

## Lecture 12: Magnetic Resonance Imaging II

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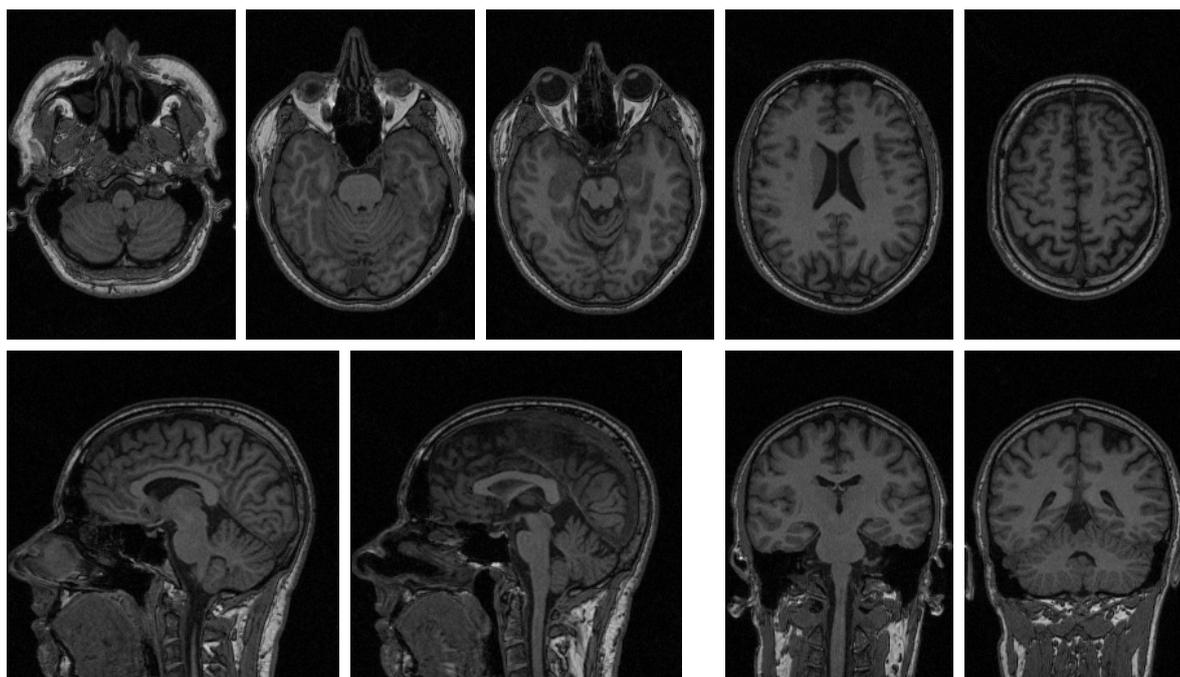
- ◆ MR Resolution
- ◆ Image Distortions
- ◆ Functional MRI
- ◆ Diffusion Imaging

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### Magnetic Resonance Images

#### Another Brain MRI Example



Planar sections from a  $176 \times 256 \times 256$  MRI data set of a human head. Resolution is  $1 \text{ mm} \times 1 \text{ mm} \times 1 \text{ mm}$ . **Top, left to right:** Horizontal slices 77, 108, 117, 154, 179 (counted from bottom). **Bottom, left two images:** Vertical anterior-posterior slices 82, 87. **Bottom, right two images:** Vertical side-to-side slices 143 and 163. *Images measured by the group of Oliver Gruber, Saarland University Hospital, Homburg, 2005.*

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## MR Resolution

- ◆ Medical MR images have resolutions down to ca. 1 mm
- ◆ In laboratory images, resolutions of 1  $\mu\text{m}$  are possible
- ◆ MRI is superior to X-ray CT in contrast resolution, though inferior in spatial resolution
- ◆ Magnetic field intensity is one parameter in determining the possible resolution: The stronger the field, the better the localisation of measured densities.

