

EE16B

Designing Information Devices and Systems II

Lecture 14B
Last Lecture

Intro

- Last time:
 - Change of basis
 - Frequency analysis through projections onto complex harmonics
 - Discrete Fourier Transform

- Today
 - Wrap up DFT
 - How MRI works

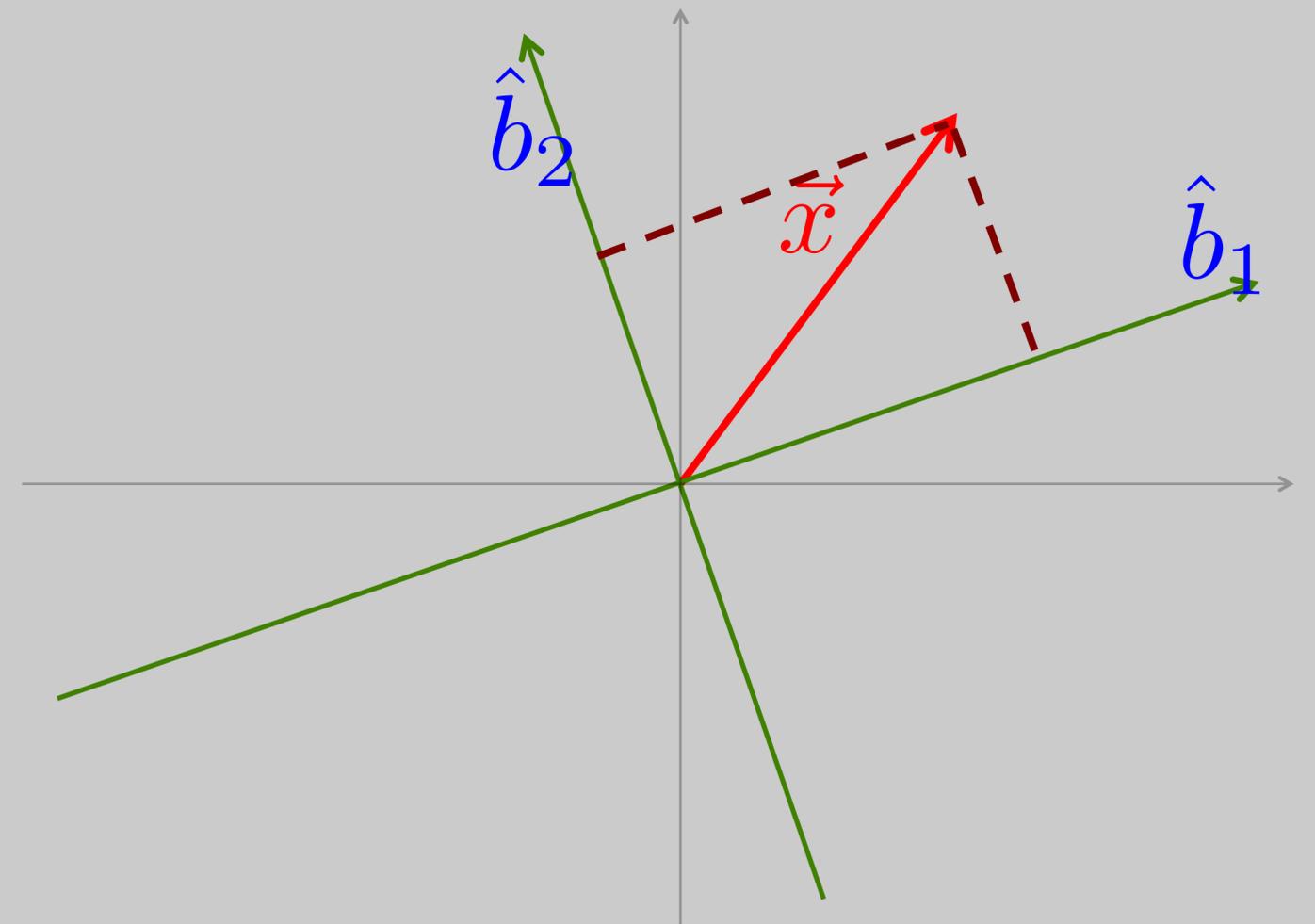
Change of Coordinates (Basis)

- We can compute new coordinates by projections onto orthonormal basis vectors

New coordinates:

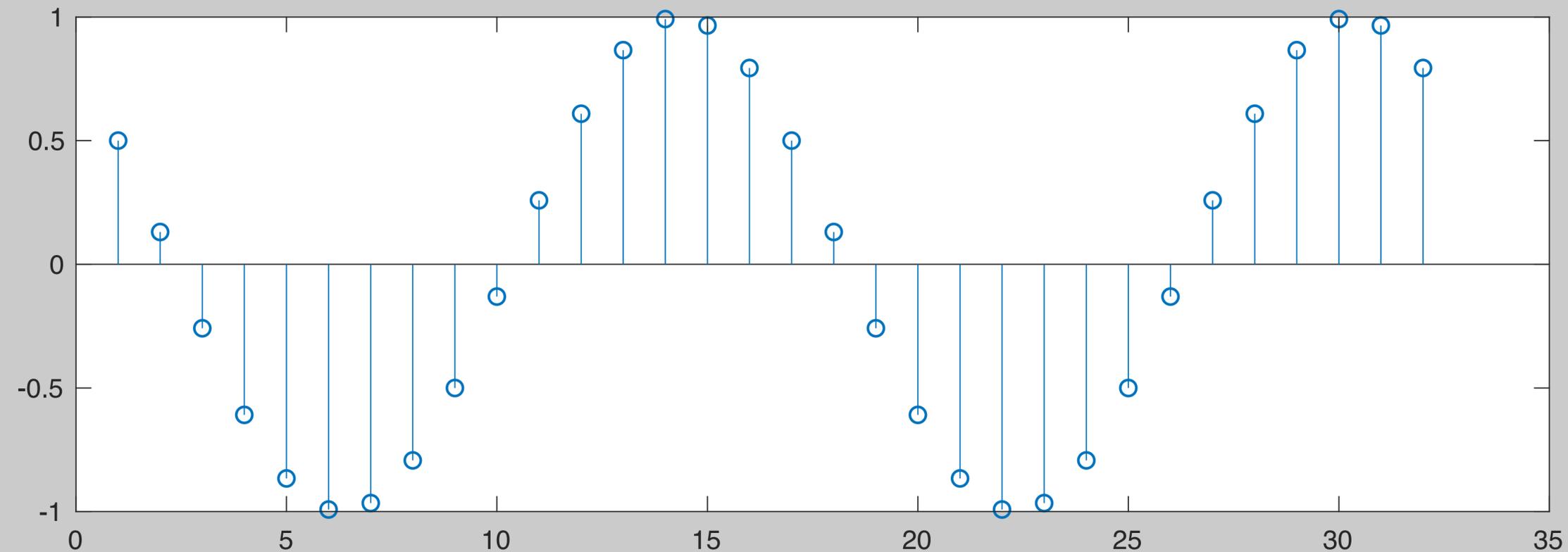
$$\begin{bmatrix} \hat{b}_1^* \vec{x} \\ \hat{b}_2^* \vec{x} \end{bmatrix} = \begin{bmatrix} \hat{b}_1 & \hat{b}_2 \end{bmatrix}^* \vec{x}$$

$$\Rightarrow \vec{x} = (\hat{b}_1^* \vec{x}) \hat{b}_1 + (\hat{b}_2^* \vec{x}) \hat{b}_2$$



Frequency Analysis

- How can we find the frequency of this $N=32$ length signal?



Project on unit sinusoidal vectors?

Frequency Analysis Through Projections

- N-length normalized discrete frequency:

$$u_{\omega}[n] = \frac{1}{\sqrt{N}} e^{j\omega n} \quad 0 \leq n < N \quad 0 \leq \omega < 2\pi$$

$$\vec{u}_{\omega} = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\omega 0} \\ e^{j\omega 1} \\ \vdots \\ e^{j\omega(N-1)} \end{bmatrix} \Rightarrow X(\omega) = \vec{u}_{\omega}^* \vec{x} = \frac{1}{\sqrt{N}} \sum_{n=0}^{N-1} x[n] e^{-j\omega n}$$

DFT vs DTFT

$$\vec{u}_k = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\frac{2\pi k \cdot 0}{N}} \\ e^{j\frac{2\pi k \cdot 1}{N}} \\ \vdots \\ e^{j\frac{2\pi k \cdot (N-1)}{N}} \end{bmatrix}$$

$$\vec{u}_\omega = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\omega 0} \\ e^{j\omega 1} \\ \vdots \\ e^{j\omega(N-1)} \end{bmatrix}$$

$$X[k] = \vec{u}_k^* \vec{x}$$

$$X(\omega) = \vec{u}_\omega^* \vec{x}$$

$$X[k] = \frac{1}{\sqrt{N}} \sum_{n=0}^{N-1} x[n] e^{-j\frac{2\pi kn}{N}}$$

$$X(\omega) = \frac{1}{\sqrt{N}} \sum_{n=0}^{N-1} x[n] e^{-j\omega n}$$

DFT

$$\vec{u}_k = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\frac{2\pi k \cdot 0}{N}} \\ e^{j\frac{2\pi k \cdot 1}{N}} \\ \vdots \\ e^{j\frac{2\pi k \cdot (N-1)}{N}} \end{bmatrix} = \frac{1}{\sqrt{N}} \begin{bmatrix} W_N^{k \cdot 0} \\ W_N^{k \cdot 1} \\ \vdots \\ W_N^{k \cdot (N-1)} \end{bmatrix} \quad k \in [0, N-1]$$

$$\Rightarrow X[k] = \vec{u}_k^* \vec{x}$$

$$\vec{X} = \underbrace{\begin{bmatrix} | & | & \cdots & | \\ \vec{u}_0 & \vec{u}_1 & \cdots & \vec{u}_{N-1} \\ | & | & & | \end{bmatrix}^*}_{\triangleq F^*} \vec{x}$$

DFT

- DFT Analysis

$$F = \begin{bmatrix} | & | & \cdots & | \\ \vec{u}_0 & \vec{u}_1 & & \vec{u}_{N-1} \\ | & | & & | \end{bmatrix}$$

$$\begin{bmatrix} X[0] \\ \vdots \\ X[N-1] \end{bmatrix} = \begin{bmatrix} - & \vec{u}_0^* & - \\ - & \vec{u}_1^* & - \\ & \vdots & \\ - & \vec{u}_{N-1}^* & - \end{bmatrix} \begin{bmatrix} x[0] \\ \vdots \\ x[N-1] \end{bmatrix}$$

$$\vec{X} = F^* \vec{x}$$

$$X[k] = \frac{1}{\sqrt{N}} \sum_{n=0}^{N-1} x[n] W_N^{-nk}$$

DFT

- DFT Synthesis

$$F = \begin{bmatrix} | & | & \cdots & | \\ \vec{u}_0 & \vec{u}_1 & & \vec{u}_{N-1} \\ | & | & & | \end{bmatrix}$$

$$\begin{bmatrix} x[0] \\ \vdots \\ x[N-1] \end{bmatrix} = \begin{bmatrix} | & | & \cdots & | \\ \vec{u}_0 & \vec{u}_1 & & \vec{u}_{N-1} \\ | & | & & | \end{bmatrix} \begin{bmatrix} X[0] \\ \vdots \\ X[N-1] \end{bmatrix}$$

$$\vec{x} = F \vec{X} = F(F^* \vec{x})$$

$$x[n] = \frac{1}{\sqrt{N}} \sum_{k=0}^{N-1} X[k] W_N^{+nk}$$

Quiz

Compute a 2 point DFT of:

$$\vec{x} = \begin{bmatrix} 1 \\ 1 \end{bmatrix}$$

$$\vec{u}_k = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\frac{2\pi k \cdot 0}{N}} \\ e^{j\frac{2\pi k \cdot 1}{N}} \\ \vdots \\ e^{j\frac{2\pi k \cdot (N-1)}{N}} \end{bmatrix} = \frac{1}{\sqrt{N}} \begin{bmatrix} W_N^{k \cdot 0} \\ W_N^{k \cdot 1} \\ \vdots \\ W_N^{k \cdot (N-1)} \end{bmatrix}$$

$$\vec{u}_0 =$$

$$\vec{u}_1 =$$

$$\vec{u}_0^* \vec{x} =$$

$$\vec{u}_1^* \vec{x} =$$

$$\vec{X} =$$

Example cont

- DFT₂ matrix:

$$F = \frac{1}{\sqrt{2}} \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix}$$

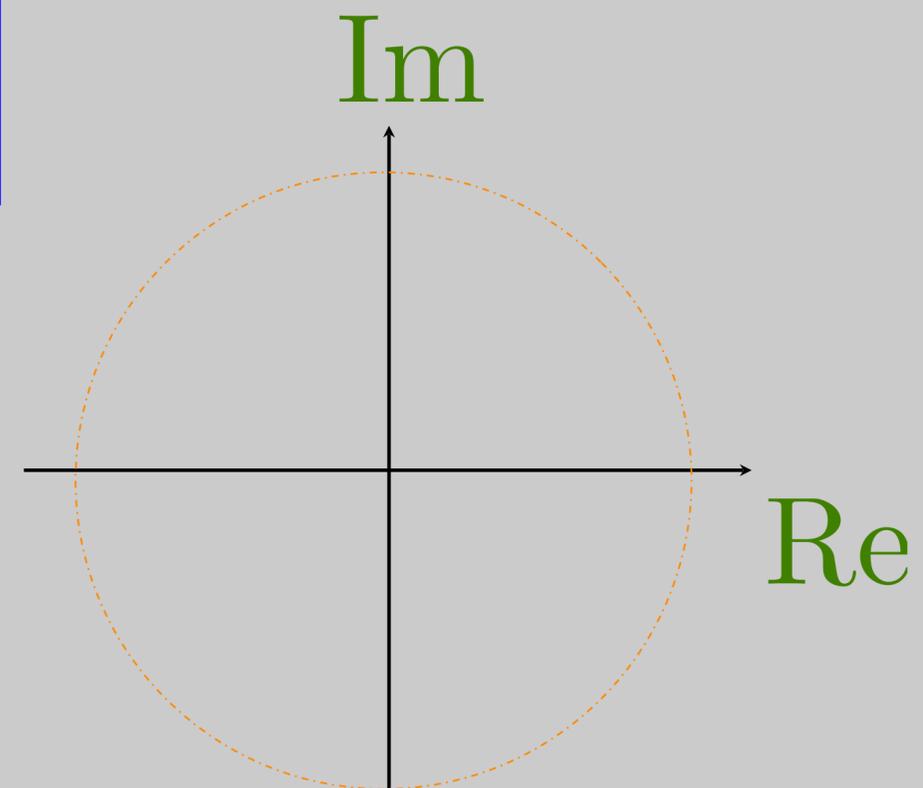
$$\vec{X} = F^* \vec{x} = \frac{1}{\sqrt{2}} \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix} \begin{bmatrix} 1 \\ 1 \end{bmatrix} = \begin{bmatrix} \sqrt{2} \\ 0 \end{bmatrix}$$

Example

$$\vec{u}_k = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\frac{2\pi k \cdot 0}{N}} \\ e^{j\frac{2\pi k \cdot 1}{N}} \\ \vdots \\ e^{j\frac{2\pi k \cdot (N-1)}{N}} \end{bmatrix} = \frac{1}{\sqrt{N}} \begin{bmatrix} W_N^{k \cdot 0} \\ W_N^{k \cdot 1} \\ \vdots \\ W_N^{k \cdot (N-1)} \end{bmatrix}$$

- Compute the inverse DFT₄ of: $\vec{X} = [1 \ 1 \ 1 \ 1]^*$

$$\vec{x} = \underbrace{\begin{bmatrix} & & & \\ & & & \\ & & & \\ & & & \end{bmatrix}}_{W_4^{kn} \triangleq F} \begin{bmatrix} 1 \\ 1 \\ 1 \\ 1 \end{bmatrix}$$



