


A photograph of a large, multi-story building with a red-tiled roof and arched windows, likely a Stanford University building. The building is set against a dark, overcast sky. In the foreground, there is a green lawn and a paved path. The text is overlaid on the image.

# Rad229 – MRI Signals and Sequences

**Daniel Ennis & Brian Hargreaves**

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A wide-angle photograph of a large, multi-story building with a red-tiled roof and arched windows, likely a Stanford University building. The building is set against a dark, twilight sky. In the foreground, there is a large, well-maintained green lawn with a paved walkway leading towards the building. The overall scene is dimly lit, suggesting dusk or dawn.

# Lecture-15A — Magnetization Preparation II - Diffusion

## Diffusion, Spins, and MRI Signals

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# Learning Objectives

- Understand that the MRI signal is sensitive to diffusion.
- Appreciate the relationship between random walks, diffusion, and MRI signal attenuation.
- Describe the dependence of the MRI signal on the diffusion coefficient.
- Recall the spatial and temporal scale of diffusion in biological tissues.



# Diffusion – Bloch Equations

$$\frac{d\vec{M}}{dt} = \underbrace{\vec{M} \times \gamma \vec{B}}_{\text{Precession}} - \underbrace{\frac{M_x \hat{i} + M_y \hat{j}}{T_2}}_{\text{Transverse Relaxation}} - \underbrace{\frac{(M_z - M_0) \hat{j}}{T_1}}_{\text{Longitudinal Relaxation}} + \underbrace{\mathbf{D} \nabla^2 \vec{M}}_{\text{Diffusion}}$$

- Precession
  - Magnitude of  $\vec{M}$  unchanged
  - Phase (rotation) of  $\vec{M}$  changes with  $\vec{B}$
- Relaxation
  - $T_1$  change are slow O(100ms)
  - $T_2$  changes are fast O(10ms)
  - Magnitude of M can be  $\sim 0$  if  $T_2 \ll T_1$
- Diffusion
  - Spins are thermodynamically driven to exchange positions.
    - This exchange is ***irreversible*** and can lead ***signal attenuation***.

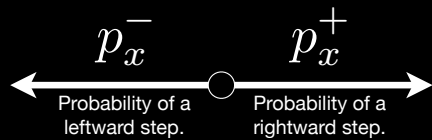
Application? Changes in proton self-diffusion are an early indicator of cellular disruption.



# Diffusion – 1D Random Walk

$\Delta x \equiv$  step length

$\Delta t \equiv$  time step



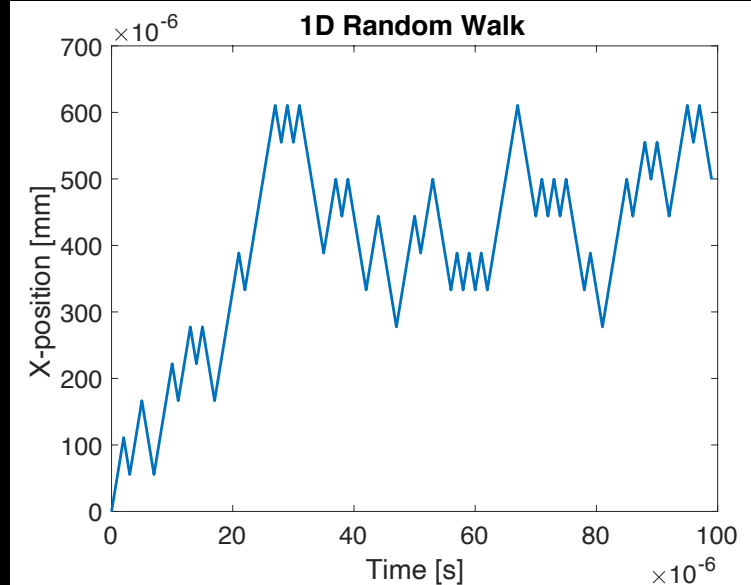
$$p_x^+ = p_x^- = \frac{1}{2}$$

¡Not a Gaussian!

```
%% 1D Random Walk
N_step=100; % Number of random walk steps
x = zeros(1,N_step); % Starting x-position
dx = 55.5e-6; % Spatial step size per dt [mm]
dt = 1e-6; % Temporal step size [s]

rng('default'); % Set random-number-generator seed
p_xp = 0.5; % Probability (P) of a +x-step

for n = 2:N_step % Loop over number of steps
    step = 2*(rand>p_xp)-1; % +/- one step
    x(n) = x(n-1) + dx*step; % Add +/- displacement step
end
t=0:dt:dt*(numel(x)-1); % Time-step vector
```



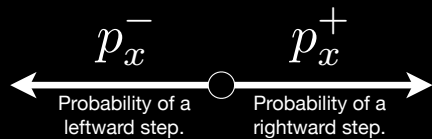
Rad229\_Random\_Walk.m with 55.5 $\mu$ m steps for 100 $\mu$ s.