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## Image Distortions

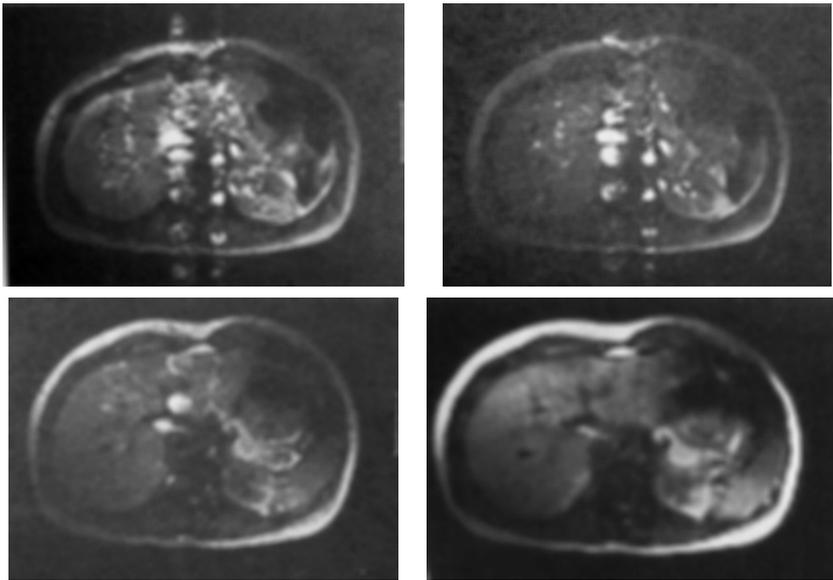
### Motion Artifacts

We focus here on medical MRI.

- ◆ *Movement of patient's body during image acquisition.*  
This can be ruled out mostly.
- ◆ *Movement of organs by breathing and heartbeat.*
  - introduces artifacts
  - can be reduced by averaging multiple measurements
  - synchronising image acquisition with heartbeat could also be an option.
- ◆ *Blood flow.*
  - Flowing blood is mislocated in reconstruction in phase-encoding direction
  - Measurement sequences can be designed such that echoes from dislocated blood are reduced

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## Motion Artifact Examples



Motion artifacts in transaxial abdominal images. **Top left:** Single image acquisition (duration 21 s, with breathing). **Top right:** Same with breath-holding – **Bottom left:** Breath-holding and a special flow-suppression sequence. **Bottom right:** Breath-holding and a flow-suppression sequence with reduced repetition time and reduced spatial and phase resolution, measured four times and averaged. (*Webb 1988*)

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## Imprecision Sources in the Measurement Method

◆ **Chemical Shift.**

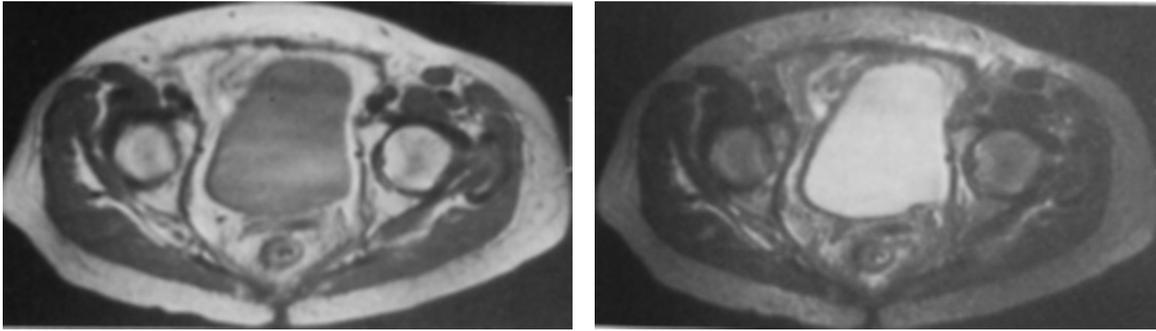
- The slightly different gyromagnetic constants (thus, Larmor frequencies) of atoms in different chemical surroundings lead to localisation errors.
- Particularly, fat in reconstructed images is displaced systematically relatively to water
- These artifacts are less problematic for brain imaging than for some other parts of the body.

◆ **Wrap-Around Artifacts.**

- Occur if the same field intensity as in some measured region is also encountered at another location (note that the RF does not provide spatial resolution).