Example

$$\vec{u}_k = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\frac{2\pi k \cdot 0}{N}} \\ e^{j\frac{2\pi k \cdot 1}{N}} \\ \vdots \\ e^{j\frac{2\pi k \cdot (N-1)}{N}} \end{bmatrix} = \frac{1}{\sqrt{N}} \begin{bmatrix} W_N^{k \cdot 0} \\ W_N^{k \cdot 1} \\ \vdots \\ W_N^{k \cdot (N-1)} \end{bmatrix}$$

- Compute the inverse DFT₄ of: $\vec{X} = [1 \ 1 \ 1 \ 1]^*$

$$\vec{x} = \frac{1}{2} \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & j & -1 & -j \\ 1 & -1 & 1 & -1 \\ 1 & -j & -1 & j \end{bmatrix} \begin{bmatrix} 1 \\ 1 \\ 1 \\ 1 \end{bmatrix} = \begin{bmatrix} \\ \\ \\ \end{bmatrix}$$

Example

$$\vec{u}_k = \frac{1}{\sqrt{N}} \begin{bmatrix} e^{j\frac{2\pi k \cdot 0}{N}} \\ e^{j\frac{2\pi k \cdot 1}{N}} \\ \vdots \\ e^{j\frac{2\pi k \cdot (N-1)}{N}} \end{bmatrix} = \frac{1}{\sqrt{N}} \begin{bmatrix} W_N^{k \cdot 0} \\ W_N^{k \cdot 1} \\ \vdots \\ W_N^{k \cdot (N-1)} \end{bmatrix}$$

- Compute the inverse DFT₄ of: $\vec{X} = [1 \ 1 \ 1 \ 1]^*$

$$\vec{x} = \frac{1}{2} \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & j & -1 & -j \\ 1 & -1 & 1 & -1 \\ 1 & -j & -1 & j \end{bmatrix} \begin{bmatrix} 1 \\ 1 \\ 1 \\ 1 \end{bmatrix} = \begin{bmatrix} 2 \\ 0 \\ 0 \\ 0 \end{bmatrix}$$

Complexity computing the DFT

- What's the complexity to compute the DFT?

$$\vec{X} = \begin{bmatrix} \vec{u}_0 & \vec{u}_1 & \cdots & \vec{u}_{N-1} \end{bmatrix}^* \vec{x}$$

$\triangleq F^*$

A: Generally $O(N^2)$

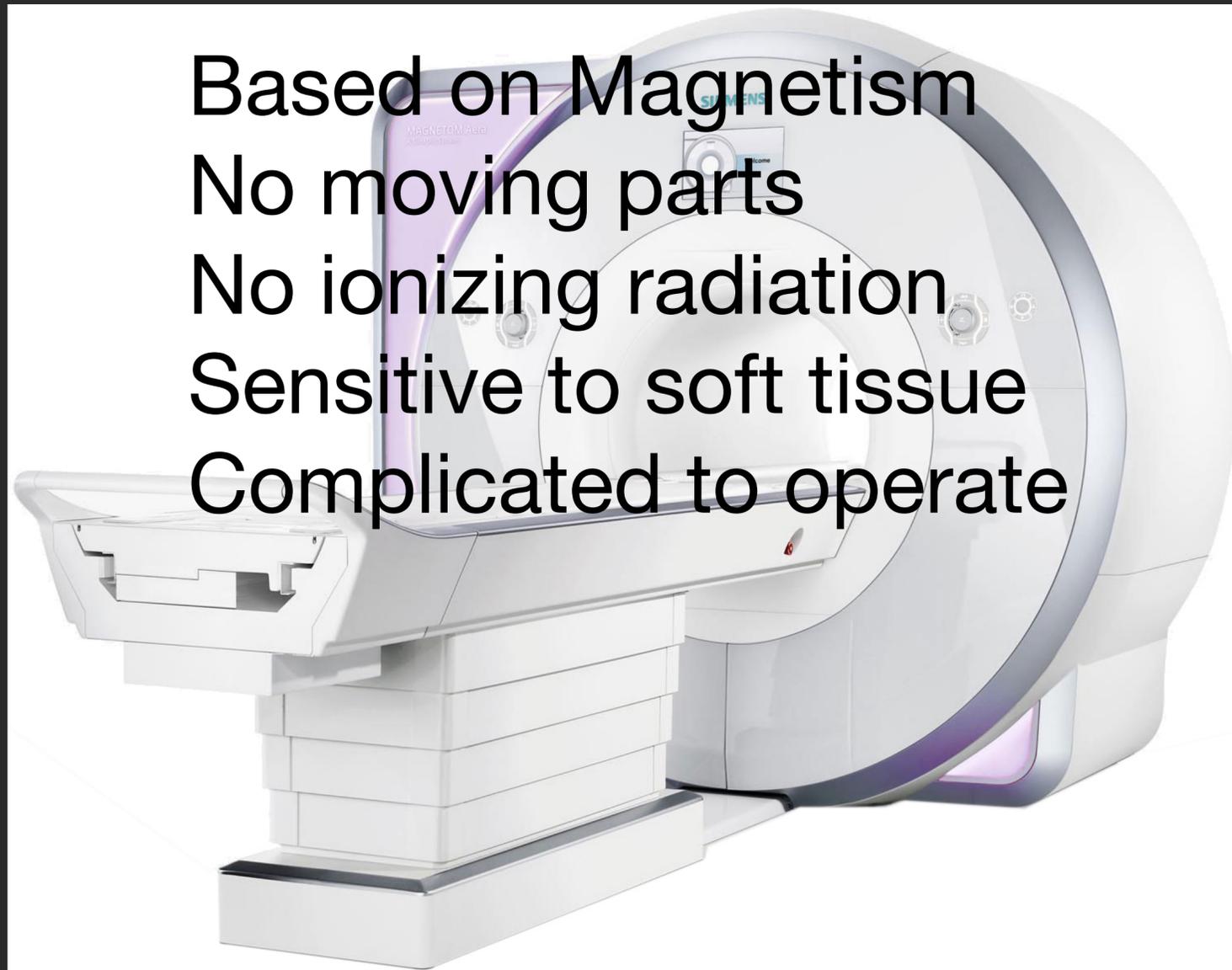
- Exploit structure in W_N^{nk} to speed up!
 - The Fast Fourier transform (FFT)

A: $O(N \log(N))$

MRI vs CT

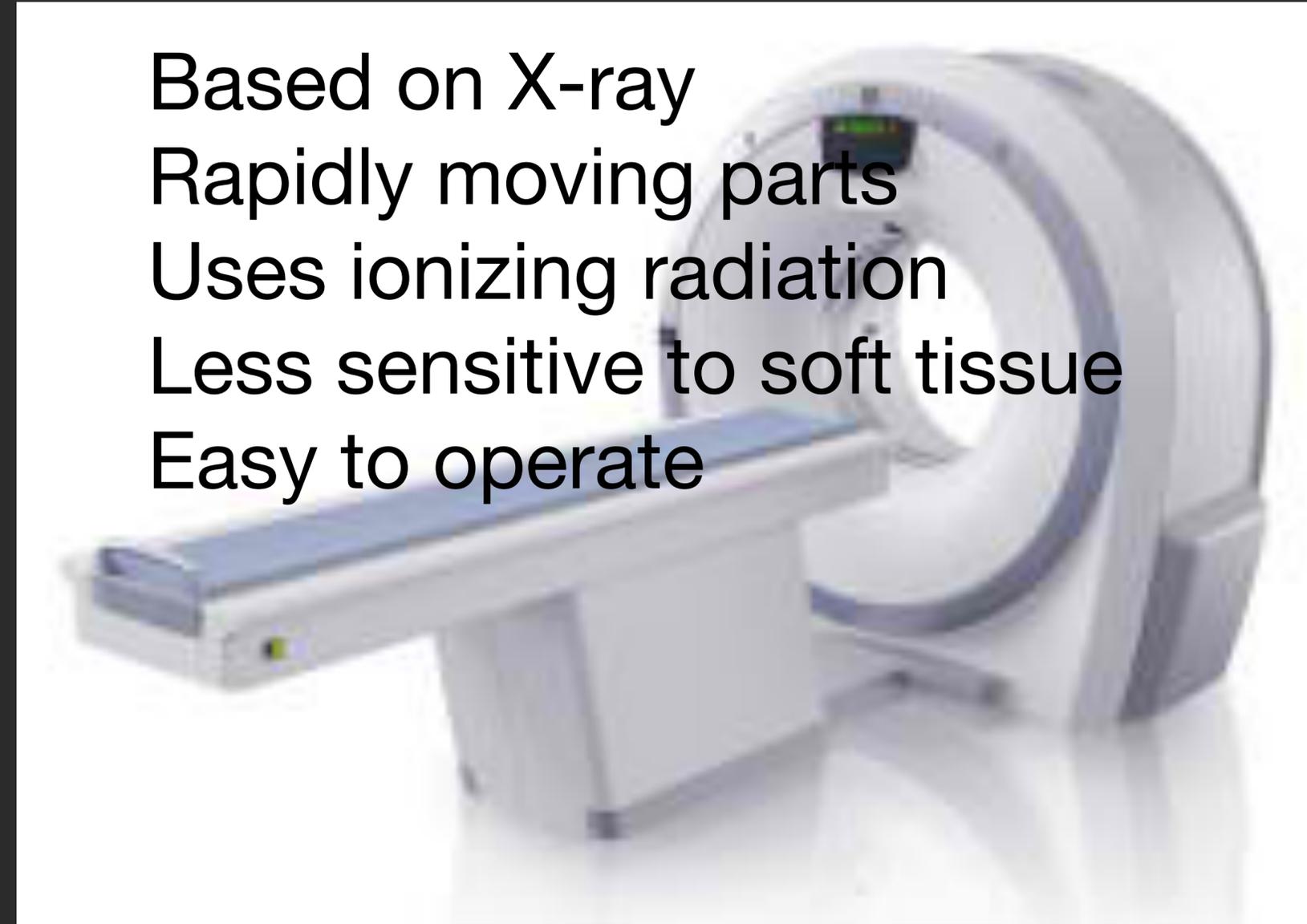
- MRI is VERY VERY different from CT

CT



Based on Magnetism
No moving parts
No ionizing radiation
Sensitive to soft tissue
Complicated to operate

MRI



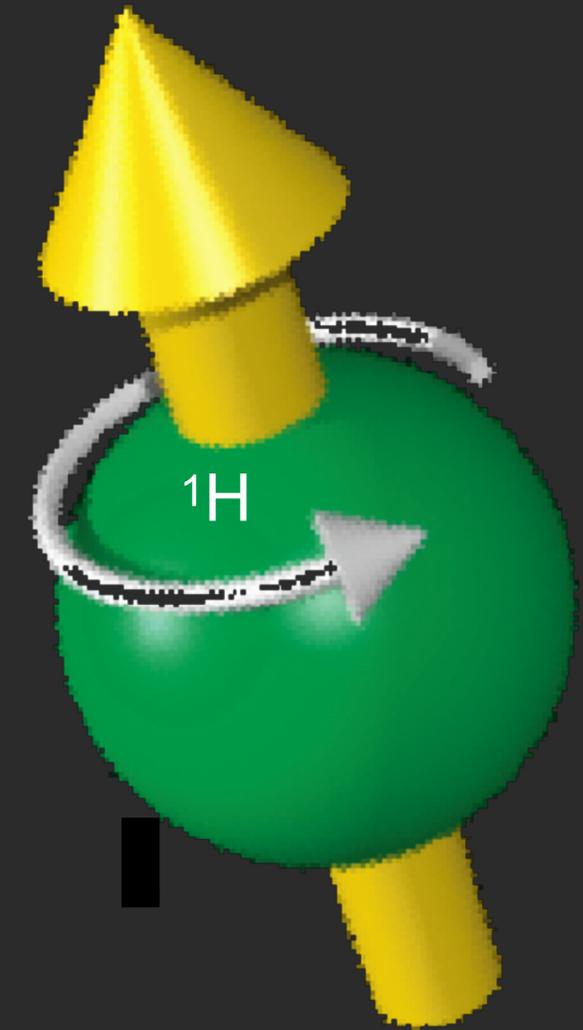
Based on X-ray
Rapidly moving parts
Uses ionizing radiation
Less sensitive to soft tissue
Easy to operate

How Does MRI Work?

- Magnetic Polarization
 - Very strong uniform magnet
- Excitation
 - Very powerful RF transmitter
- Acquisition
 - Location is encoded by gradient magnetic fields
 - Very powerful audio amps