# Diffusion – 1D Random Walk

$\Delta x \equiv$  step length

$\Delta t \equiv$  time step



$$p_x^+ = p_x^- = \frac{1}{2}$$

¡Not a Gaussian!

$$P(x, t)$$

Probability distribution for a spin.



Some math...

$$\frac{\partial P(x, t)}{\partial t} = D \frac{\partial^2 P(x, t)}{\partial x^2}$$

1-D Diffusion Eqn.



Solution from:  
 $x=0$  @  $t=0$ .

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

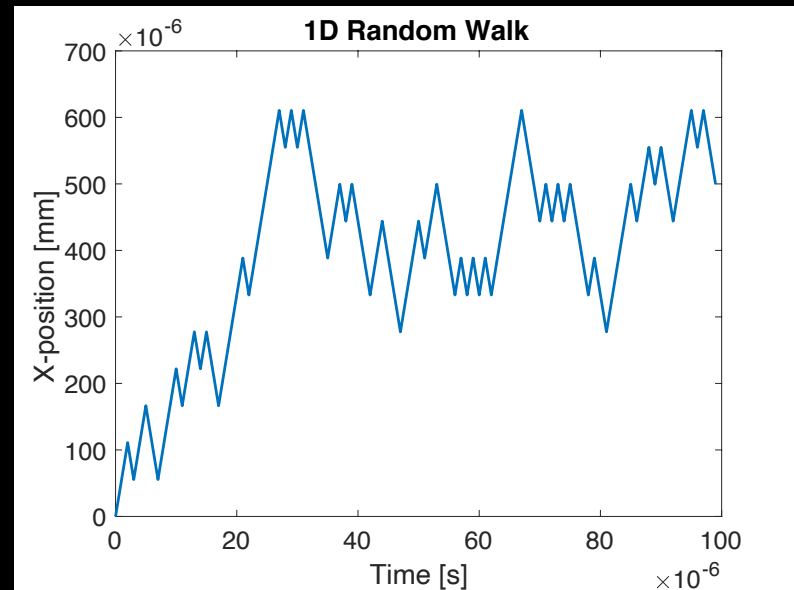
¡A Gaussian!

```

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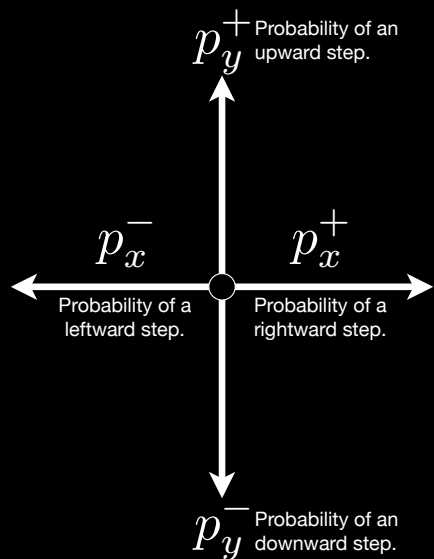
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end
t=0:dt:dt*(numel(x)-1); % Time-step vector
    
```



Rad229\_Random\_Walk.m with 55.5 $\mu$ m steps for 100 $\mu$ s.