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## Chemical Shift Example



Chemical shift artifacts: Two transaxial images through the bladder of a cancer patient, acquired with different spin-echo sequences. Note the gaps and overlaps on opposite contours of the bladder. (Webb 1988)

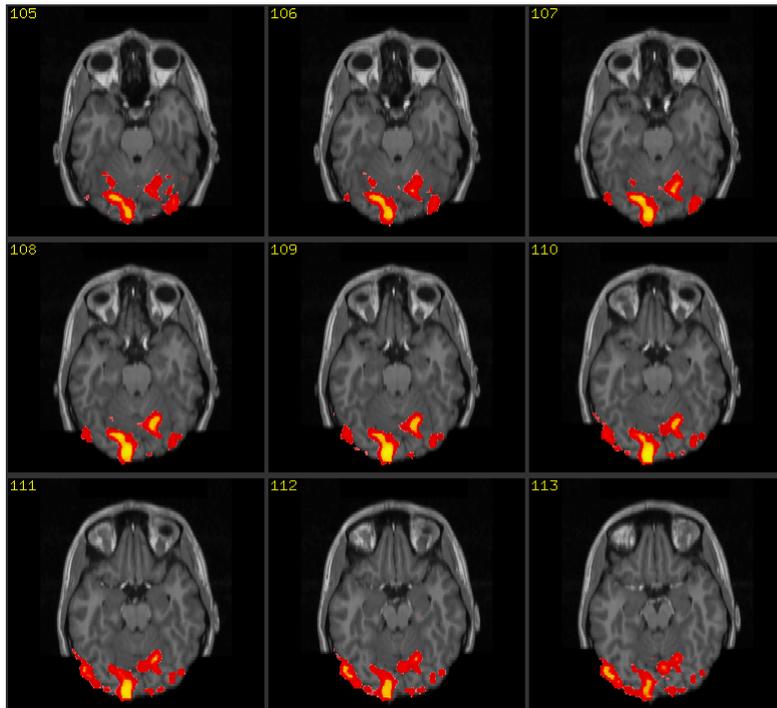
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## Functional MR Imaging (fMRI)

- ◆ Allows to measure changes in neural activity
- ◆ The brain is scanned repeatedly (in intervals of a few seconds) at low resolution
- ◆ **Blood oxygen level-dependent (BOLD) effect:**
  - Increased neural activity leads to higher oxygen consumption
  - Vascular system increases supply of oxygen, overcompensating for the higher demand
  - Oxygenated haemoglobin is therefore enriched in comparison to deoxygenated haemoglobin
  - Deoxygenated haemoglobin reduces MR signal
  - As a consequence, higher neural activity leads to higher MR signal, with a certain delay. Details are still under investigation

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Example



Functional MRI example. fMRI information is displayed in pseudocolours overlaid over a higher-resolution anatomical MRI scan (grey-values). (S. Smith 1998, [http://www.fmrib.ox.ac.uk/fmri\\_intro](http://www.fmrib.ox.ac.uk/fmri_intro))

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Diffusion MR Imaging

- ◆ measures diffusion of water molecules within tissues
- ◆ In an isotropic medium (e.g. free water) water molecules move according to Brownian motion, without directional preferences
- ◆ In tissues, diffusion can be anisotropic because of e.g. membranes obstructing the free movement of water molecules

There are two main applications in sight:

- ◆ Bundles of neuron fibres can be detected since water preferably moves along the fibres but not across them.
  - studies of brain connectivity
  - stroke diagnosis; multiple sclerosis diagnosis
  - diagnosis of neurological diseases (schizophrenia)
- ◆ Muscle fibres can be investigated, in particular the heart muscle (myocard).
  - However, heart diffusion MRI still takes too long to be possible in human body

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## Diffusion MR Imaging (2)



### Diffusion Weighted Imaging (DWI)

- ◆ Spin-echo sequences can be sensitised for displacements of spins during measurement, e.g. by applying two phase-shifting step with a phase-inverting RF pulse between them. Stationary spins therefore experience no net phase shift.
- ◆ It is possible to measure diffusion in one direction.
- ◆ By repetition, diffusion in different directions can be measured.
- ◆ This technique is called **diffusion-weighted imaging (DWI)**

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## Diffusion MR Imaging (3)



### Diffusion Tensor Imaging (DTI, DT-MRI)

The minimal set of measurements for diffusion MRI data that can detect anisotropies in all possible directions consists of seven measurements, leading to a field of positive definite  $3 \times 3$  symmetric matrices (i.e. elements of a six-dimensional data range).