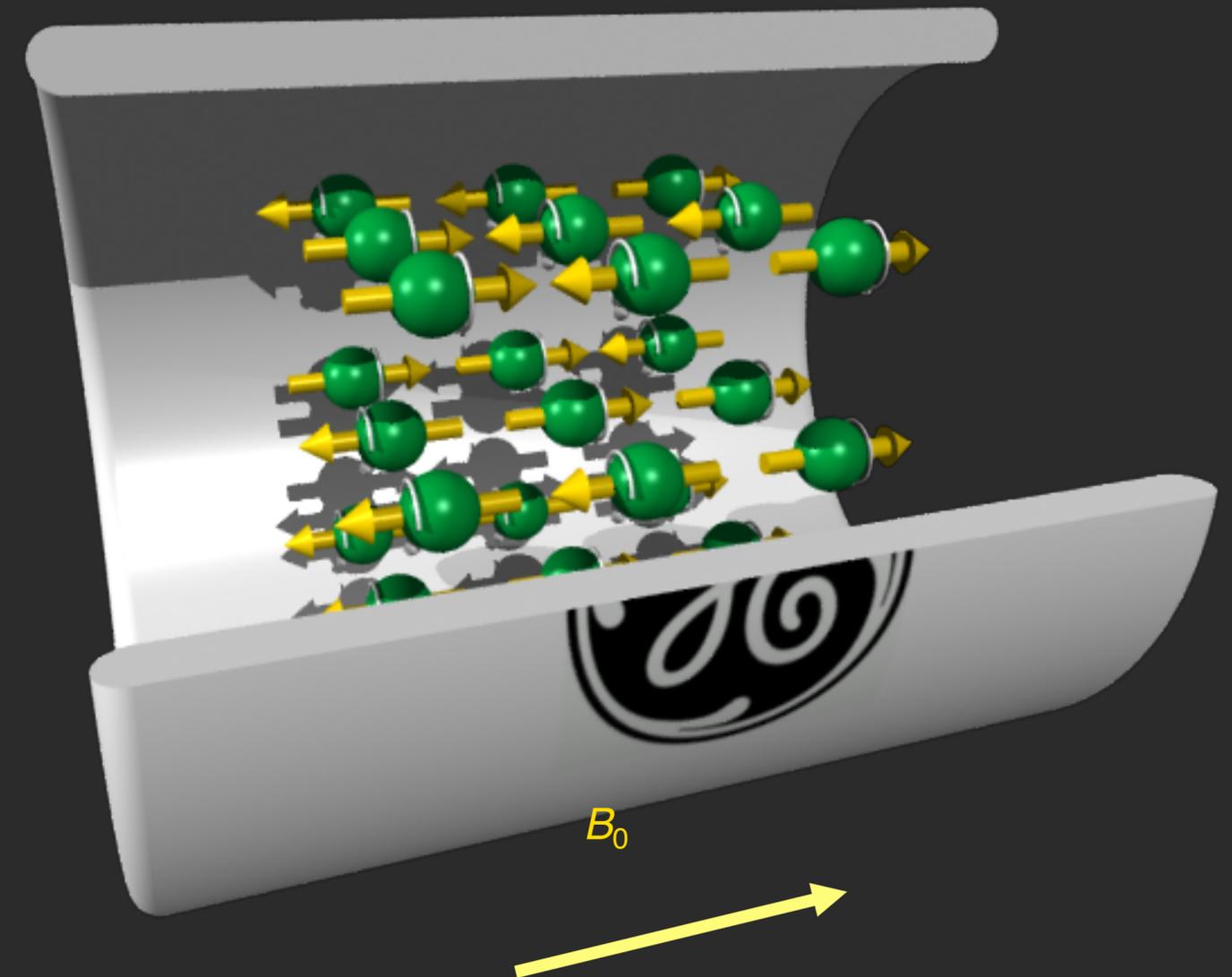
Polarization

- Protons have a magnetic moment
- Protons have spins
- Like rotating magnets



Polarization

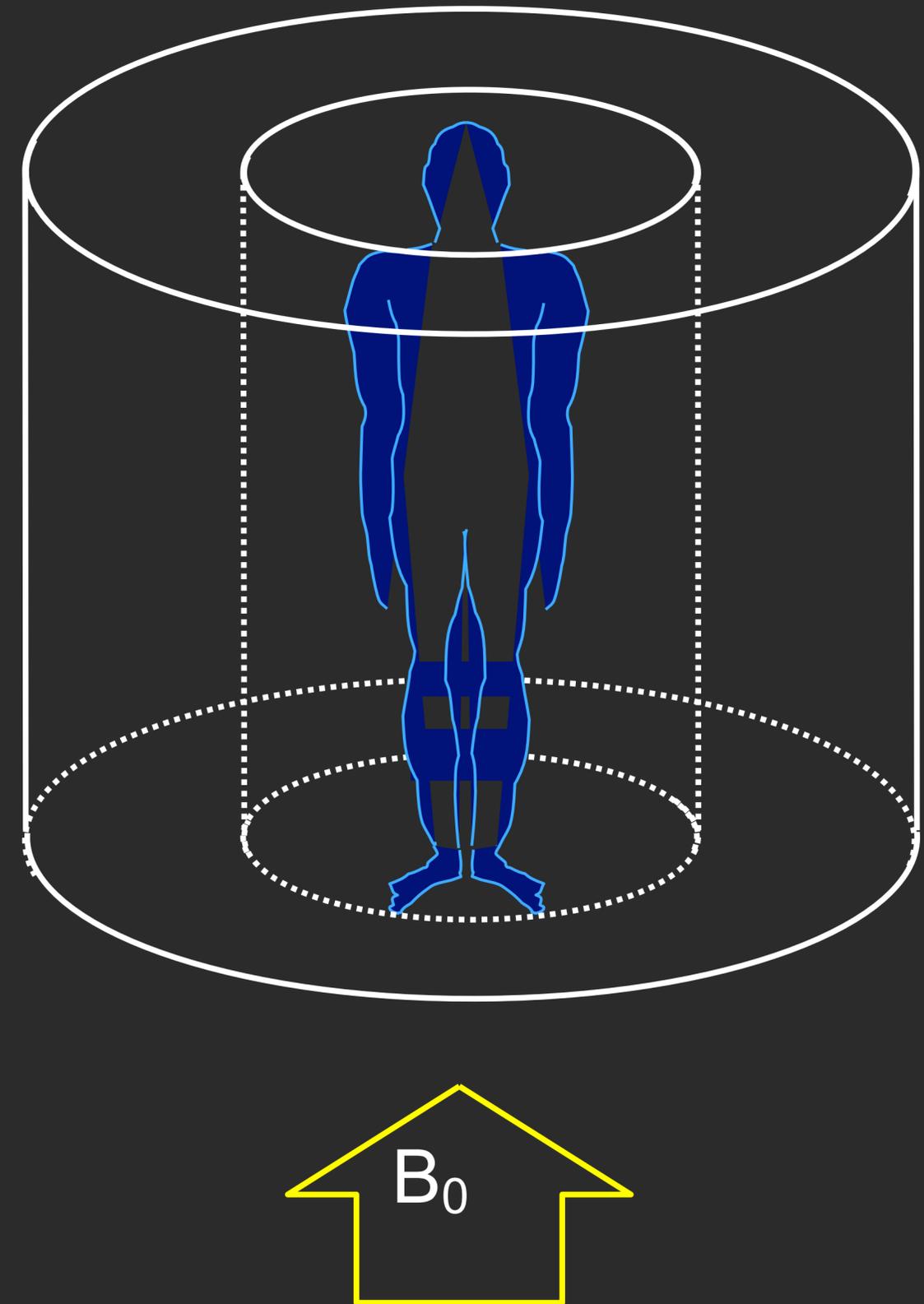
- Body has a lot of protons
- In a strong magnetic field B_0 , spins align with B_0 giving a net magnetization



*Graphic rendering Bill Overall

Polarizing Magnet

- 0.1 to 12 Tesla
- 0.5 to 3 T common
- 1 T is 10,000 Gauss
- Earth's field is 0.5G
- Typically a superconducting magnet

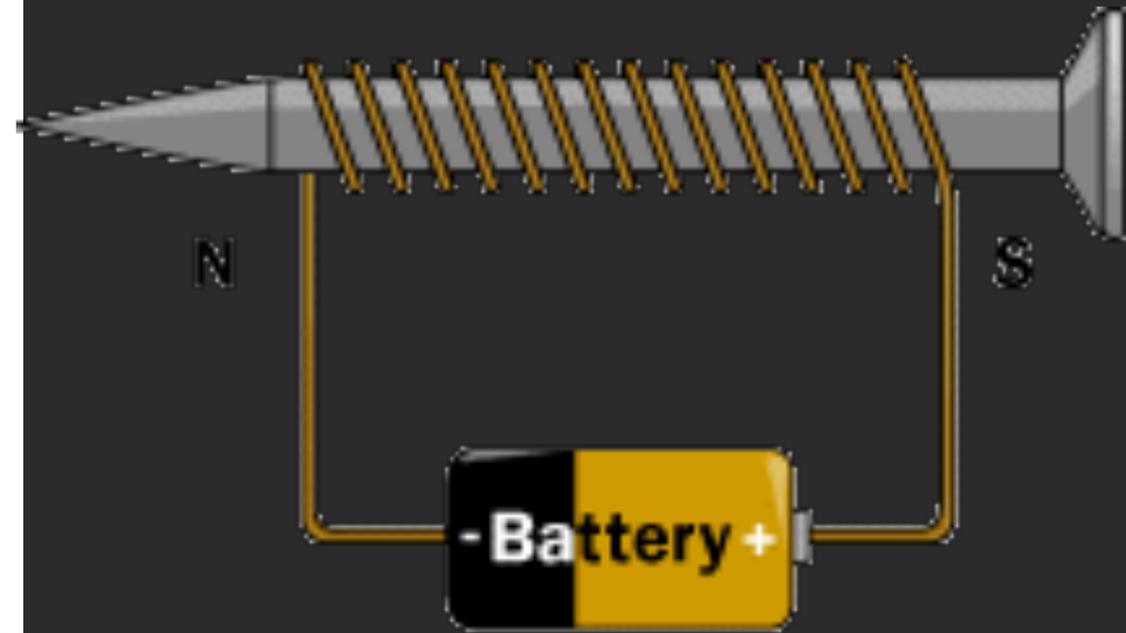
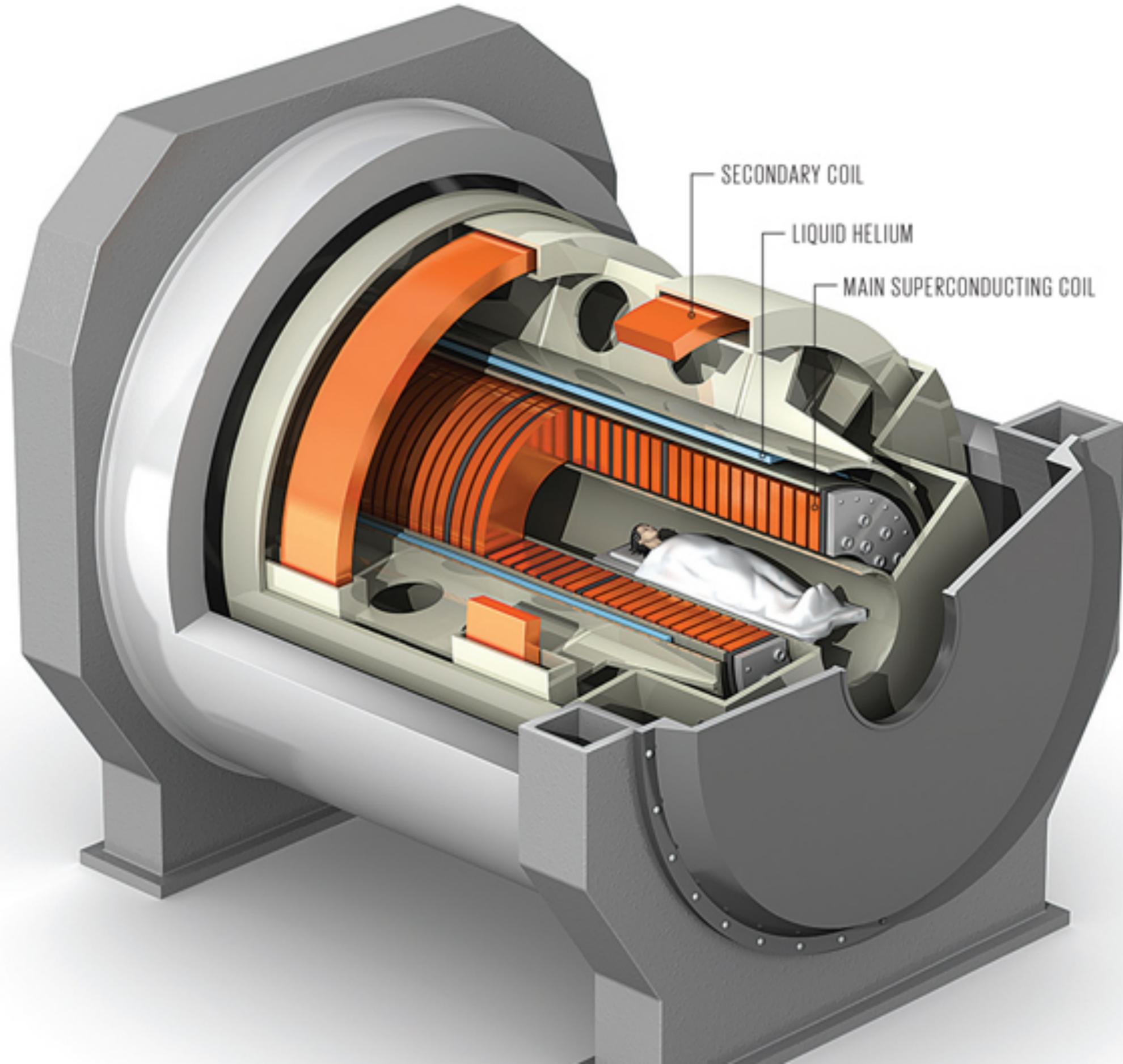


Typical MRI Scanner

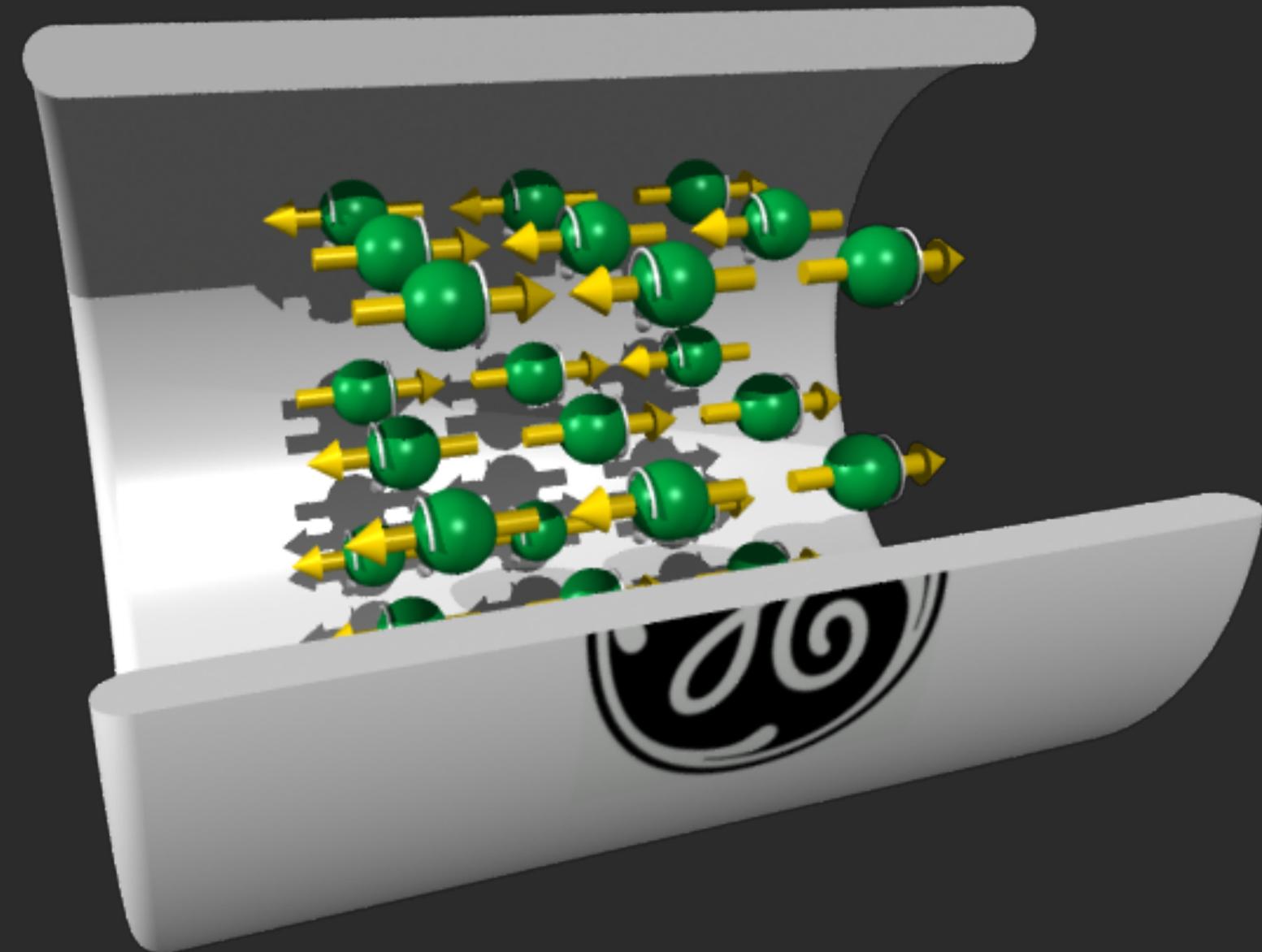
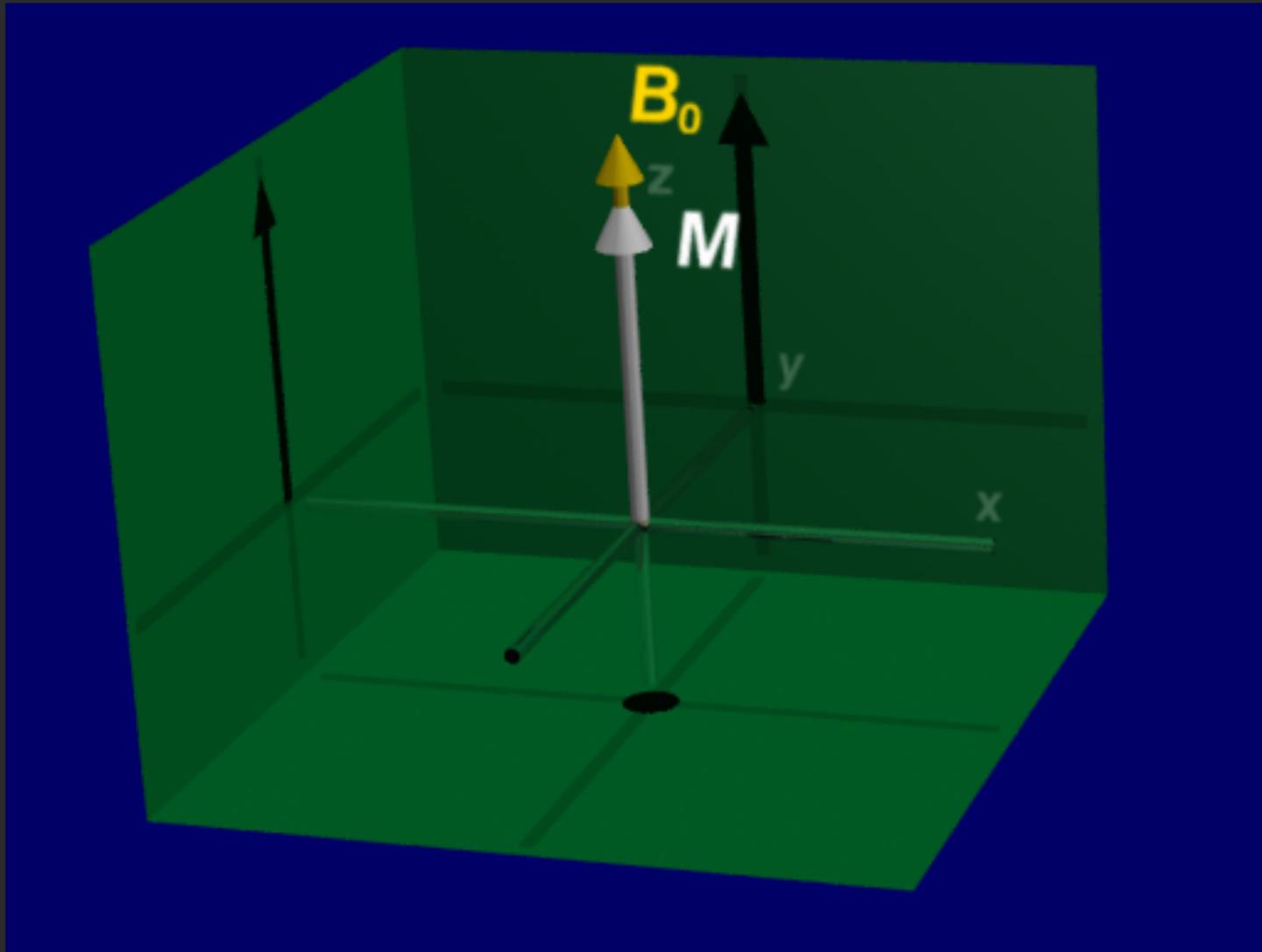