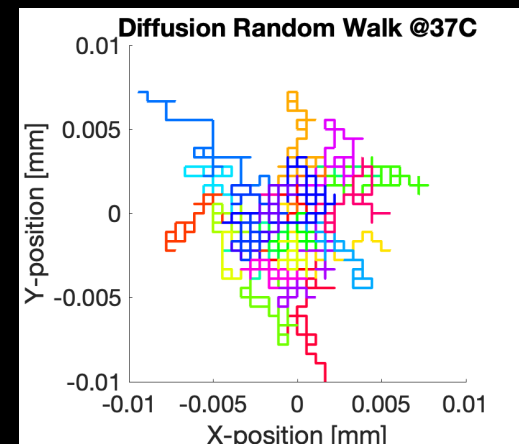
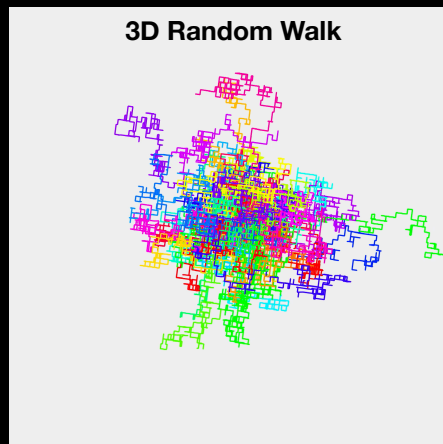
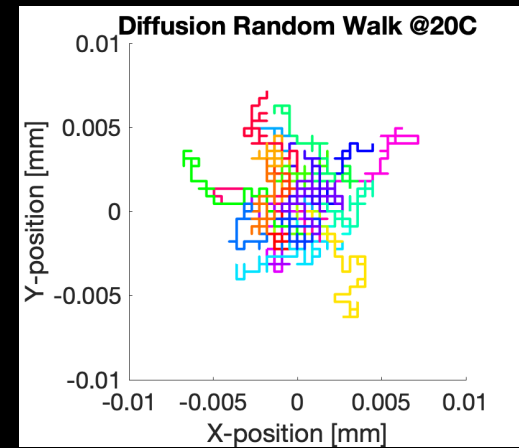
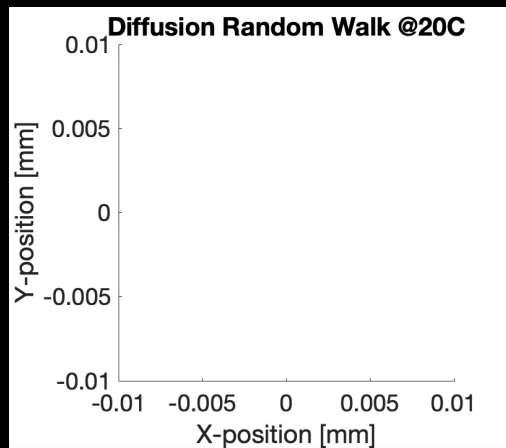


# Diffusion – 2D Random Walk



$$p_x^+ = p_x^- = p_y^+ = p_y^- = \frac{1}{4}$$

$$P(\vec{r}, t) = \frac{1}{\sqrt{4\pi Dt}} \exp\left(-\frac{\vec{r}^2}{4Dt}\right)$$




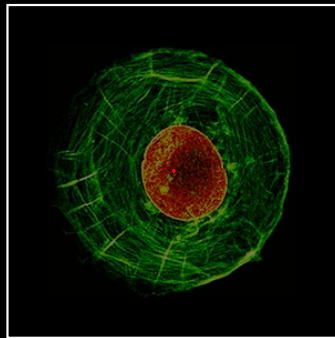
Rad229\_Random\_Walk.m with 100 $\mu$ s steps for 10ms.




