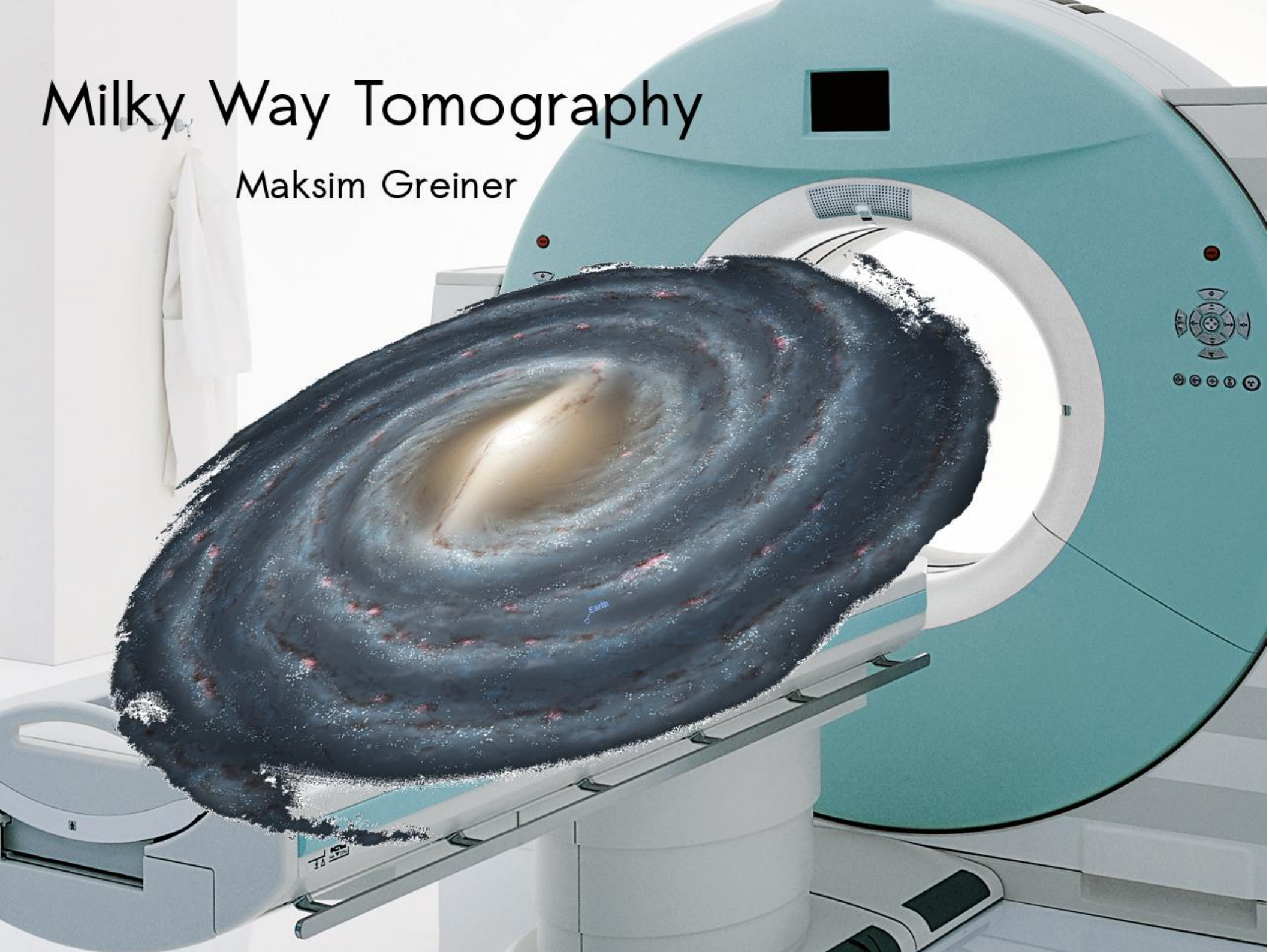
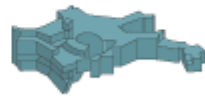