A magnetic
object

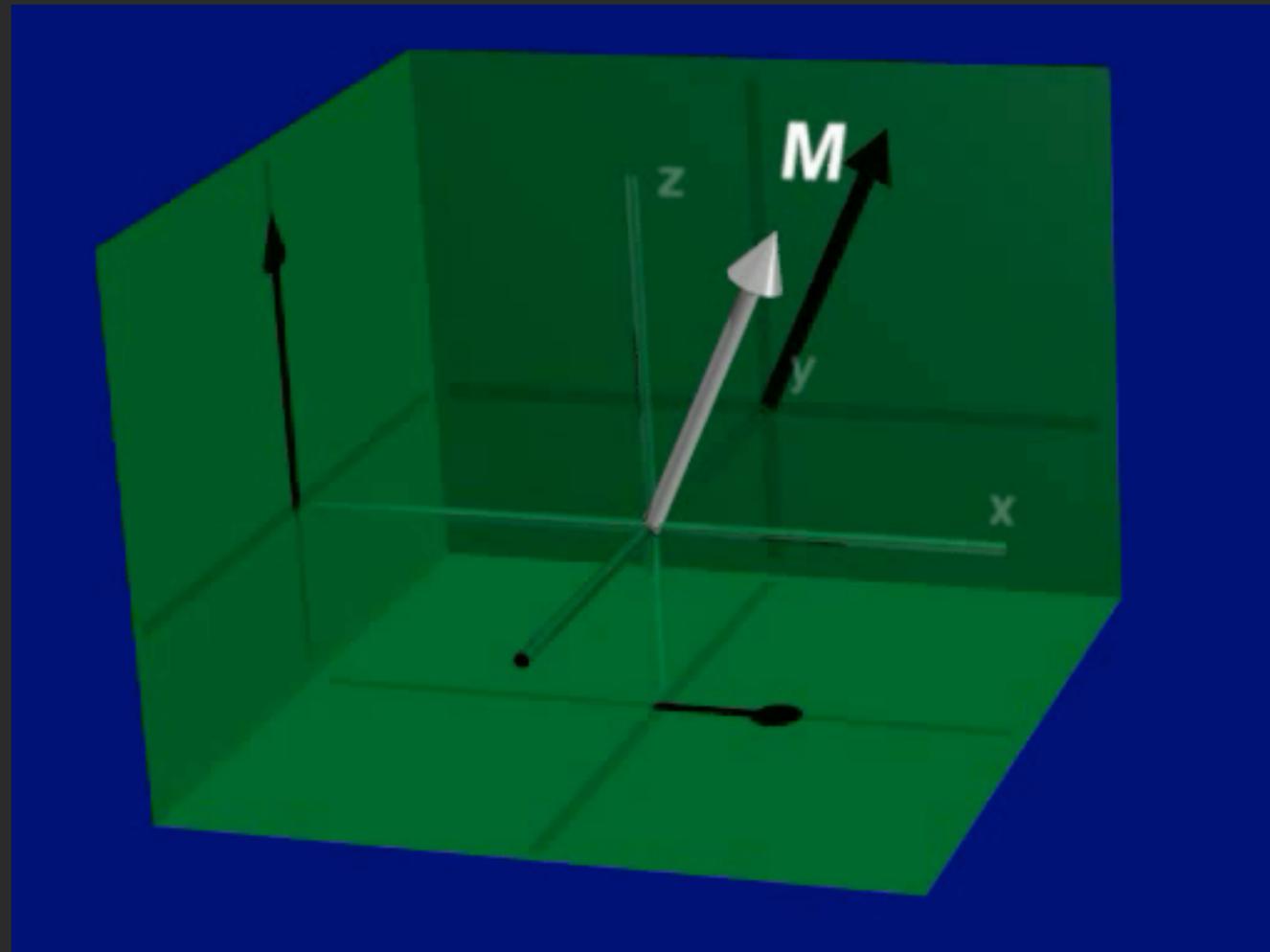


Polarizaion



Free Precession

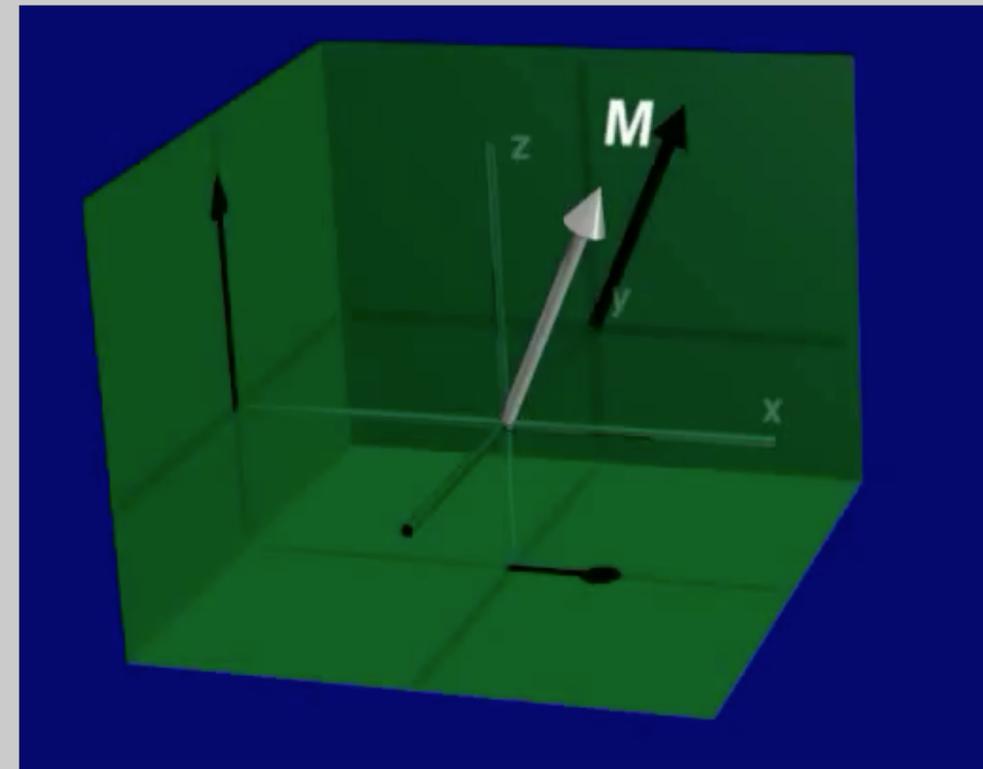
- Much like a spinning top
- Frequency proportional to the field
- $f = 127\text{MHz} @ 3\text{T}$



MIT physics demos

Free precession

$$\begin{bmatrix} \dot{M}_x(\vec{r}, t) \\ \dot{M}_y(\vec{r}, t) \\ \dot{M}_z(\vec{r}, t) \end{bmatrix} = \begin{bmatrix} 0 & \gamma B_0 & 0 \\ -\gamma B_0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} M_x(\vec{r}, t) \\ M_y(\vec{r}, t) \\ M_z(\vec{r}, t) \end{bmatrix}$$