- ◆ Each symmetric matrix represents a **diffusion tensor**. The method is therefore called **diffusion tensor imaging (DTI)** or **diffusion tensor MRI (DT-MRI)**
- ◆ Provided diffusion properties are homogeneous within the measured voxel, the diffusion tensor  $D$  indicates that

$$G(x; D, t) = \frac{1}{\sqrt{(4\pi t)^3 \det(D)}} \exp\left(-\frac{x^T D^{-1} x}{4t}\right)$$

is the probability density for a water molecule to move from  $x = 0$  at  $t = 0$  to point  $x$  in time  $t$ .

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## Diffusion MR Imaging (4)

◆ Measurements for diffusion MRI:

- one proton density measurement  $b_0$  for reference
- diffusion-weighted measurements  $b_1, \dots, b_6$  in six directions (given by unit vectors  $\mathbf{e}_i, i = 1, \dots, 6$ )

◆ Diffusion intensity  $w_i$  in direction  $i = 1, \dots, 6$  can be computed from

$$\frac{b_i}{b_0} = \int_{\mathbf{R}^3} G(x; D, t) (\mathbf{e}_i^T x) dx = e^{\underbrace{t \cdot \mathbf{e}_i^T D \mathbf{e}_i}_{w_i}}$$

◆ From diffusion intensities  $w_1, \dots, w_6$ , the elements of the diffusion tensor are obtained by solving a linear system of equations.

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## Diffusion MR Imaging (5)

◆ Typical choice of directions (unit vectors, symmetrically arranged on the sphere):

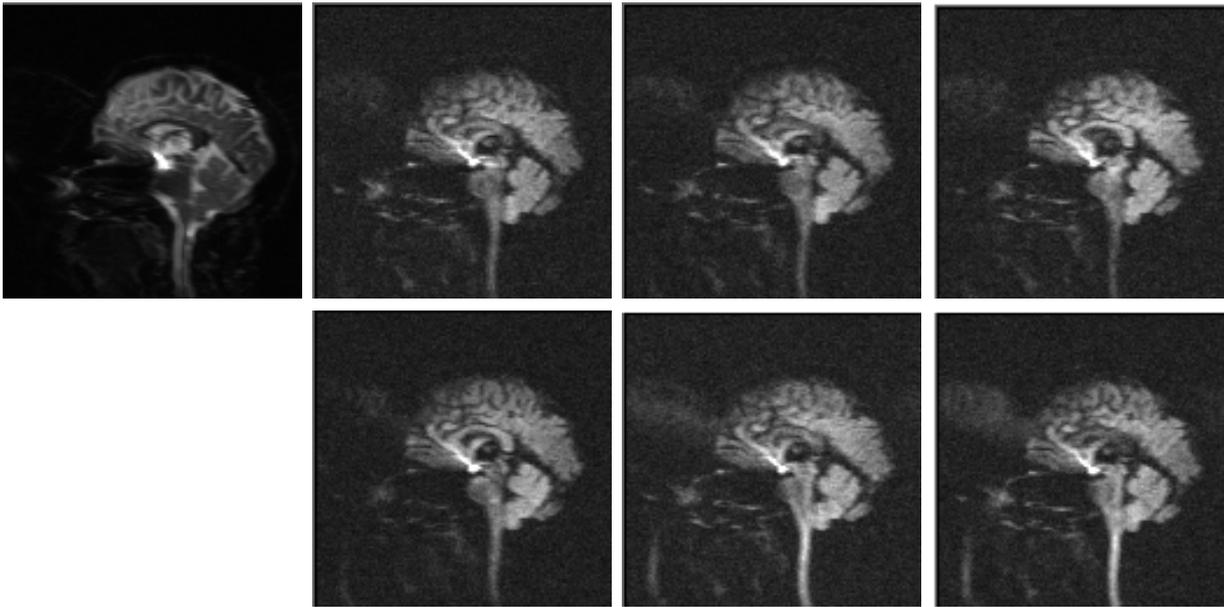
$$\begin{aligned} \mathbf{e}_1 &= \frac{1}{\sqrt{2}} \begin{pmatrix} 1 \\ 1 \\ 0 \end{pmatrix}, & \mathbf{e}_2 &= \frac{1}{\sqrt{2}} \begin{pmatrix} 1 \\ 0 \\ 1 \end{pmatrix}, & \mathbf{e}_3 &= \frac{1}{\sqrt{2}} \begin{pmatrix} 0 \\ 1 \\ 1 \end{pmatrix}, \\ \mathbf{e}_4 &= \frac{1}{\sqrt{2}} \begin{pmatrix} 1 \\ -1 \\ 0 \end{pmatrix}, & \mathbf{e}_5 &= \frac{1}{\sqrt{2}} \begin{pmatrix} 1 \\ 0 \\ -1 \end{pmatrix}, & \mathbf{e}_6 &= \frac{1}{\sqrt{2}} \begin{pmatrix} 0 \\ 1 \\ -1 \end{pmatrix} \end{aligned}$$