# Diffusion – Free vs. Restricted

## Free (Isotropic) Diffusion


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





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


$$P(x, t) = P(y, t)$$

## Restricted (Anisotropic) Diffusion

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




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


$$P(x, t) \neq P(y, t)$$

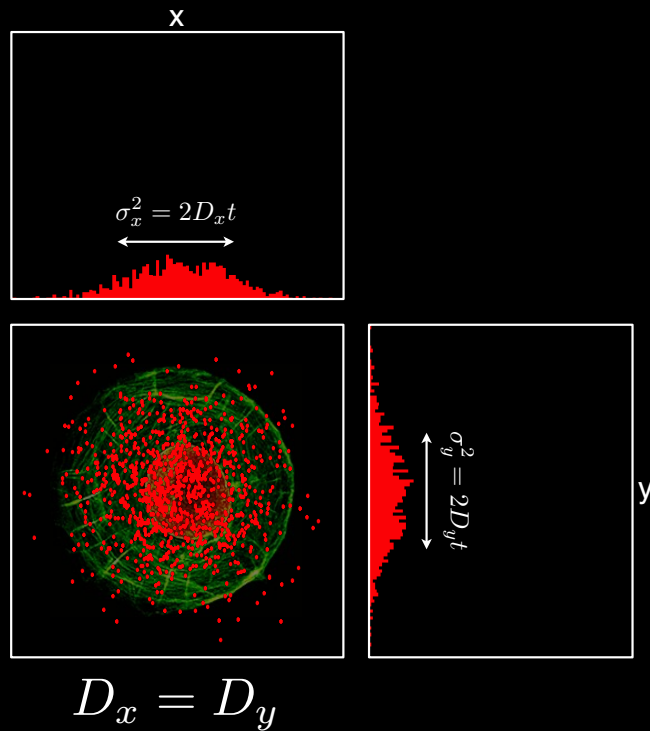
Diffusion in biological tissues can be free (isotropic) or restricted (anisotropic).



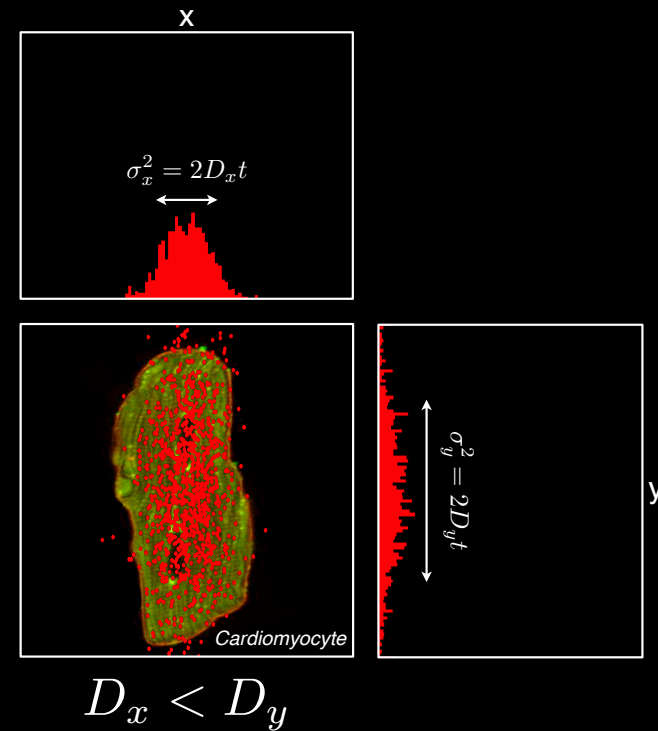


# Diffusion – Free vs. Restricted

Free Diffusion



Restricted Diffusion



The variance of spin position is directly related to the diffusion coefficient.



# Diffusion and Gradients

$$\phi(t) = \gamma \int_0^t \vec{G}(\tau) \cdot \vec{r}(\tau) d\tau$$

↑                      ↑                      ↑  
Phase from a            Applied            Spin History  
Gradient                Gradient            (Random Walk!)

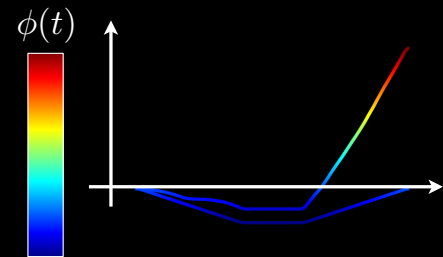
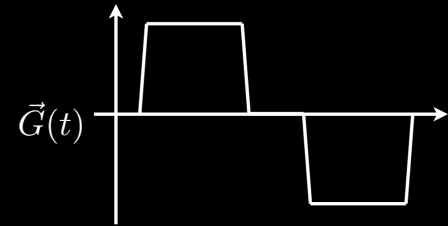


Gradients impart a position-dependent phase on the spin.

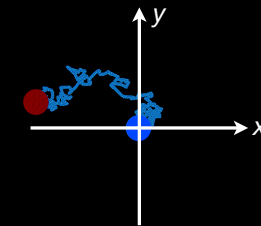
# Diffusion and Gradients

$$\phi(t) = \gamma \int_0^t \vec{G}(\tau) \cdot \vec{r}(\tau) d\tau$$

$\uparrow$  Phase from a Gradient       $\uparrow$  Applied Gradient       $\uparrow$  Spin History (Random Walk!)