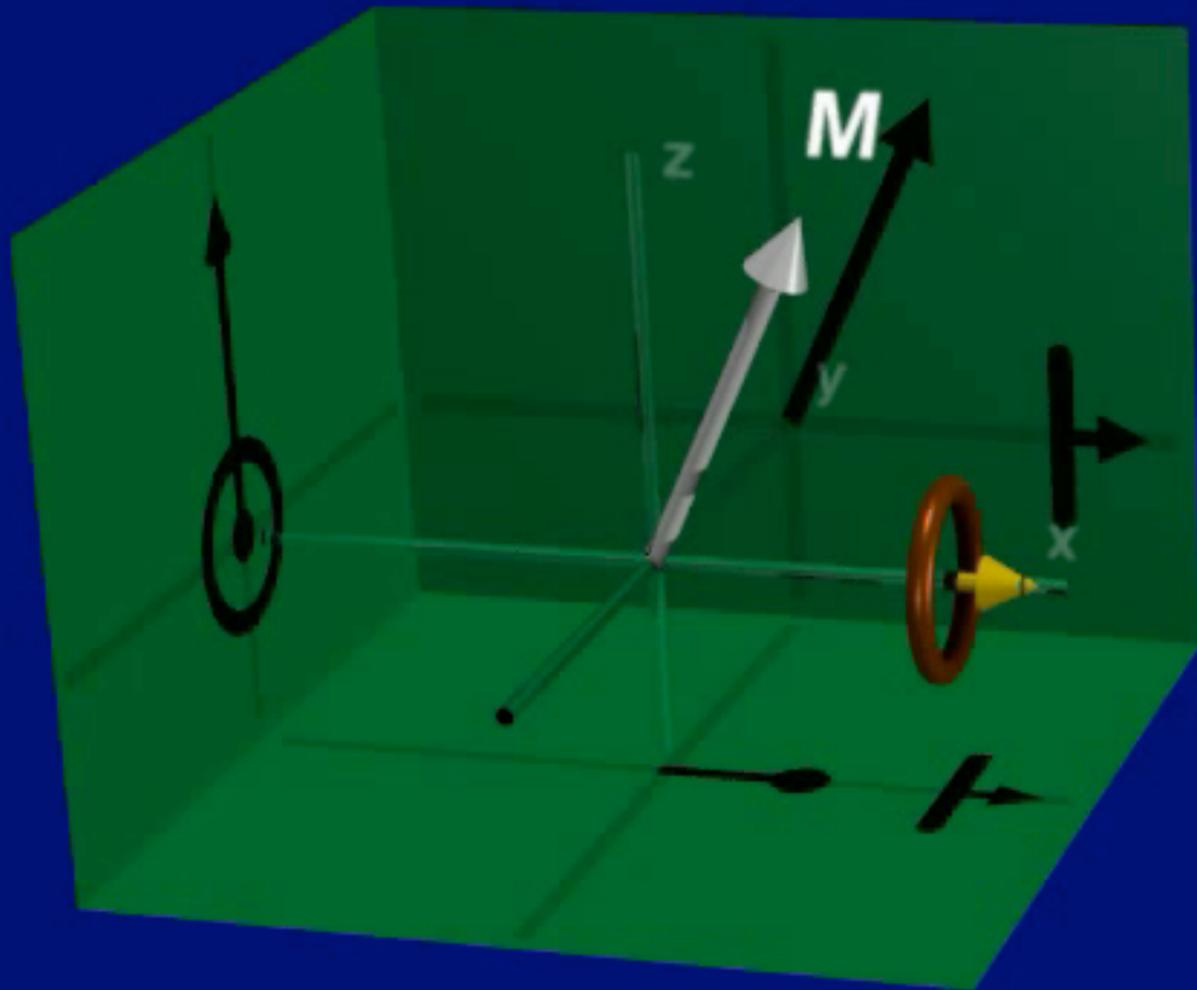


Free Precession

- Precession induces magnetic flux
- Flux induces voltage in a coil

$$\vec{y}(t) = \int_{\vec{R}} C M(\vec{r}, t) d\vec{r}$$

$$C = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 0 \end{bmatrix}$$

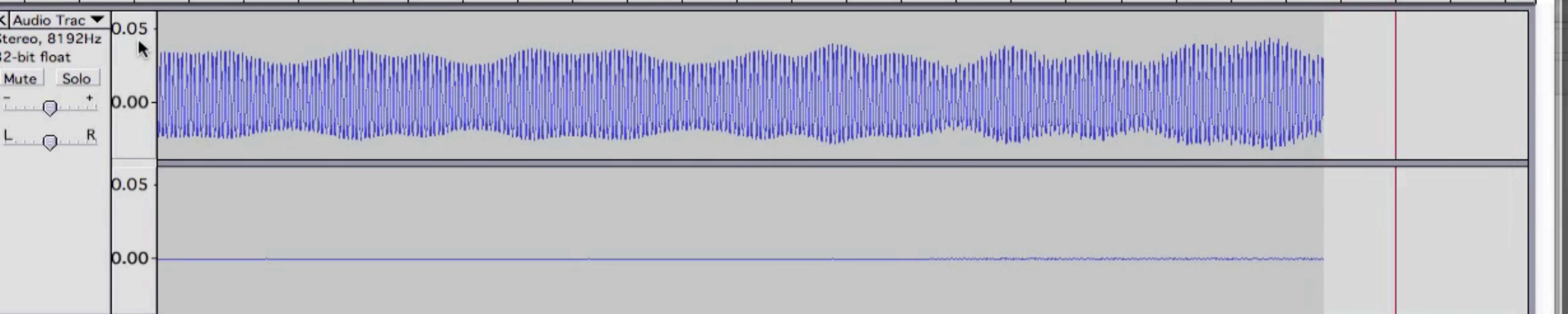


Signal

Audacity

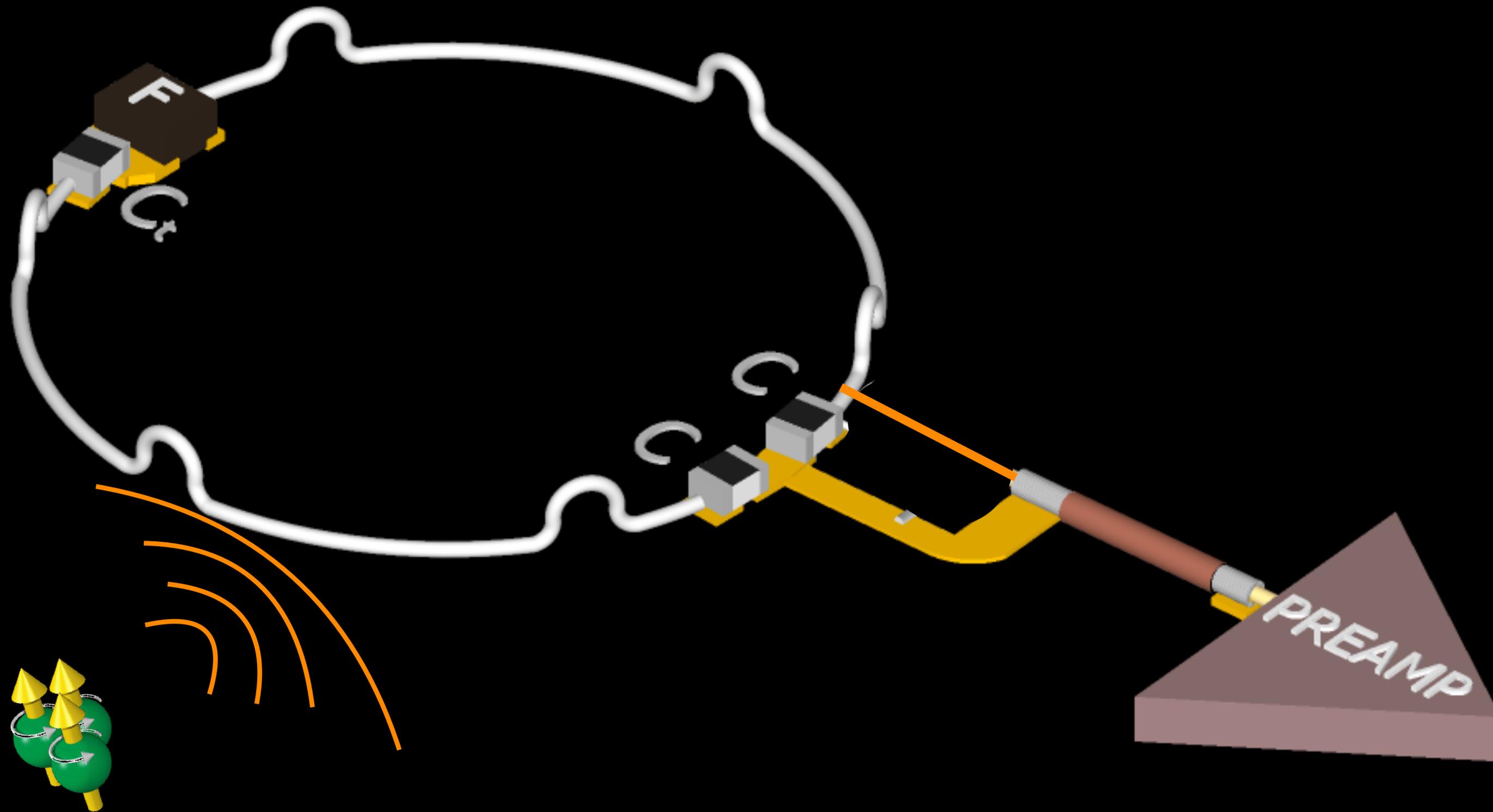
Default Input Source

15.0 16.0 17.0 18.0 19.0 20.0 21.0 22.0 23.0 24.0 25.0 26.0 27.0 28.0



Disk space remains for recording 761 hours and 21 minutes

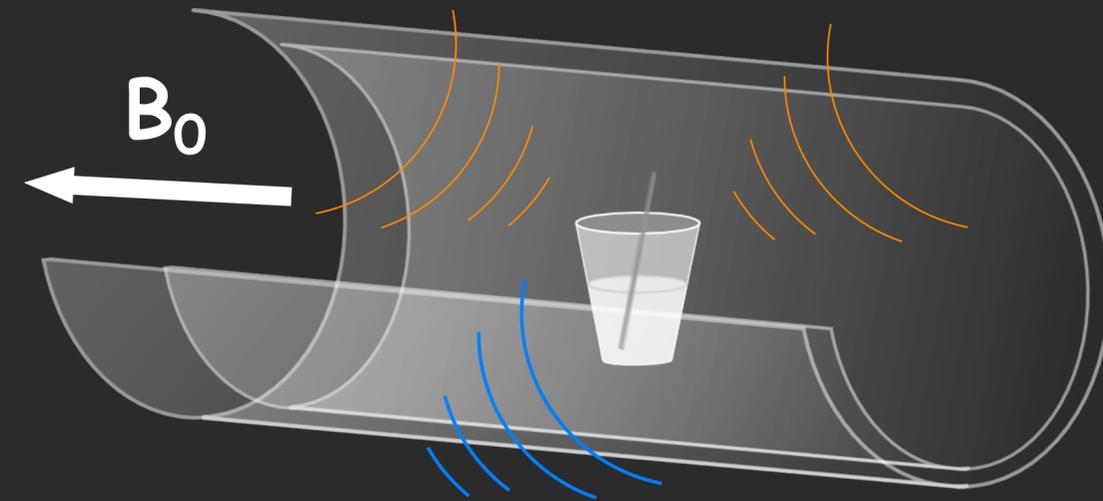
Project rate: 8192 Cursor: 0:00.000000 min:sec [Snap-To Off]



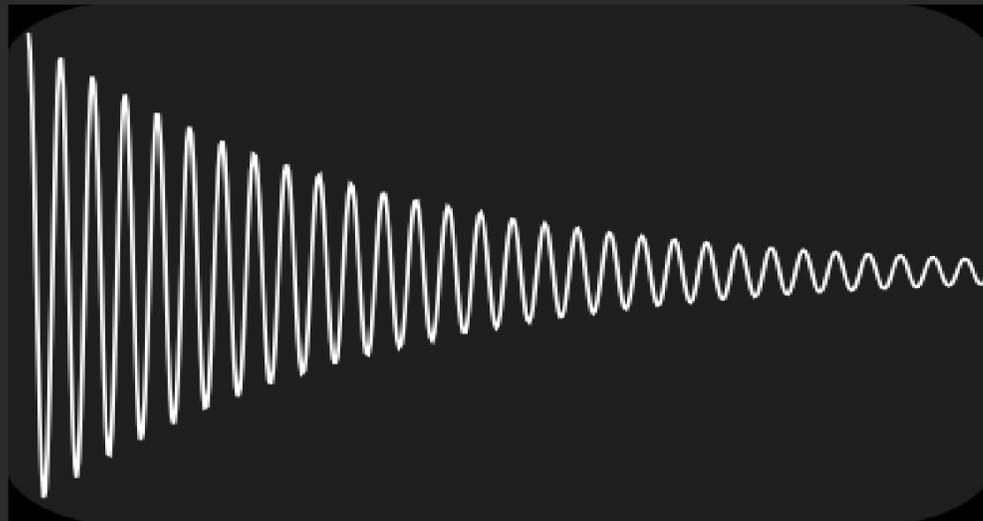
courtesy Boris Keil, Larry Wald, MGH

Intro to MRI - The NMR signal

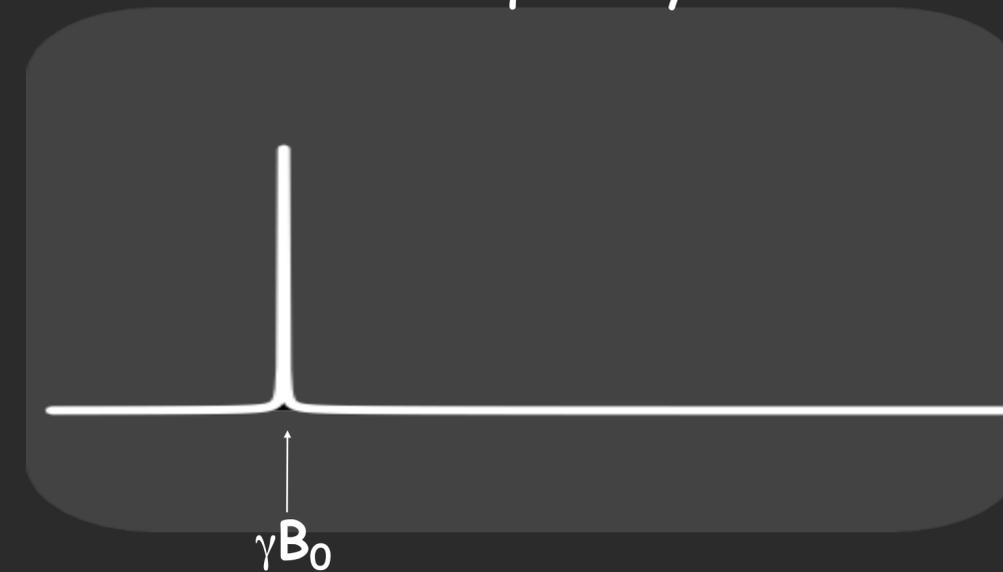
- Signal from ^1H (mostly water)
- Magnetic field \Rightarrow Magnetization
- Radio frequency \Rightarrow Excitation
- Frequency \propto Magnetic field



time

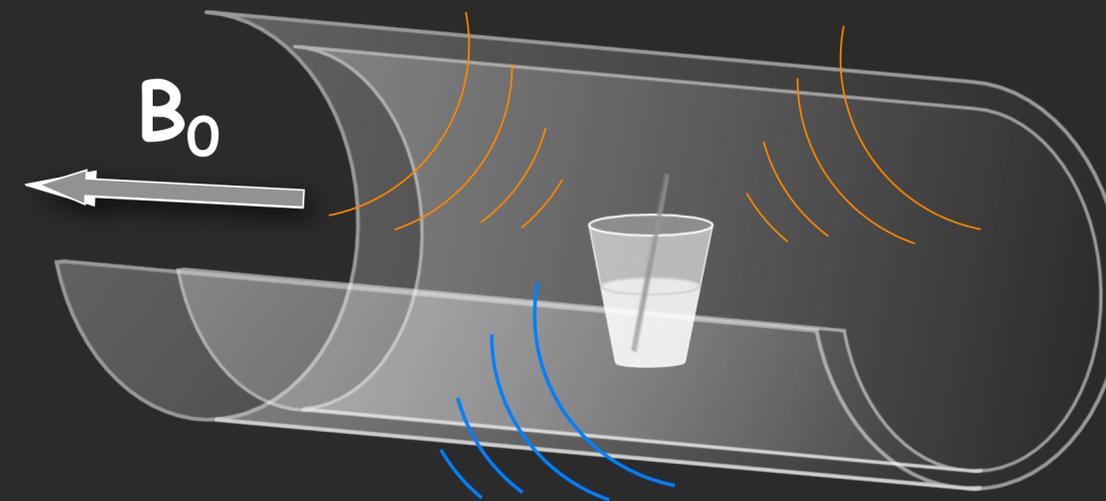


frequency

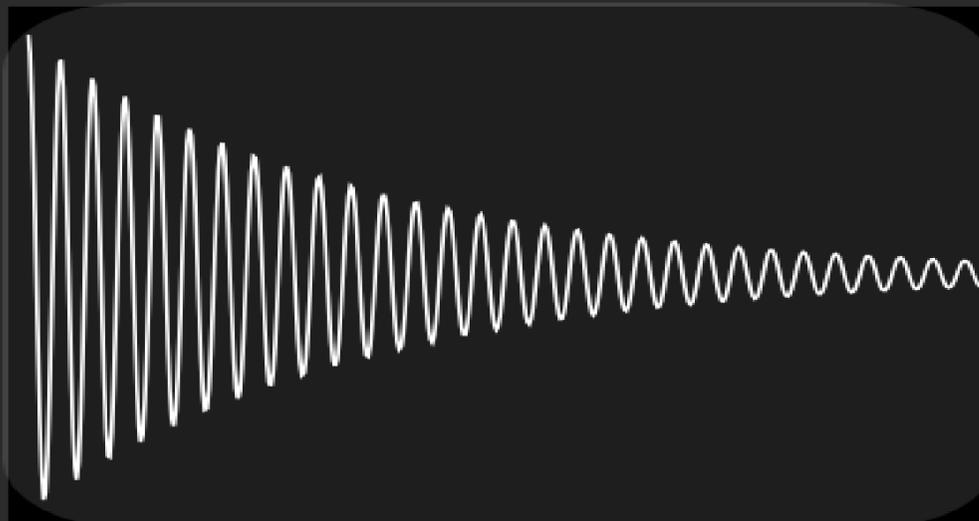


Intro to MRI - The NMR signal

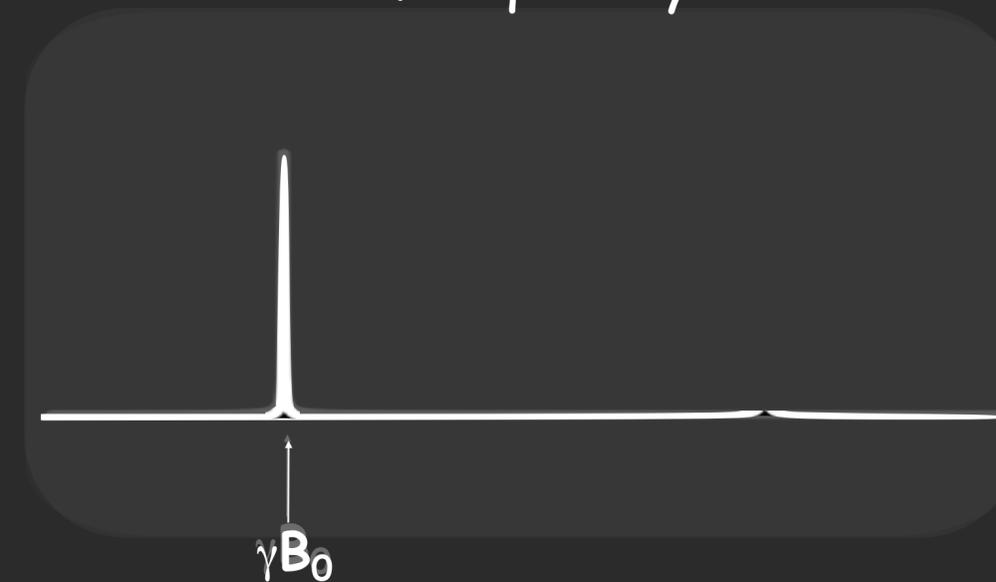
- Signal from ^1H (mostly water)
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time