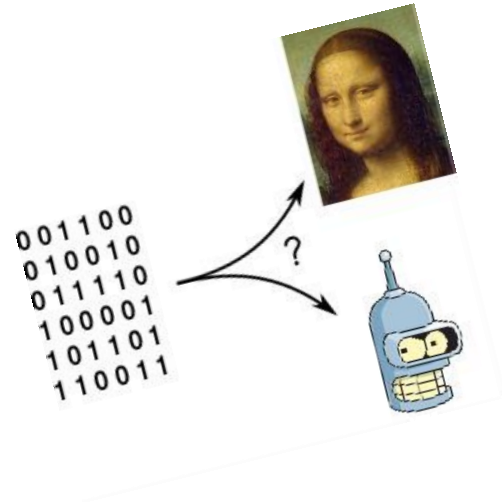
# Milky Way Tomography

Maksim Greiner

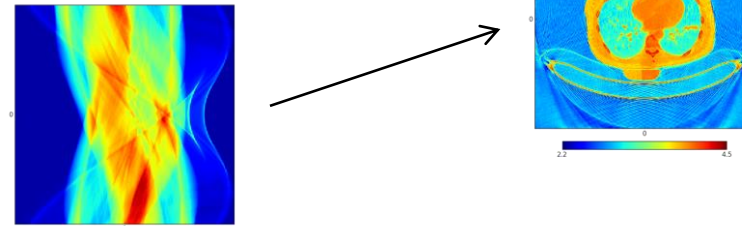




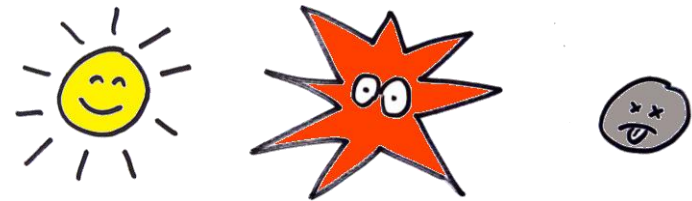
Turn data into images



X-Ray tomography in medicine



Tomography of the interstellar medium



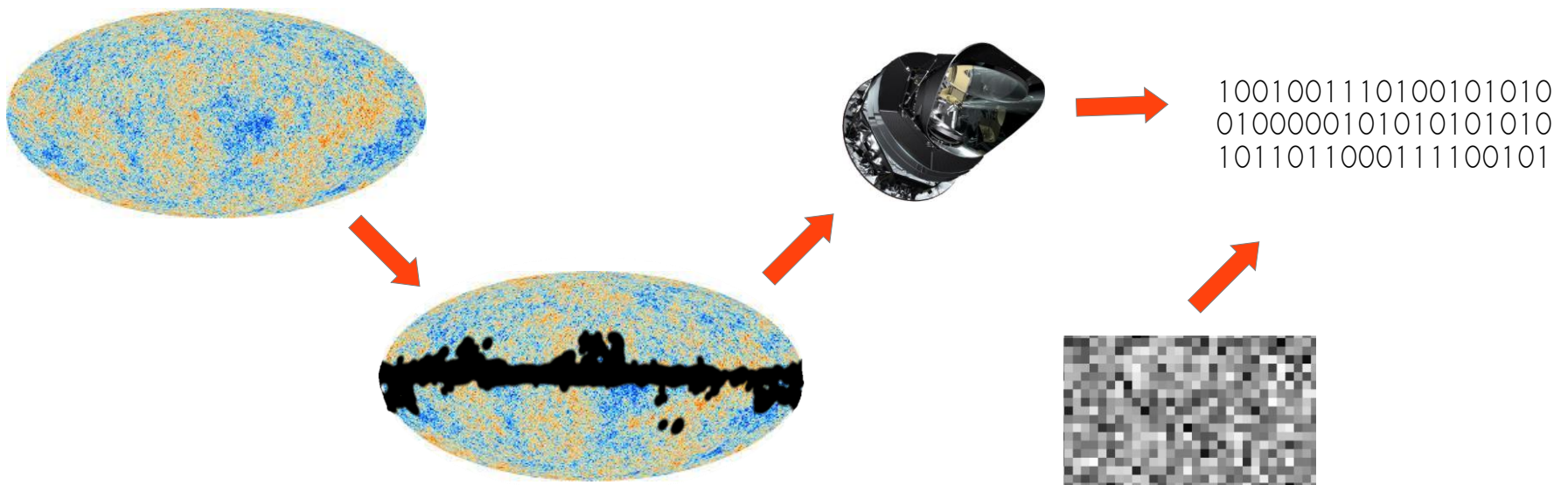
What the SKA will enable



Turning data into images

# the probability theory way of imaging

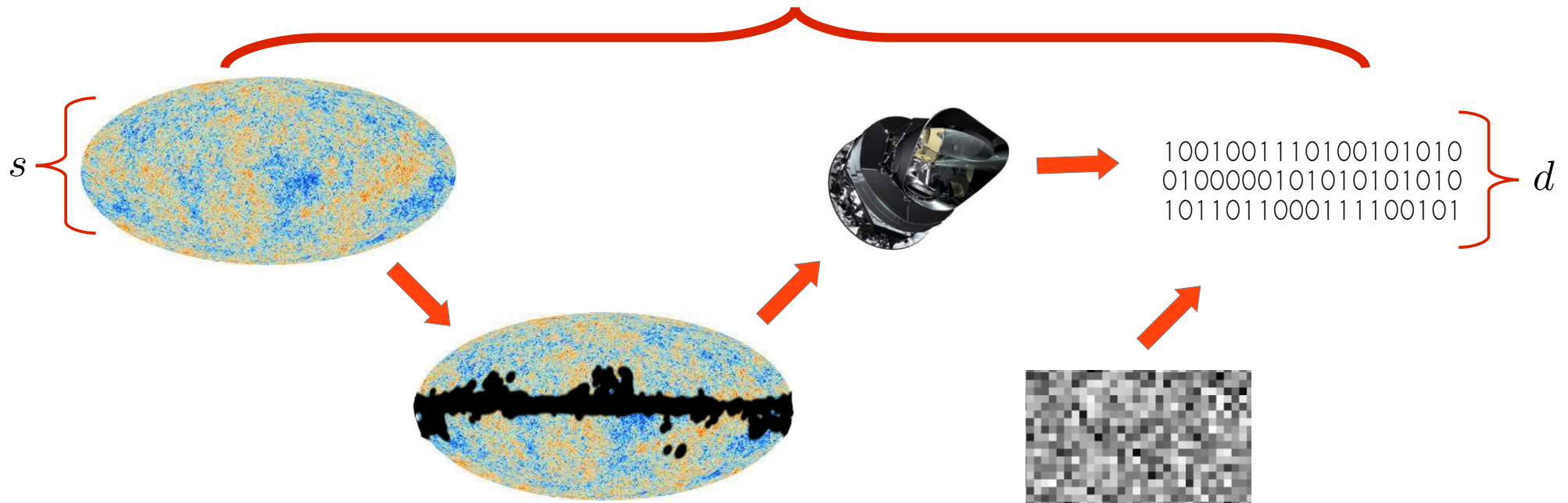
- we want to find an image
- data come from some sort of measurement
- measurement is usually noise influenced
- data set may not restrict all degrees of freedom of image