Stationary vs. Diffusing Spin



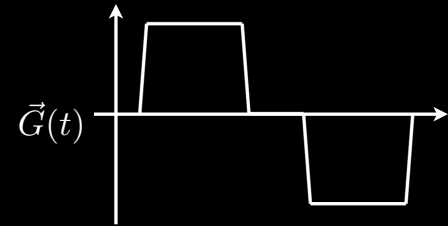
Stationary spins don't accumulate phase, but diffusing spins have non-zero phase.



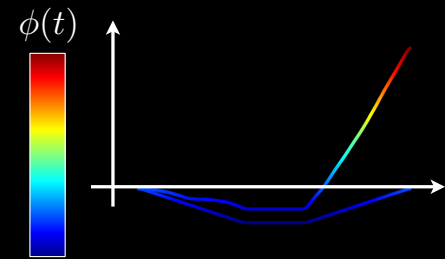
# Diffusion and Gradients

$$\phi(t) = \gamma \int_0^t \vec{G}(\tau) \cdot \vec{r}(\tau) d\tau$$

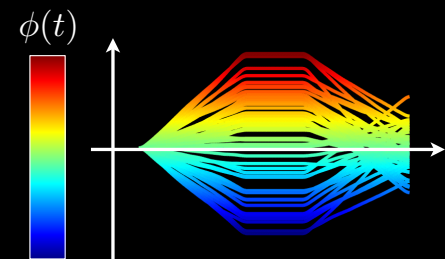
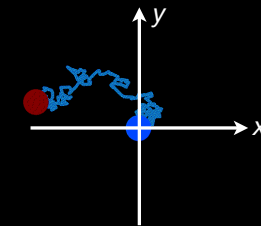
$\uparrow$  Phase from a Gradient       $\uparrow$  Applied Gradient       $\uparrow$  Spin History (Random Walk!)



## What is the b-value?



Stationary vs. Diffusing Spin



Movies courtesy of Kévin Moulin

An ensemble of diffusing spins will accumulate different amounts of phase.

The larger the phase dispersion,  
The higher the diffusion coefficient.

Diffusion Weighted Signal

$$S = S_0 e^{-\langle \phi^2 \rangle} = S_0 e^{-bD}$$

$\downarrow$  Signal without Diffusion Effects       $\uparrow$  Variance of the Phase Distribution       $\uparrow$  b-value       $\uparrow$  Diffusion Coefficient