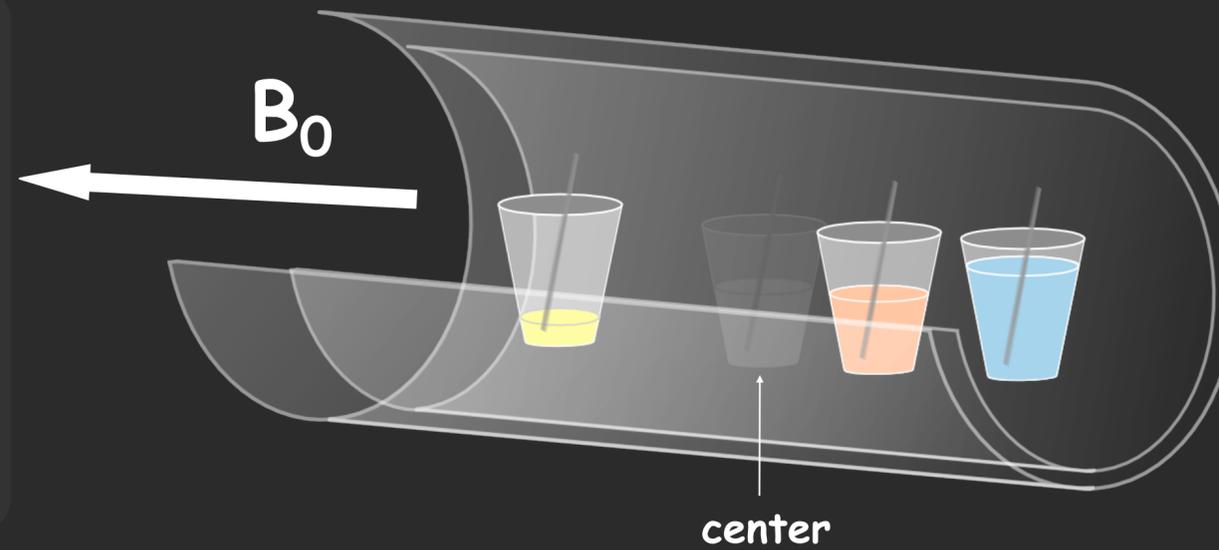


frequency

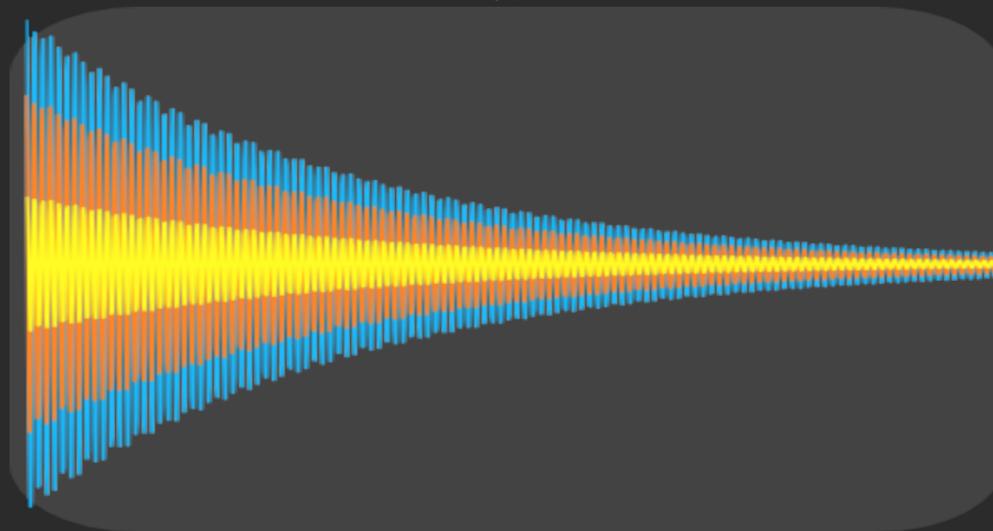


Intro to MRI - Imaging

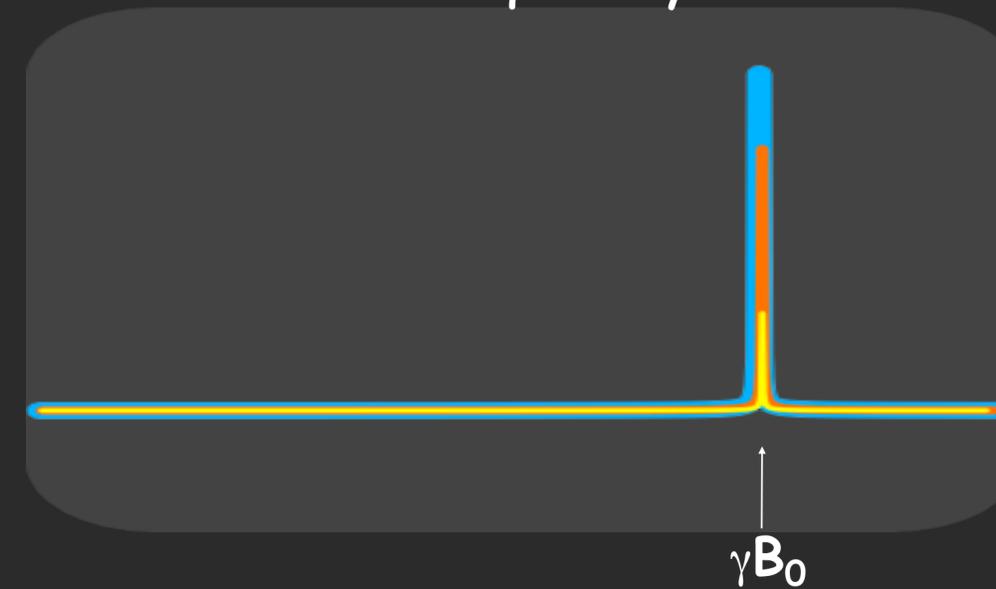
- B_0 Missing spatial information



time

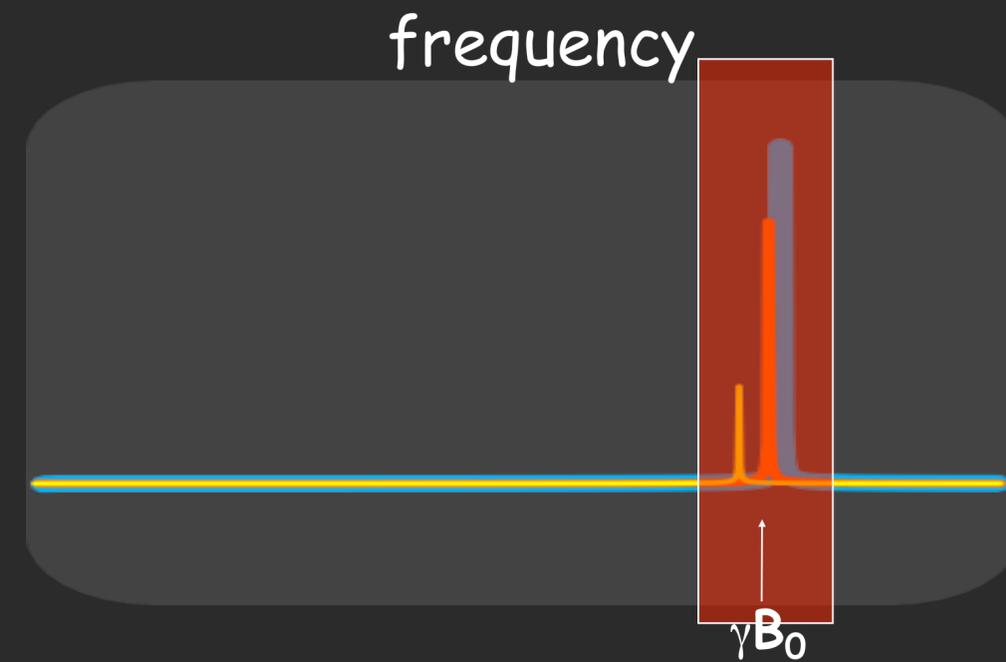
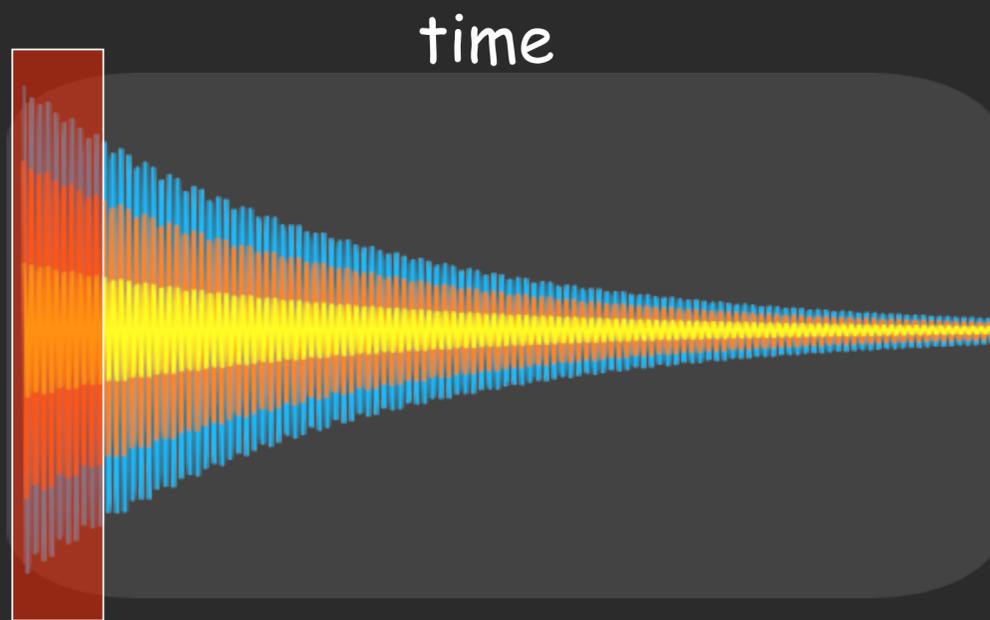
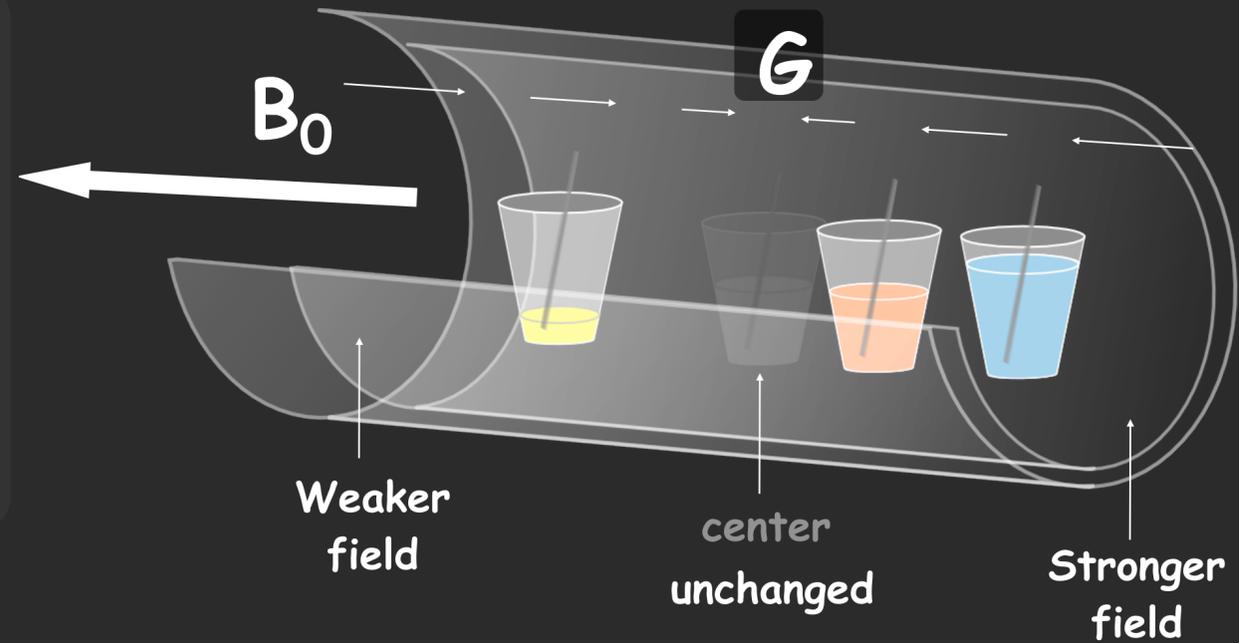


frequency



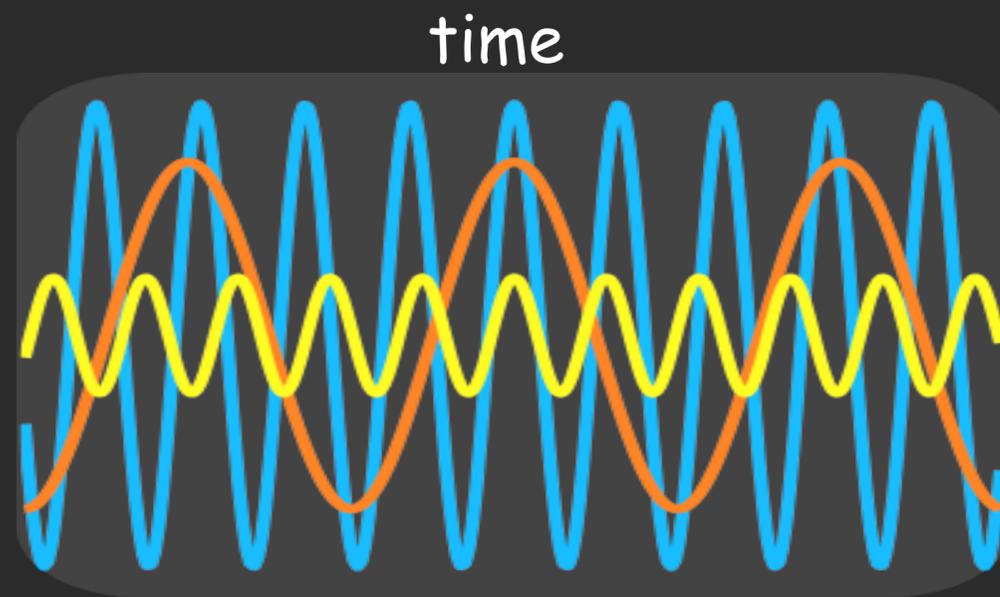
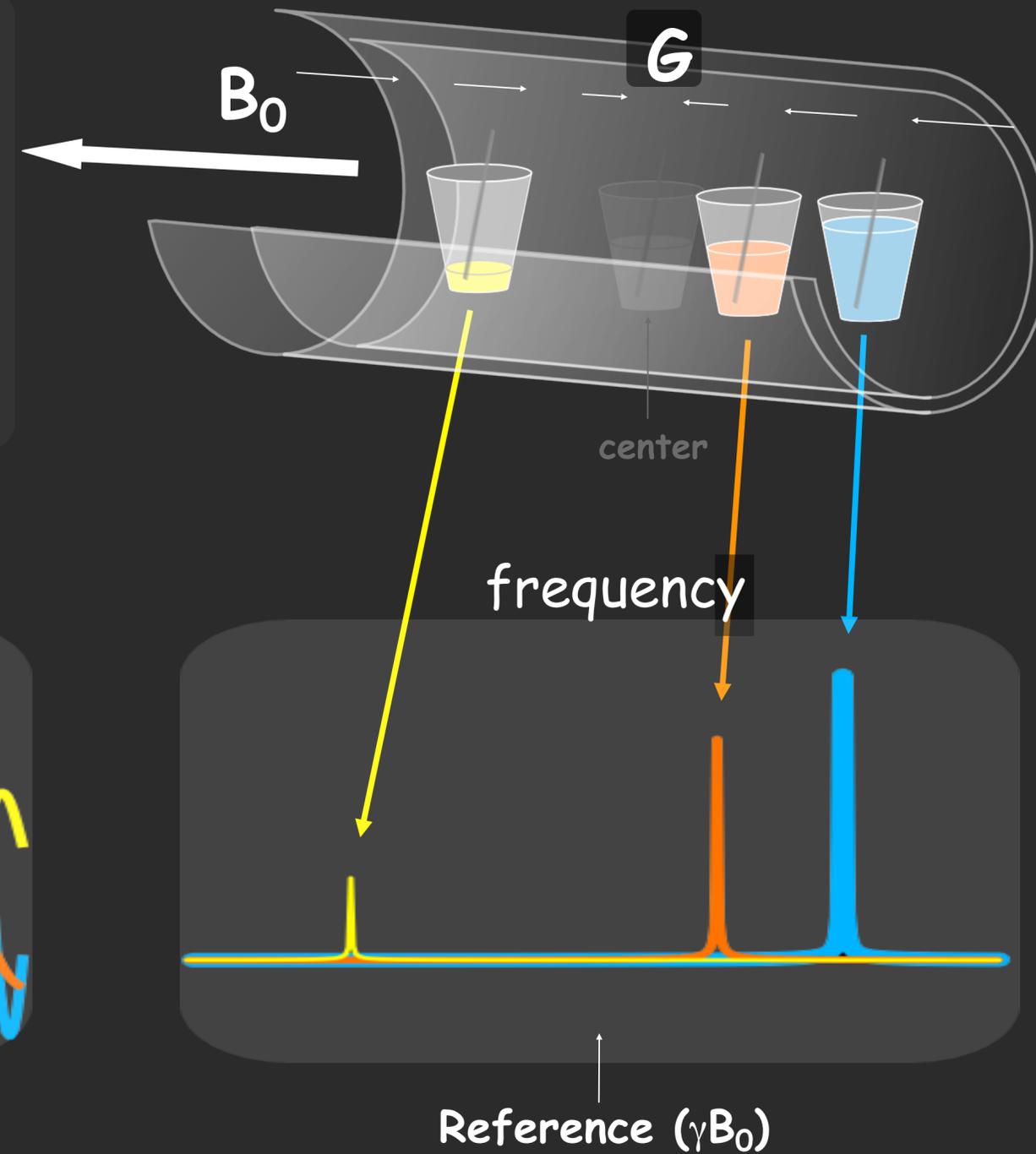
Intro to MRI - Imaging