# the probability theory way of imaging

- we want to find an image
- data come from some sort of measurement
- measurement is usually noise influenced
- data set may not restrict all degrees of freedom of image

probabilistic forward model  $\mathcal{P}(d|s)$



# the probability theory way of imaging

$$\mathcal{P}(s|d) = \frac{\mathcal{P}(s)\mathcal{P}(s|d)}{\mathcal{P}(d)}$$

Since there is no unique solution we work with probabilities.

$\mathcal{P}(d|s)$  the forward model

$\mathcal{P}(s)$  our background information

$\mathcal{P}(s|d)$  our knowledge state having the data

Get most likely value for  $s$  :  
*(or even better the mean)*

$$m = \arg \max \mathcal{P}(s|d)$$



our map

# The typical CSI scene



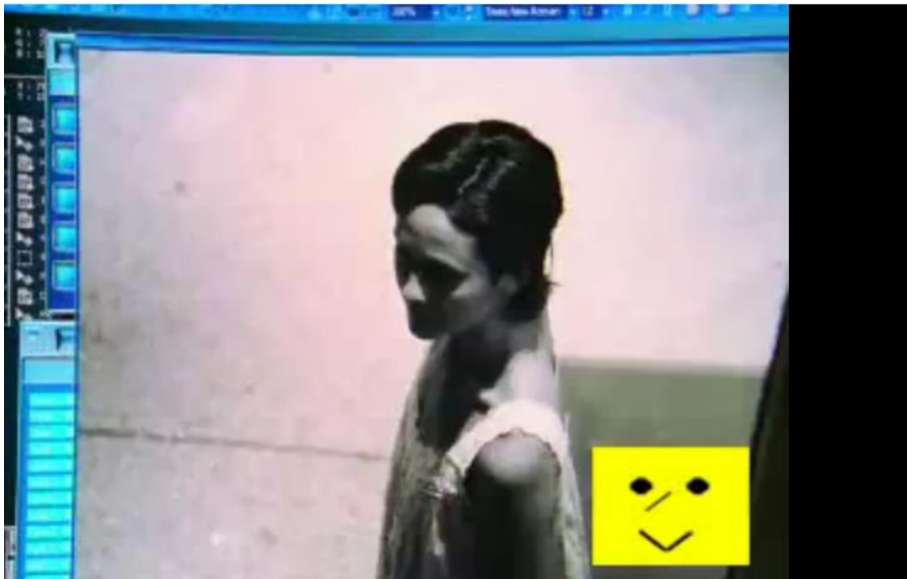
# The typical CSI scene

Zoom in on her eye!