◆ The components of the diffusion tensor are then

$$\begin{aligned} d_{11} &= \frac{1}{2}(w_1 + w_2 - w_3 + w_4 + w_5 - w_6), & d_{12} &= d_{21} = \frac{1}{2}(w_1 - w_4), \\ d_{22} &= \frac{1}{2}(w_1 - w_2 + w_3 + w_4 - w_5 + w_6), & d_{13} &= d_{31} = \frac{1}{2}(w_2 - w_5), \\ d_{33} &= \frac{1}{2}(-w_1 + w_2 + w_3 - w_4 + w_5 + w_6), & d_{23} &= d_{32} = \frac{1}{2}(w_3 - w_6) \end{aligned}$$

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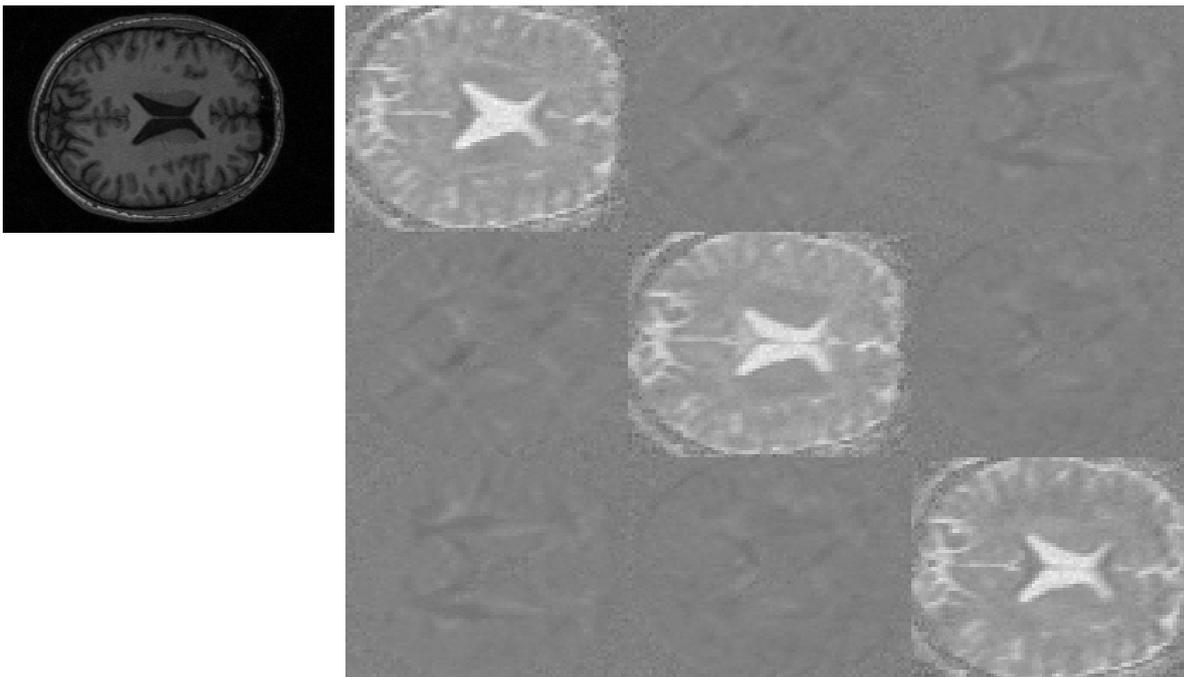
## Example Measurement Data