- B_0 Missing spatial information
- Add gradient field, G

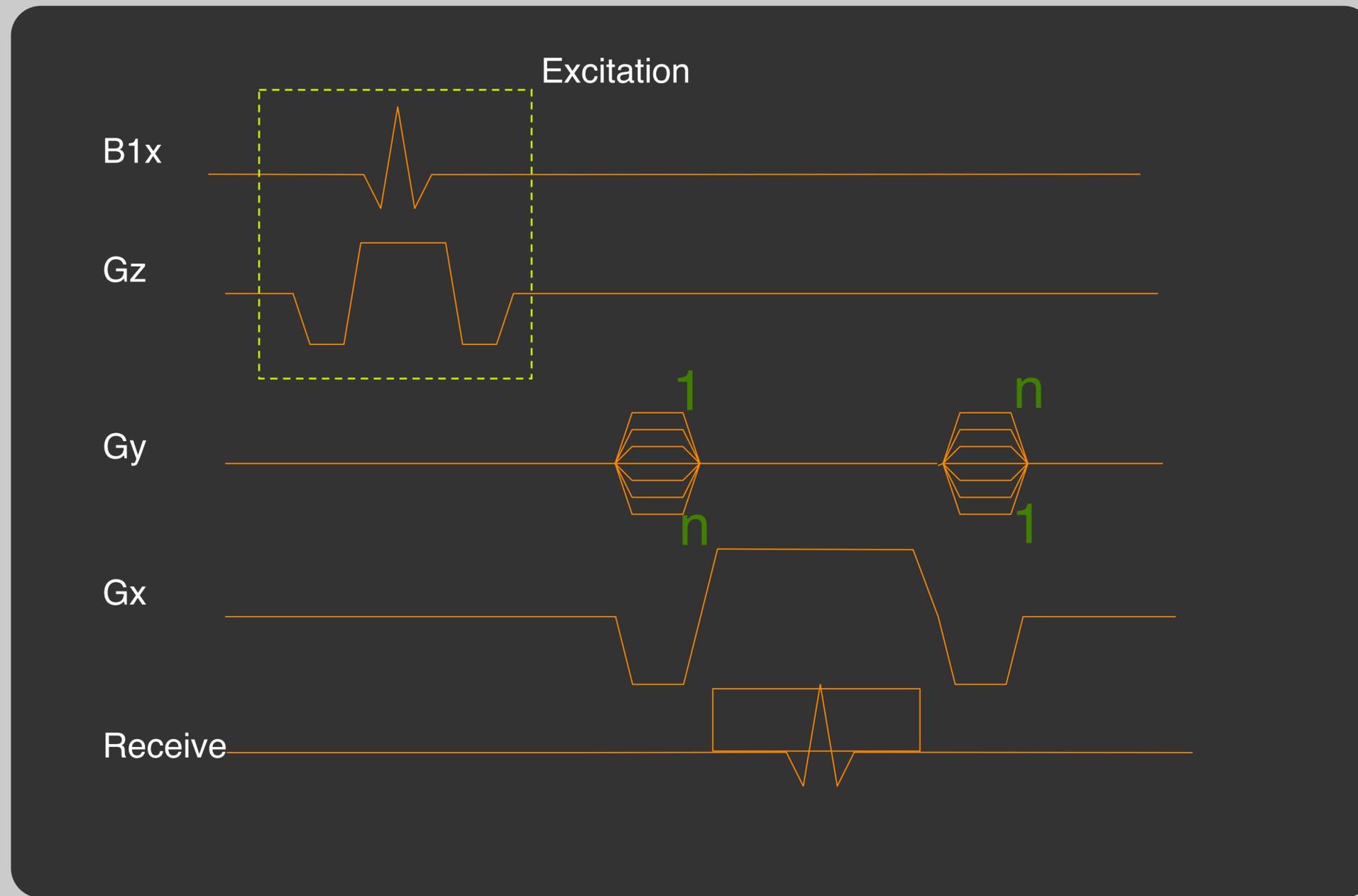


Intro to MRI - Imaging

- B_0 Missing spatial information
- Add gradient field, G
- Mapping:
spatial position \Rightarrow frequency



MRI Pulse Sequence



Repeat n times
rate = TR seconds

MR Imaging

Fourier



magnitude k-space (Raw Data)

Image

Discrete Fourier transform

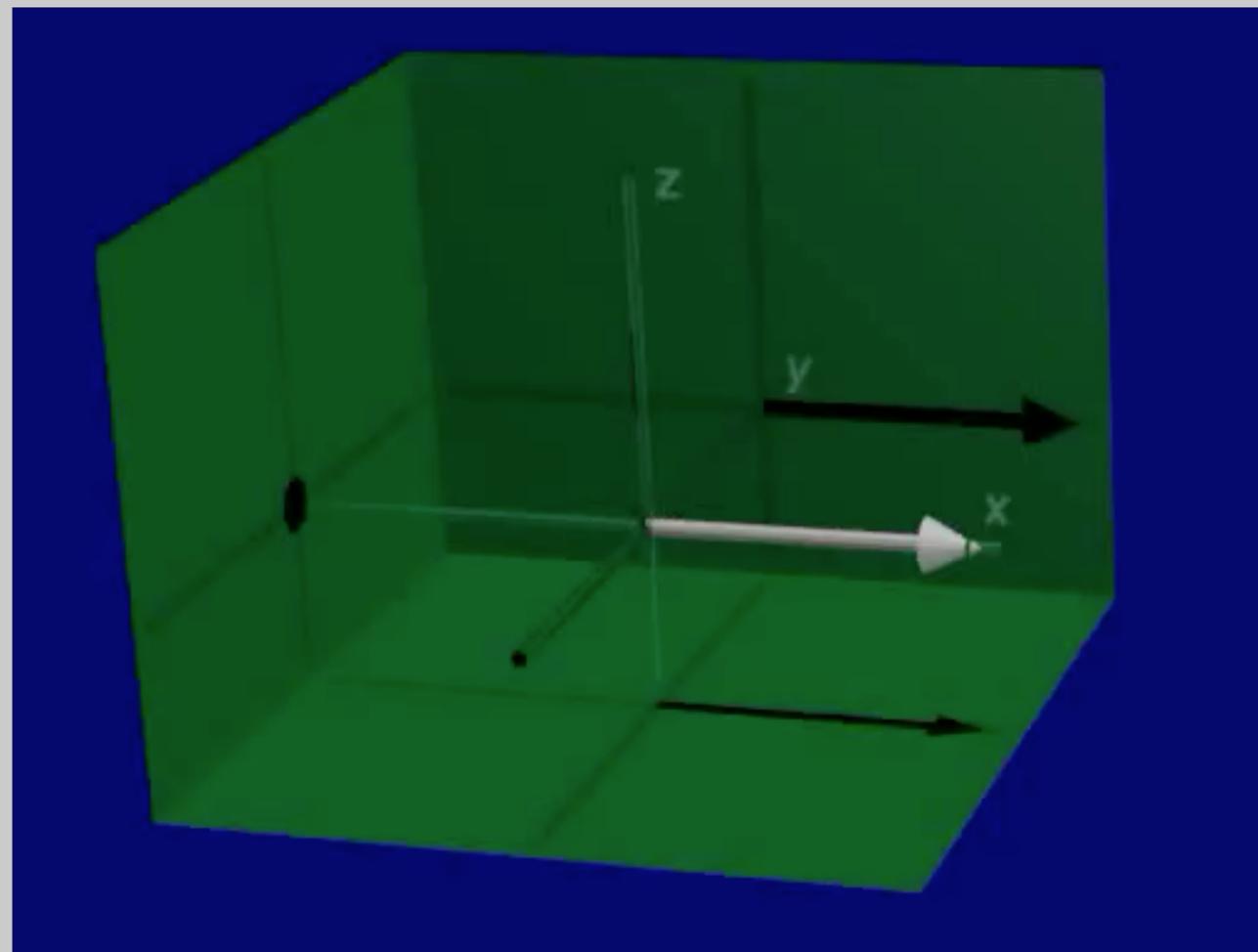


A vast field of purple lavender flowers stretches across the frame. In the upper-middle section, a single, vibrant yellow sunflower stands out prominently against the sea of purple. The sunflower has a dark brown center and bright yellow petals, with green leaves and a stem visible below it. The lavender flowers are small and densely packed, creating a textured, repetitive pattern of purple and green.

MRI is all about contrast.....

Relaxation

$$\begin{bmatrix} \dot{M}_x(\vec{r}, t) \\ \dot{M}_y(\vec{r}, t) \\ \dot{M}_z(\vec{r}, t) \end{bmatrix} = \begin{bmatrix} -\frac{1}{T_2} & 0 & 0 \\ 0 & -\frac{1}{T_2} & 0 \\ 0 & 0 & -\frac{1}{T_1} \end{bmatrix} \begin{bmatrix} M_x(\vec{r}, t) \\ M_y(\vec{r}, t) \\ M_z(\vec{r}, t) \end{bmatrix} + \begin{bmatrix} 0 \\ 0 \\ \frac{1}{T_1} \end{bmatrix} M_0(\vec{r})$$

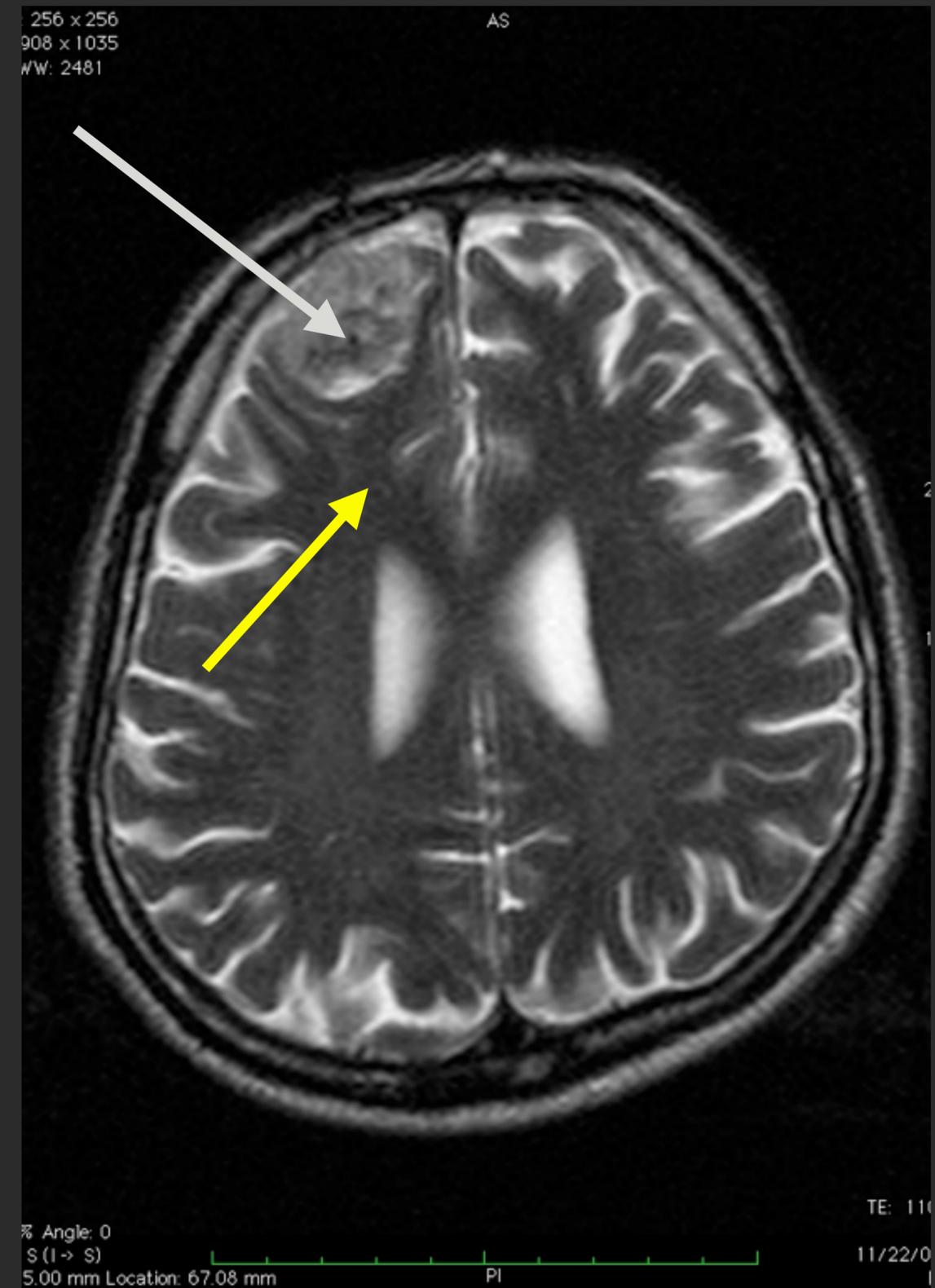
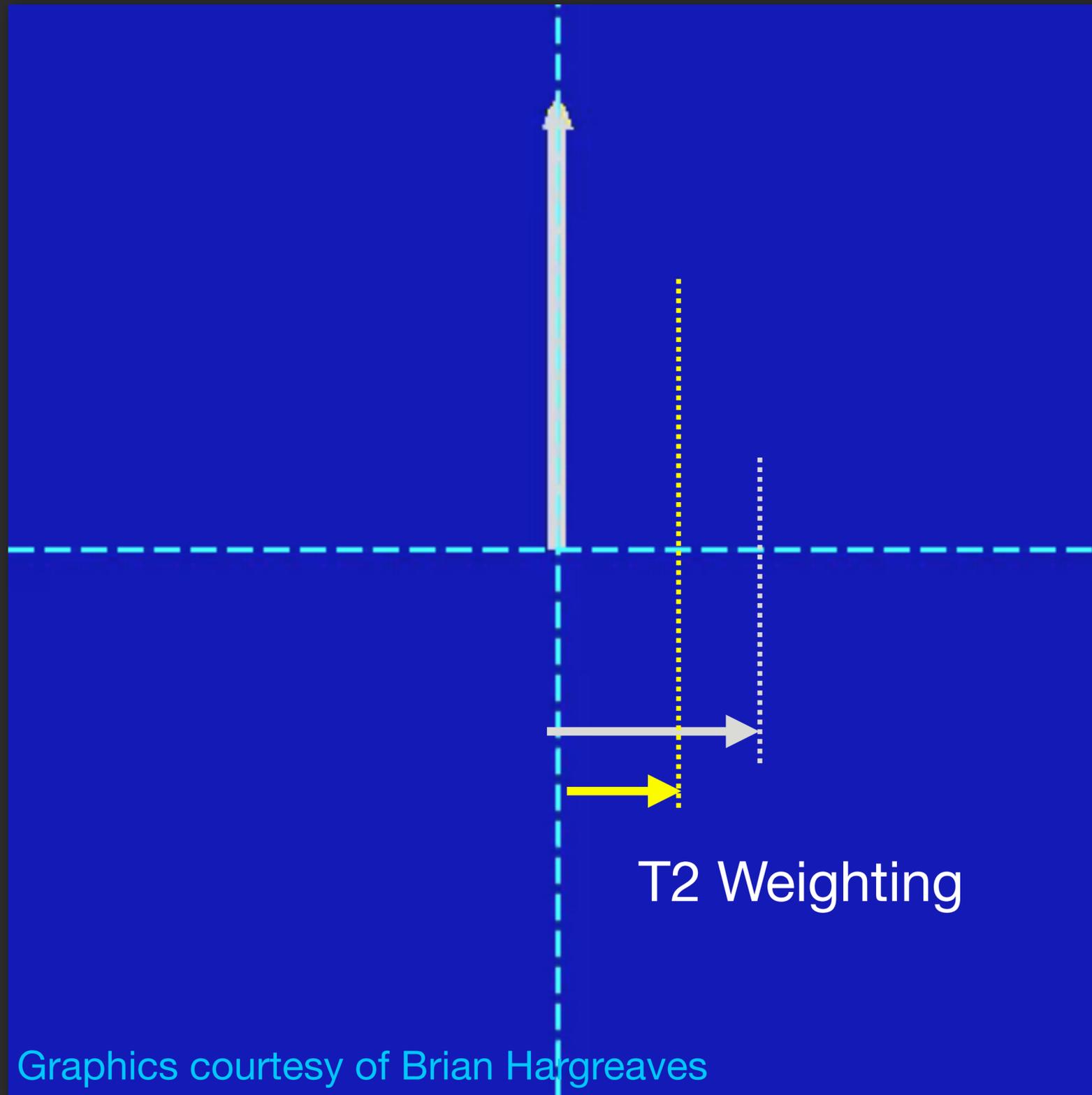