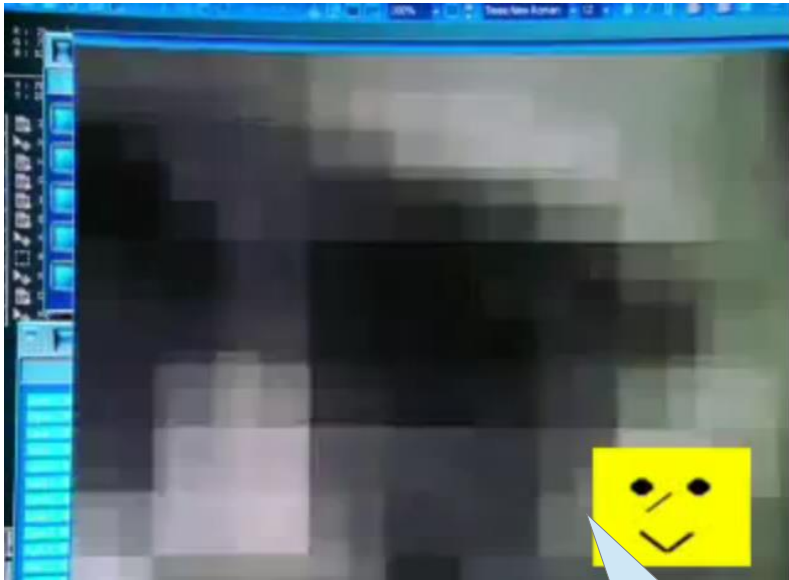




# The typical CSI scene

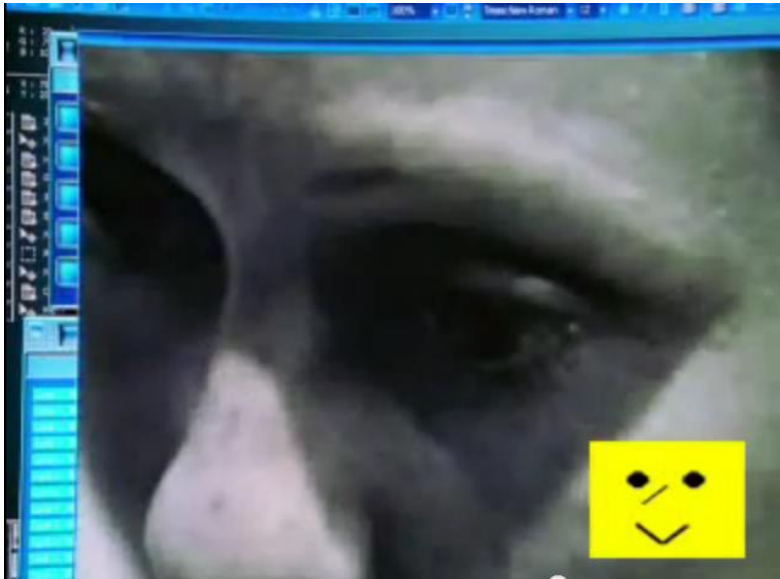


# The typical CSI scene



technology sounds

# The typical CSI scene



More!



# The typical CSI scene



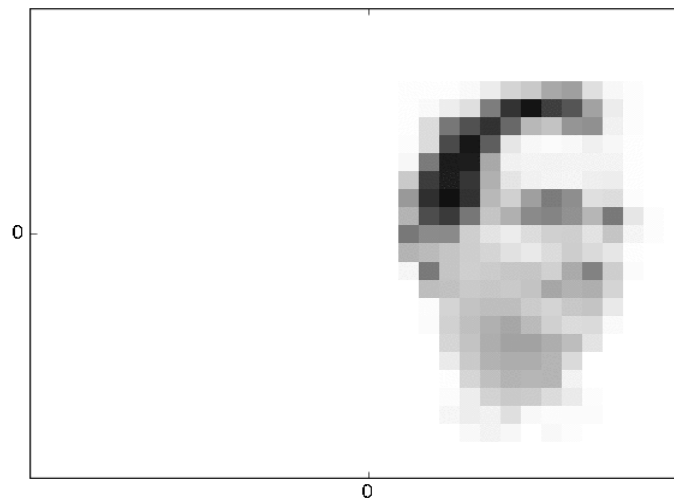
I can see a reflection of the killer!



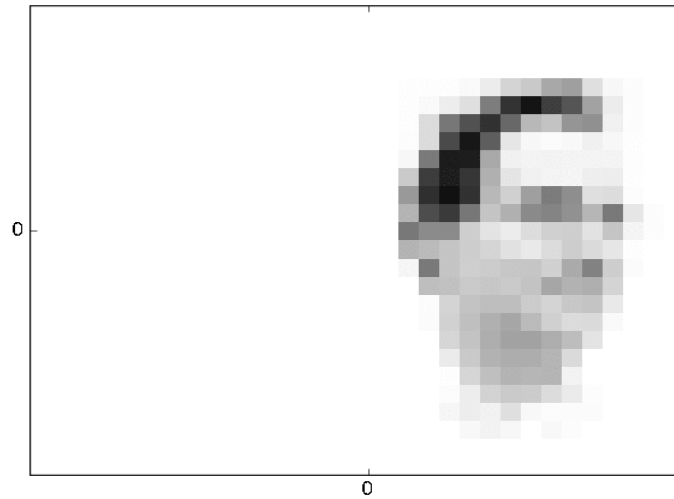
**BULLSHIT!**



What is possible?



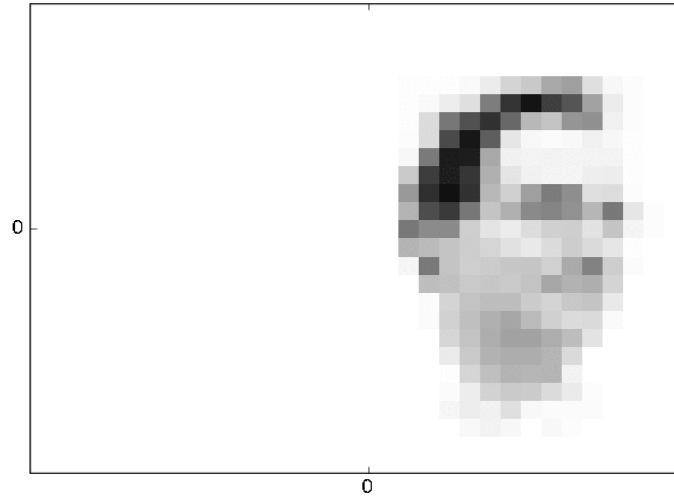
What is possible?