$b_0$  (top left) and six directional diffusion weighted images  $b_1, \dots, b_6$  for DT-MRI. Diffusion directions correspond to those given on the previous slide, though not necessary in the same order. (Data measured by group of Oliver Gruber, Saarland University Hospital, Homburg)

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## Example Diffusion Tensor Image



**Main image:** One transaxial slice from a DTI data set of a human head, represented componentwise, with middle grey depicting zero. Spatial resolution of this data set:  $2 \text{ mm} \times 2 \text{ mm} \times 2 \text{ mm}$ . **Top left:** Slice 154 from the data set shown on Slide 2, which corresponds to approximately the same section. (Data measured by group of Oliver Gruber, Saarland University Hospital, Homburg)

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### Visualisation by Ellipsoids

- Any positive definite symmetric  $3 \times 3$  matrix  $D$  can be represented by the ellipsoid

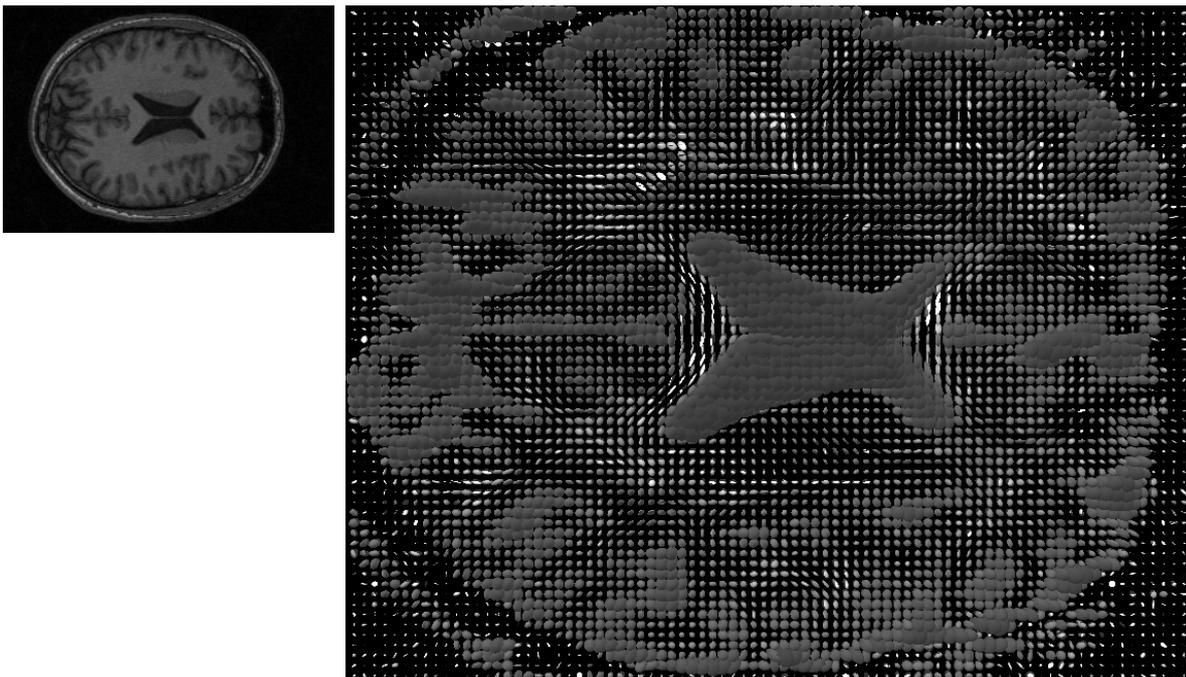
$$x^T D^{-2} x = 1$$

whose principal axes point into the directions of the eigenvectors of  $D$  and have the eigenvalues of  $D$  as their lengths.