The Toilette Analogy (©2009 AI Macovski)

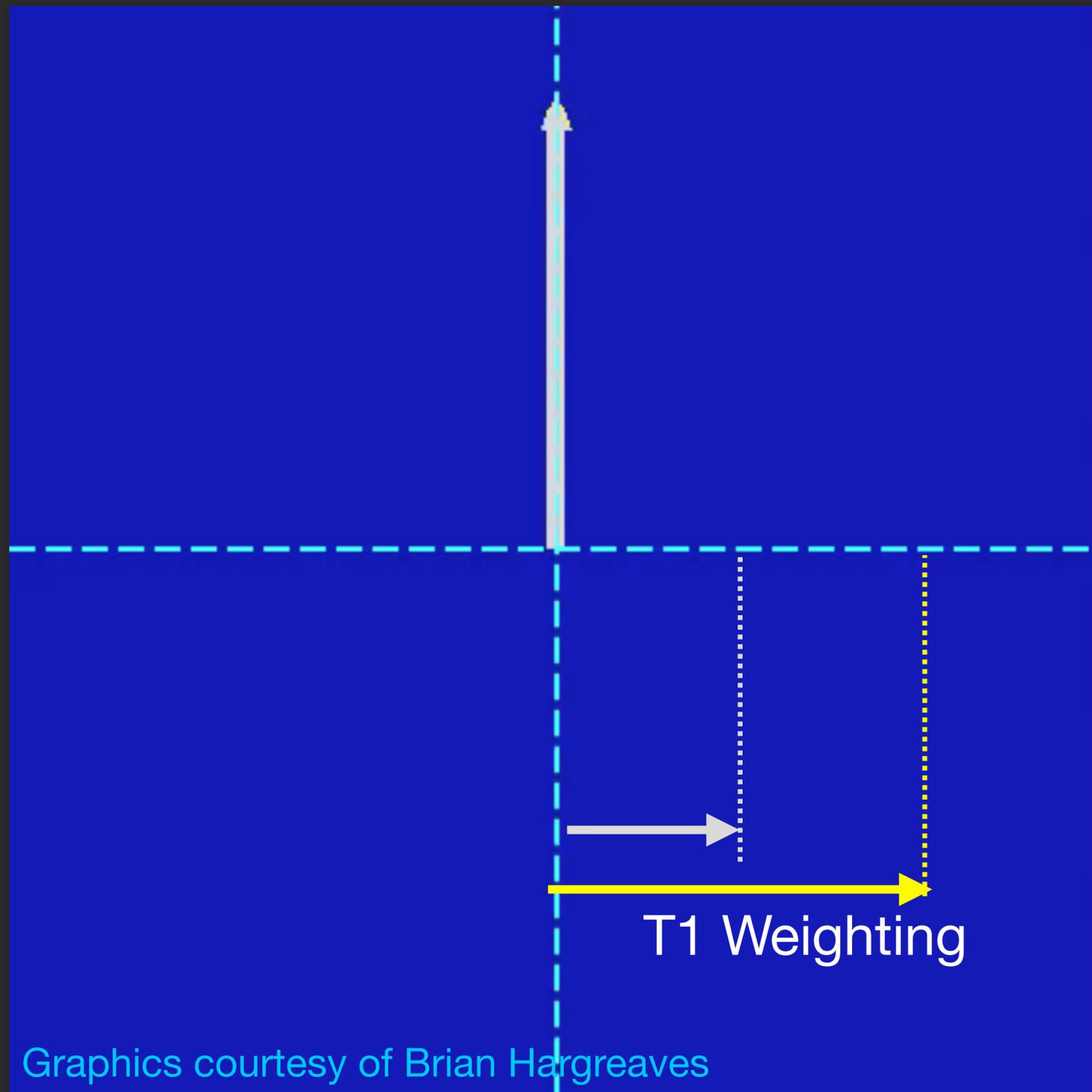
- Excitation = Flush
- Dynamics:
 - Water drains = signal decays, equivalent to T2
 - Tank refills = Magn. recovers, equivalent to T1
- Observed signal = water in the bowl
- Different toilettes = different tissues



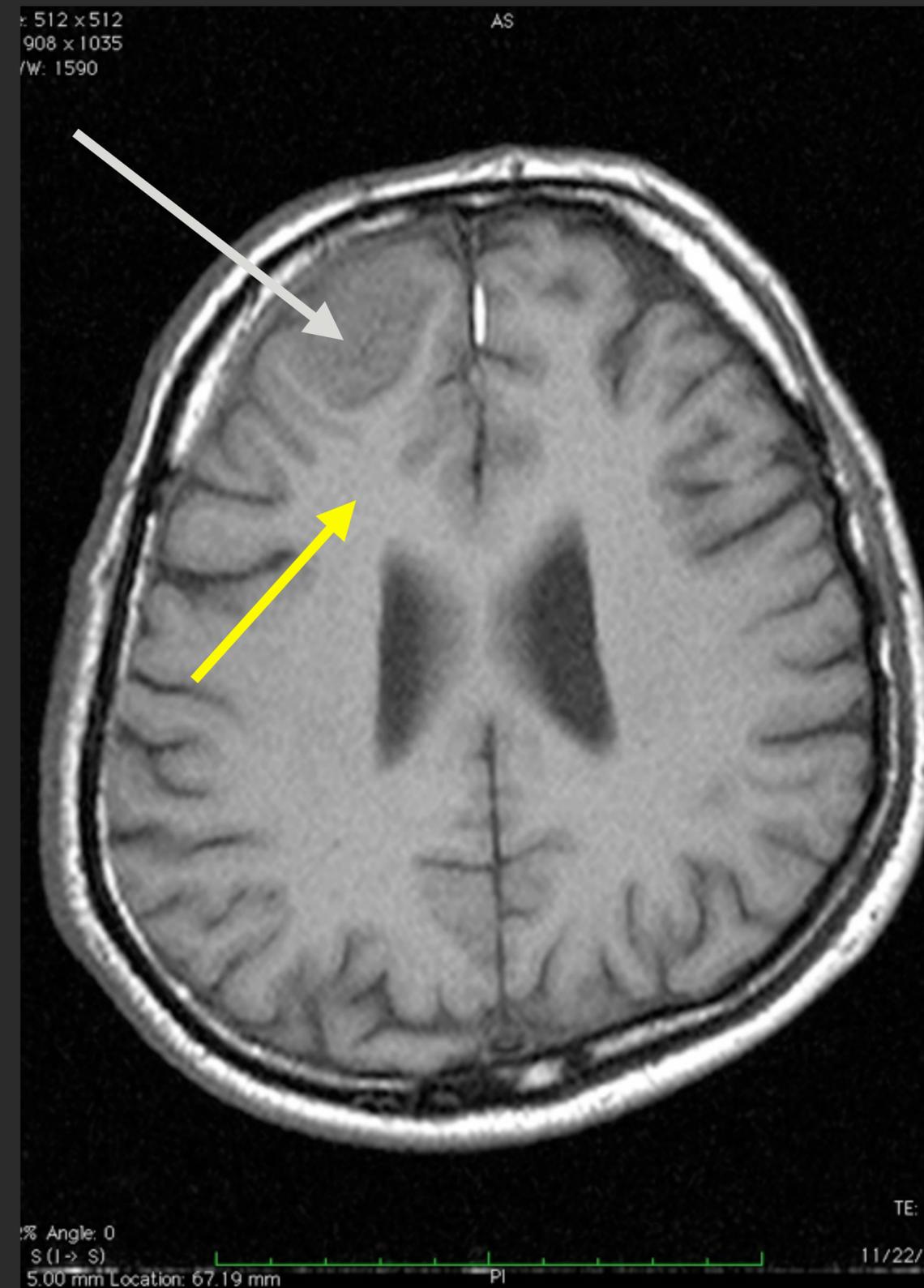
The Toilette Analogy (©2009 AI Macovski)



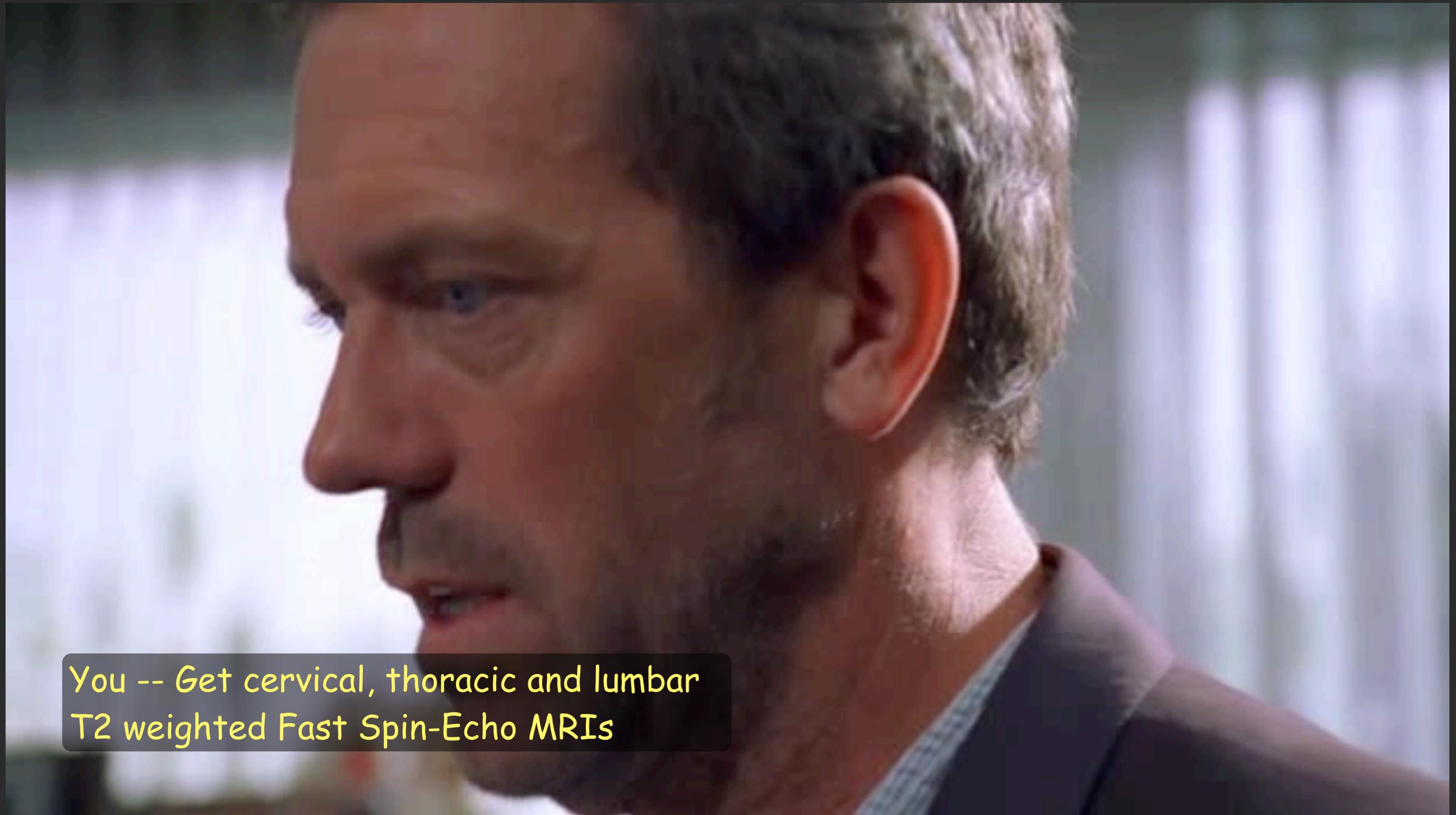
The Toilette Analogy (©2009 AI Macovski)



Graphics courtesy of Brian Hargreaves



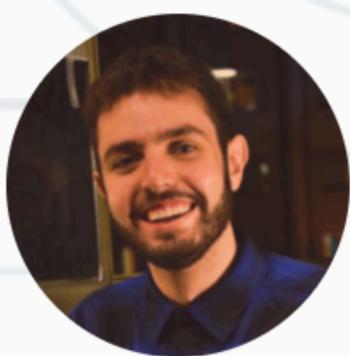
..... House Prefers T2



*You -- Get cervical, thoracic and lumbar
T2 weighted Fast Spin-Echo MRIs*

Summary

- MRI is about the interactions of magnetic fields with Nuclear spins
 - Governed by a linear dynamical system!
- Dynamics result in rotations, which frequency depend on position
 - Decode via DFT!
- Damping causes exponential relaxation — which we use to set the image contrast!
- To maximize signal in antenna — we use LC resonance!



Ramsey Mardini
Head Admin
ramseymardini@



Maxwell Chen
Head Admin
maxhchen@



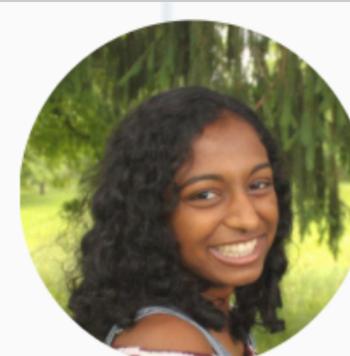
Mikaela Frichtel
Head Lab
mfrichtel@



Steven Lu
Head Lab
stevenl@



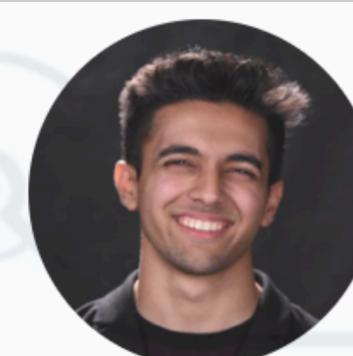
Kaitlyn Chan
Lab
kaitlynjchan@



Sravya Basvapatri
Lab
sravyab@



Caleb Kuo
Lab
calebkuo@



Sumer Kohli
Software
sumer.kohli@



Mauricio Bustamante
Discussion, Content
mauricio_bustamante@



Archit Gupta
Discussion, Content
architgupta@



Fangda Gu
Discussion, Content
gfd18@



Taejin Hwang
Discussion, Content
taejin@



Nick Nolan
Discussion, Content
nick.nolan@



Son Tran
Discussion
sontran@



Marie Barr-Ramsey
Discussion
mariebarr@



Justin Yu
Discussion
justinyu@



Ashwin Vangipuram
Discussion
avangipuram@



Rafael Calleja
Lab
rafael.calleja@



Elizabeth Wang
Lab
elizabethwang@



Priyans Nishithkumar Desai
Lab
priyansdesai@

Readers: Gavin Liu, Alex Feng, Aneesh Nathani

Lab Assistants: Parth Patel, Sean Chen, Tom Xie, Martin Hodde, Michelle Boulos, Darby Clement, Christine Lou, Yashovardhan Raniwala, Risheek Pingili, Eric Yang, Christabella Annalicia, Yuki Ito, Megan Zeng, Christopher Lung, Nada Jamalallail, Arjun Bhorkar