frame by frame filter



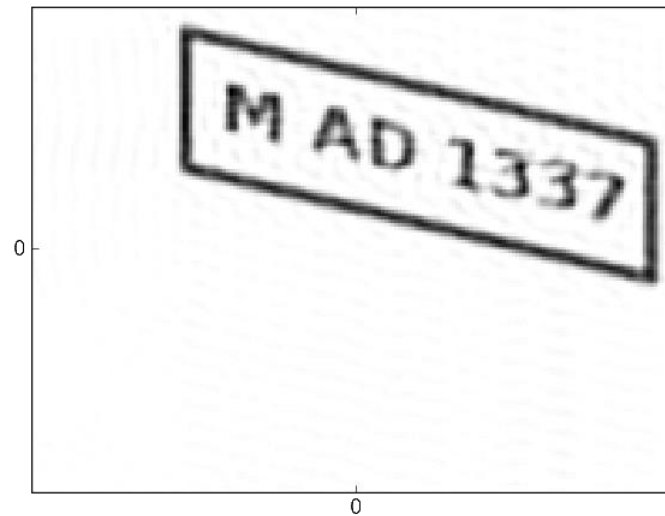
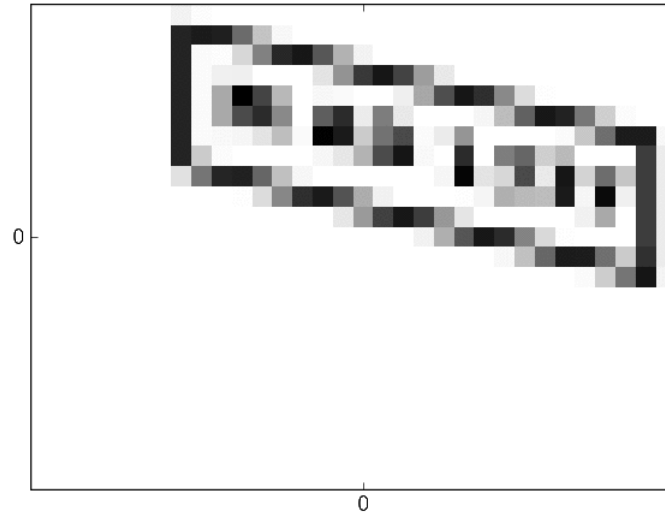
What is possible?



all frames combined



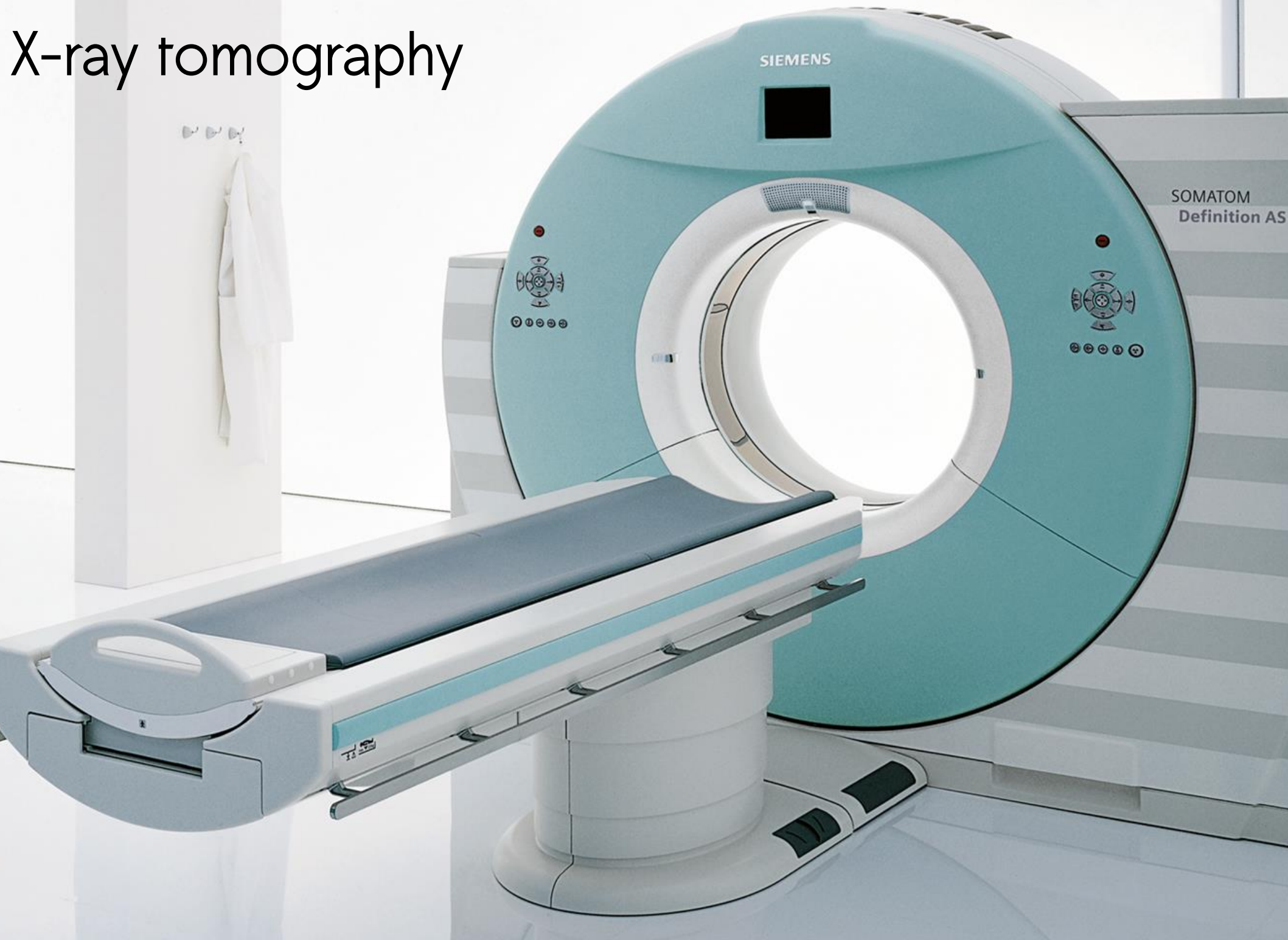
What is possible?  
(more realistic)



