detection, characterization, better assessment of treatment response have been or are being established in many clinical areas

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### **Acknowledgement**

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- Benjamin Musall, MS
- Jeremiah Sanders, MS

*Research support from GE Healthcare and  
Siemens Healthineers*

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