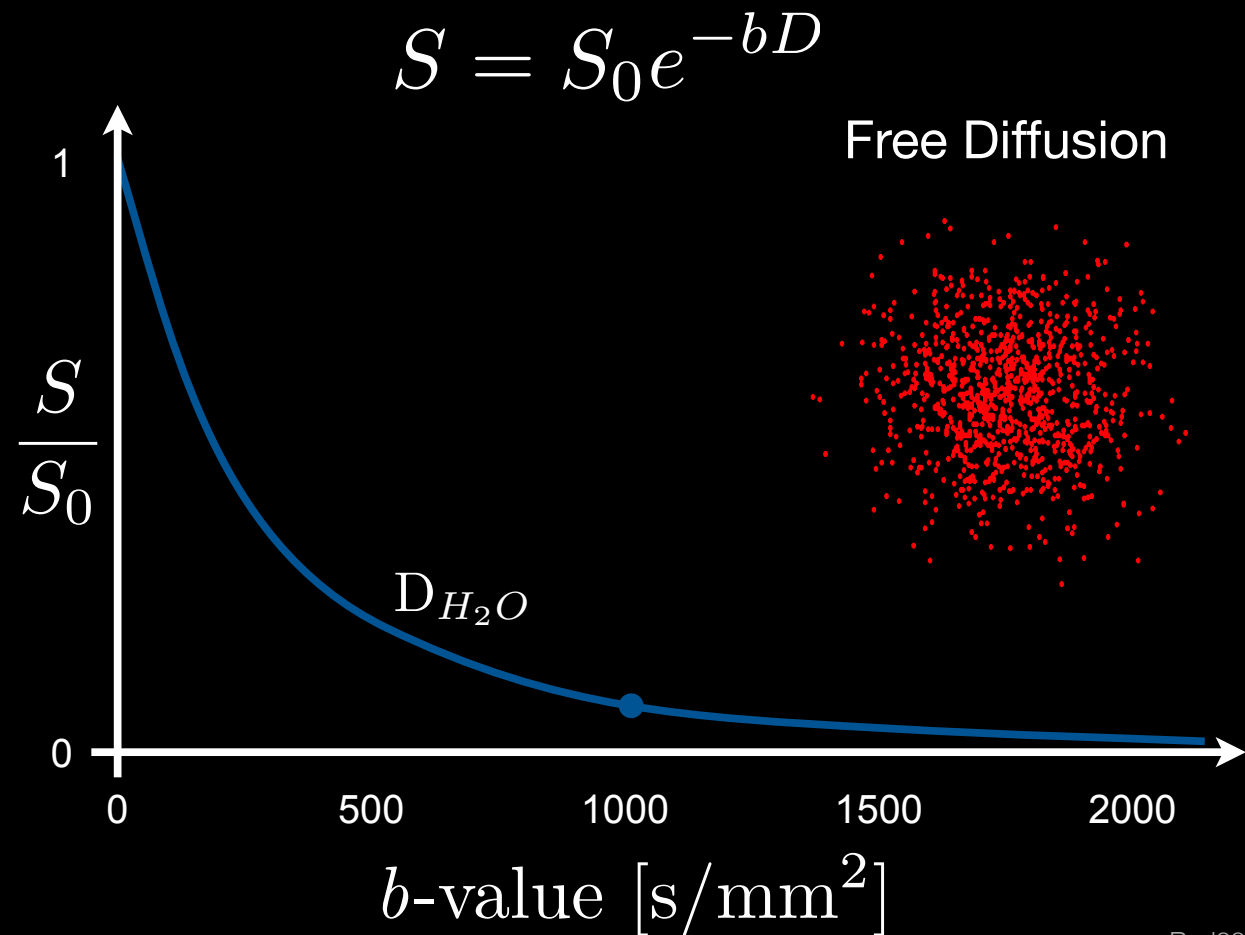
Longer and stronger diffusion gradients contribute more sensitivity to diffusion.



# Diffusion – b-value [s/mm<sup>2</sup>]

- $D_{H_2O} \approx 3.0 \times 10^{-3}$  mm<sup>2</sup>/s at 37°C
  - After 50 ms
    - ~32% of spins  $\geq 17\mu\text{m}$  in 50 ms
    - ~5% of spins reach  $>34\mu\text{m}$ !
  - For b-value = 1000 s/mm<sup>2</sup>
    - Water signal attenuated 95%!