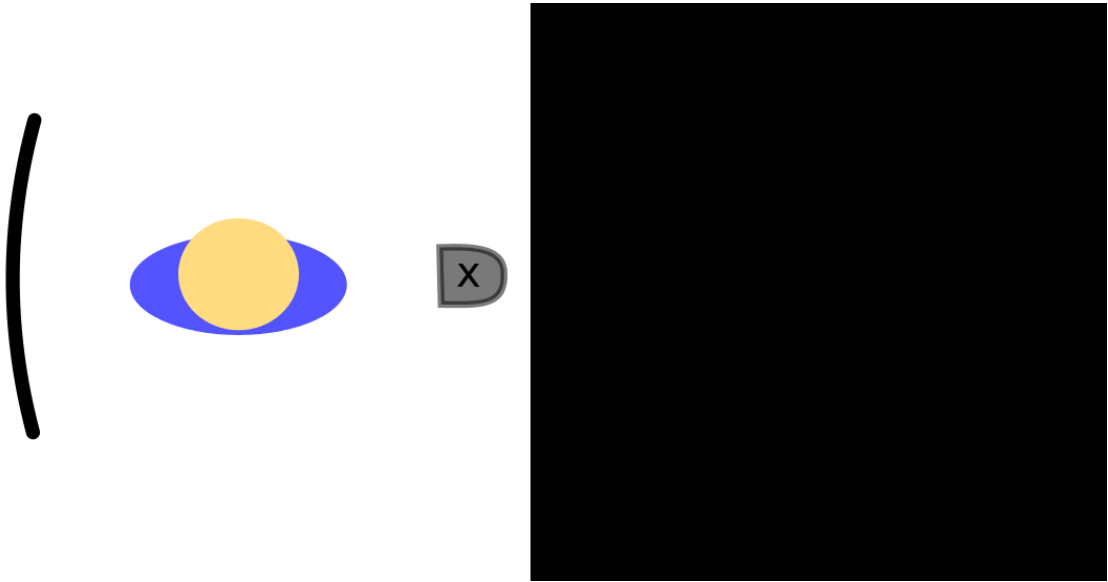
**only 5 frames**



# X-ray tomography

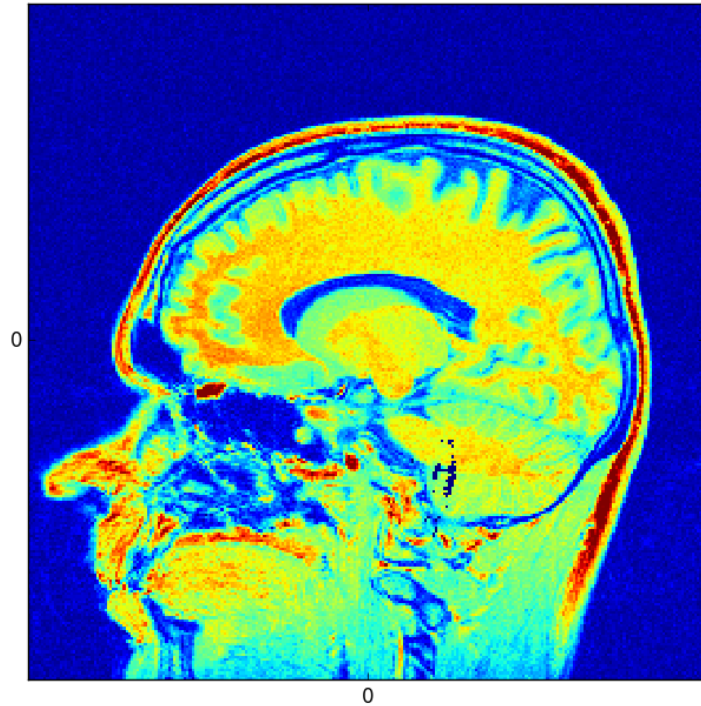


# Tomography X-ray CT