*Remark:* If one would choose the ellipsoid  $x^T D^{-1} x = 1$ , one would have directly an isosurface of the aforementioned probability density. However, visualisation of anisotropy would be less pronounced then.

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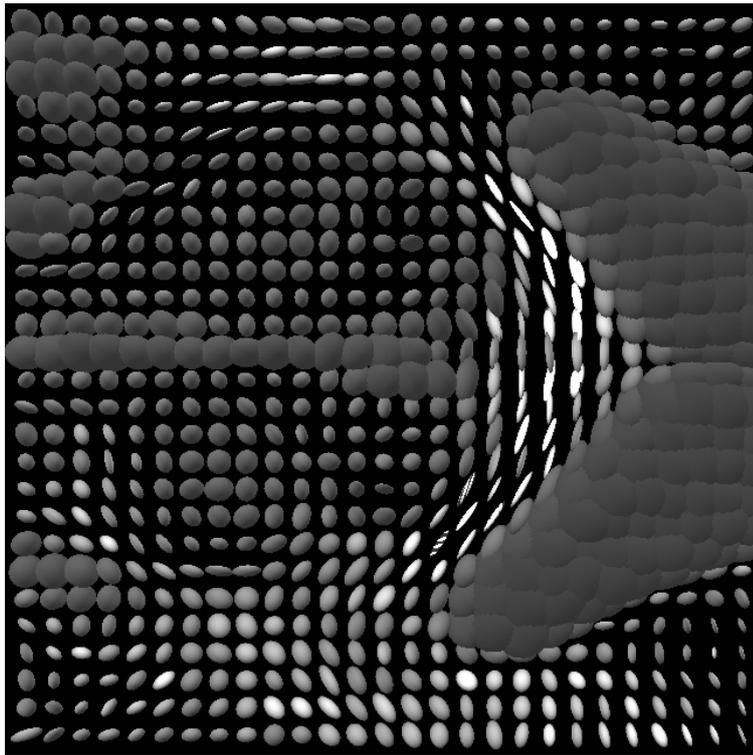
### Ellipsoid Visualisation Example



Same transaxial slice from a DTI data set as on Slide 16, represented by ellipsoids. (*Visualisation software written by Stephan Didas, Luis Pizarro, and Stephan Zimmer.*)

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## Ellipsoid Visualisation Example



Clipping from the DTI slice from the previous slide (corpus callosum and ventricle region).

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## Resolution and Diffusion Time Scale

- ◆ Voxels are typically  $\geq (1 \text{ mm})^3$  in size.
- ◆ Axon (neuron fibre) diameters range from below  $1 \mu\text{m}$  to about  $25 \mu\text{m}$ .
- ◆ The diffusion time in DTI measurements is typically 10 ms, corresponding to displacements of molecules in the order of one micrometre

## Remarks on Interpretation of Brain DTI Data

- ◆ Homogeneous fibre bundles lead to needle-like elongated ellipsoids.
- ◆ Crossing fibre bundles within one voxel lead to pancake-like flattened ellipsoids. Disambiguation of fibre crossings is problematic in DTI data processing.

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## High Angular Resolution Diffusion Imaging

- ◆ Goal: Represent diffusion properties more precisely than just with one symmetric matrix
- ◆ Method: Measure diffusion in a larger number of directions (typically 80 directions). This procedure is called **high angular resolution diffusion imaging (HARDI)**.
- ◆ In processing HARDI data, one often aims at processing directional data immediately, instead of transforming them into a tensor-like structure.
- ◆ However, also representations by e.g. tensors of higher order are under investigation.

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## Summary

## Summary

- ◆ The MR resolution depends on the magnetic field intensity.
- ◆ Image distortions include motion artifacts, chemical shifts, and wrap-around artifacts.
- ◆ Functional MRI (fMRI) measures the oxygen consumption in the brain. This is an indication of neural activity.
- ◆ Diffusion MRI allows to measure the diffusivity properties of water molecules.
- ◆ Diffusion tensor MRI (DT-MRI, DTI) is a sophisticated variant that can detect anisotropies. The diffusion tensors can be visualised by ellipsoids.

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