Example from LeBihan PLoS 2015



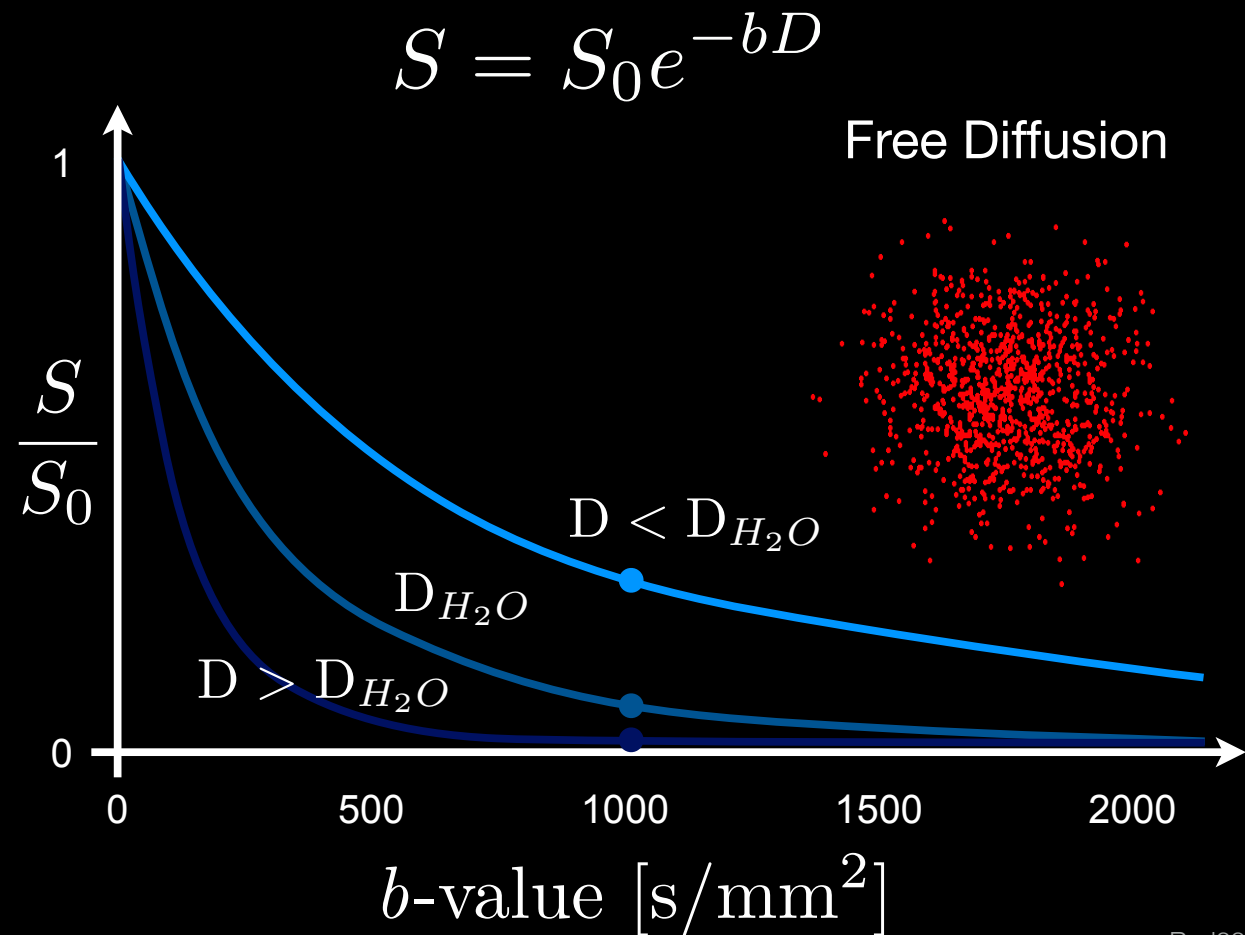
The signal attenuation depends on the diffusion coefficient and the b-value.



# Diffusion – b-value [s/mm<sup>2</sup>]

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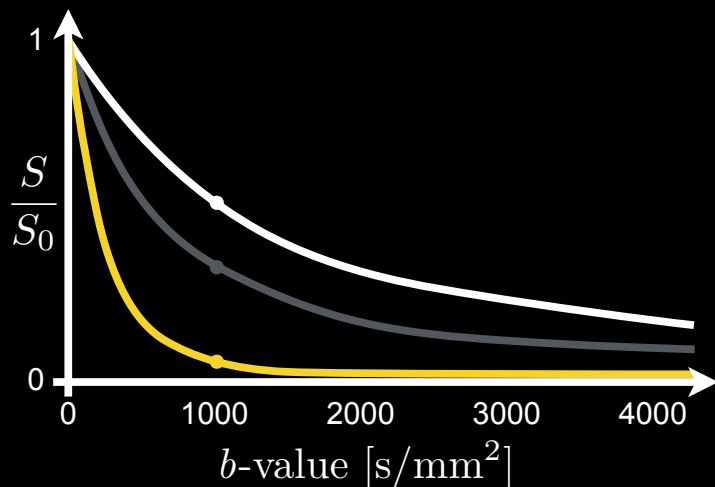


High (fast) diffusion coefficients contribute more signal de-phasing (signal drop).



# Diffusion – b-value [s/mm<sup>2</sup>]

- 1000 s/mm<sup>2</sup> is typical. Why?
  - For  $D=700$  mm<sup>2</sup>/s,  $S/S_0 \sim 50\%$ .



Tissue	Diffusion Coefficient [10 <sup>-6</sup> mm <sup>2</sup> /s]
White matter	670-800
Cortical grey matter	800-1000
Deep grey matter	700-850
<b>CSF</b>	<b>3000-3400</b>



How do we acquire diffusion weighted images?



A photograph of a large, multi-story building with a red-tiled roof and arched windows, likely a Stanford University building. The building is set against a dark, overcast sky. In the foreground, there is a green lawn and a paved path. The text is overlaid on the image.

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