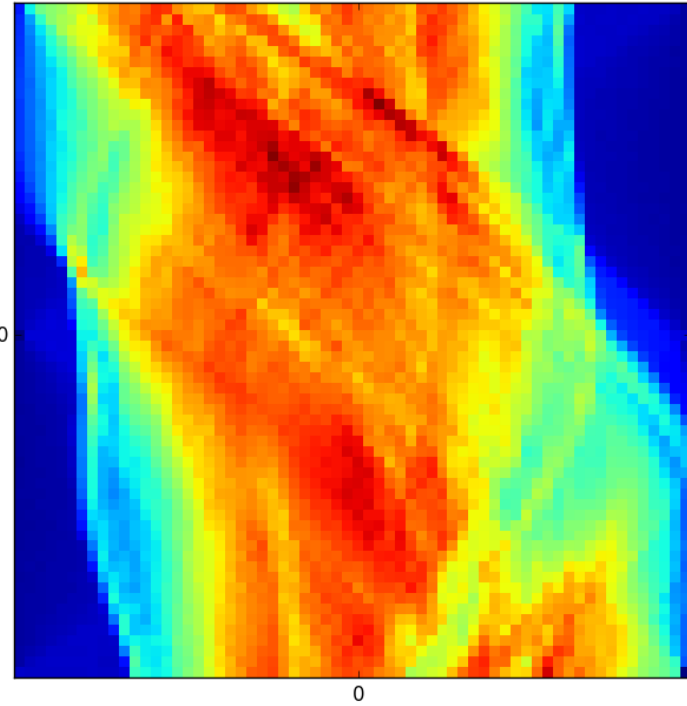


# Tomography X-ray CT

model



sinogram

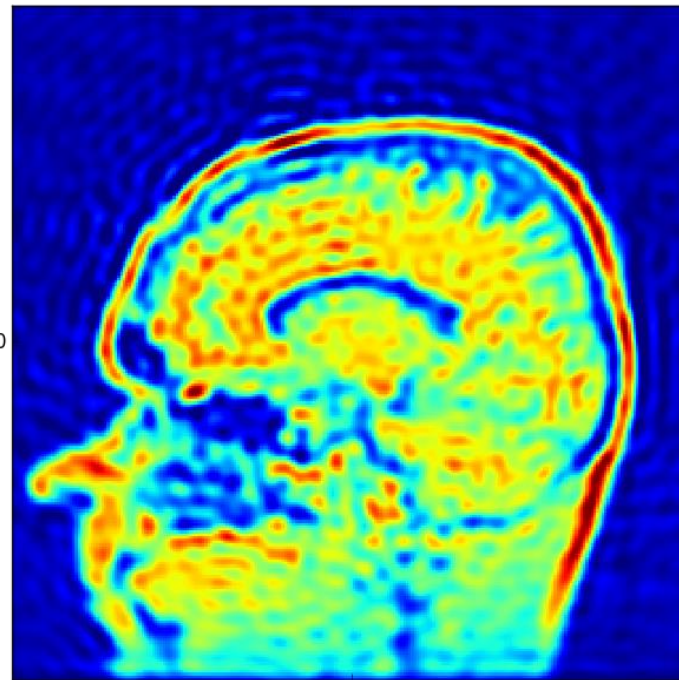
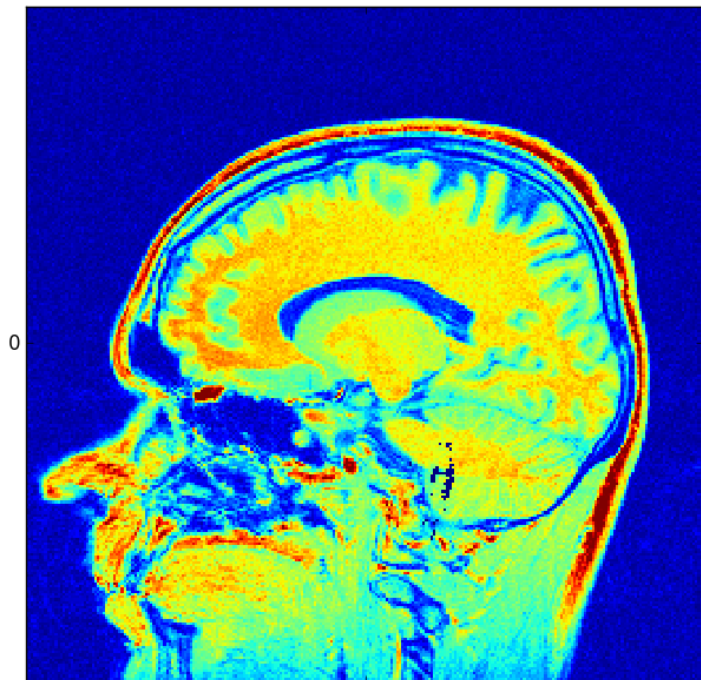


# Tomography X-ray CT

noise-free

model

backprojection

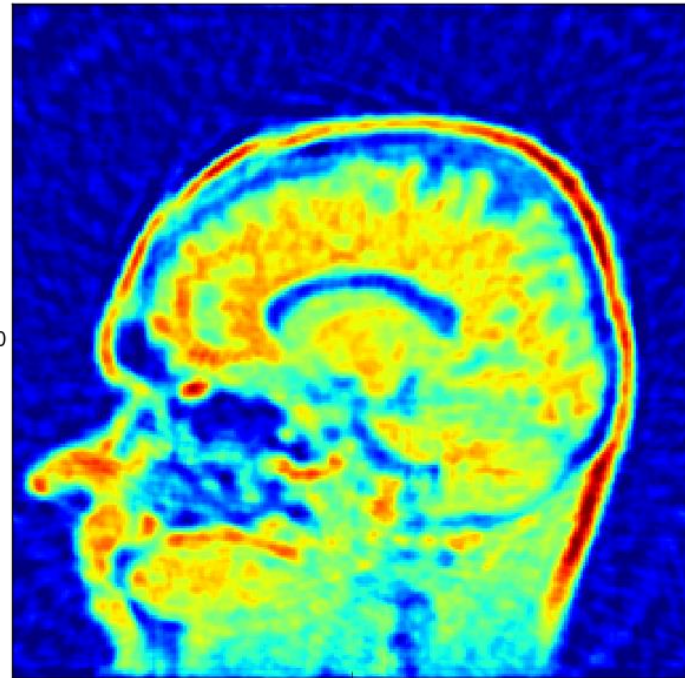
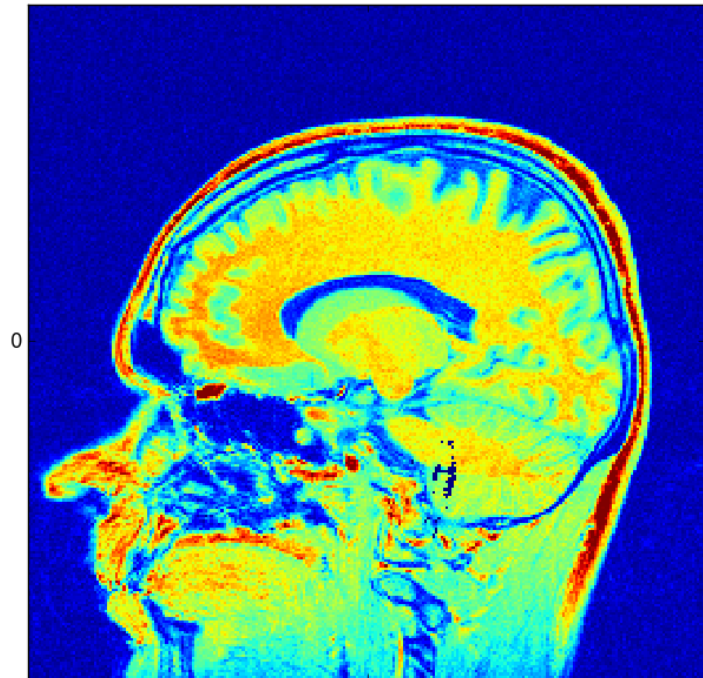


# Tomography X-ray CT

noise-free

model

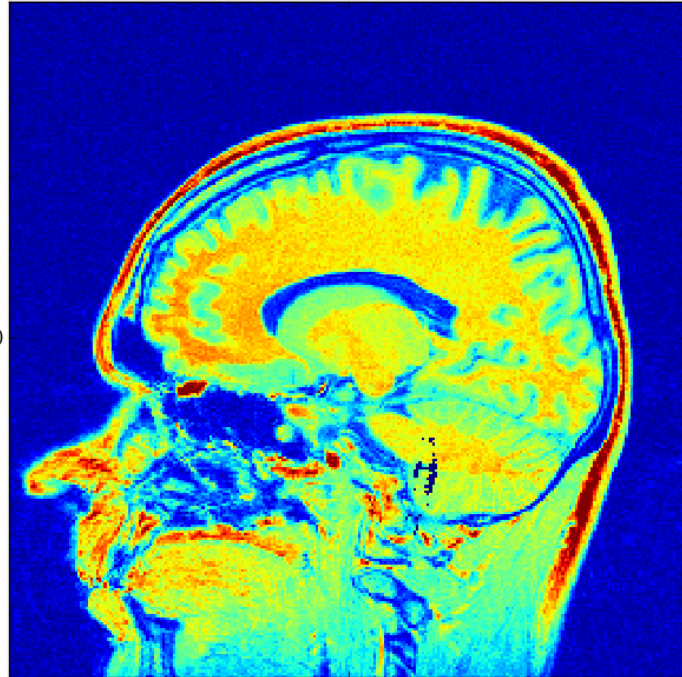
Wiener filter



# Tomography X-ray CT

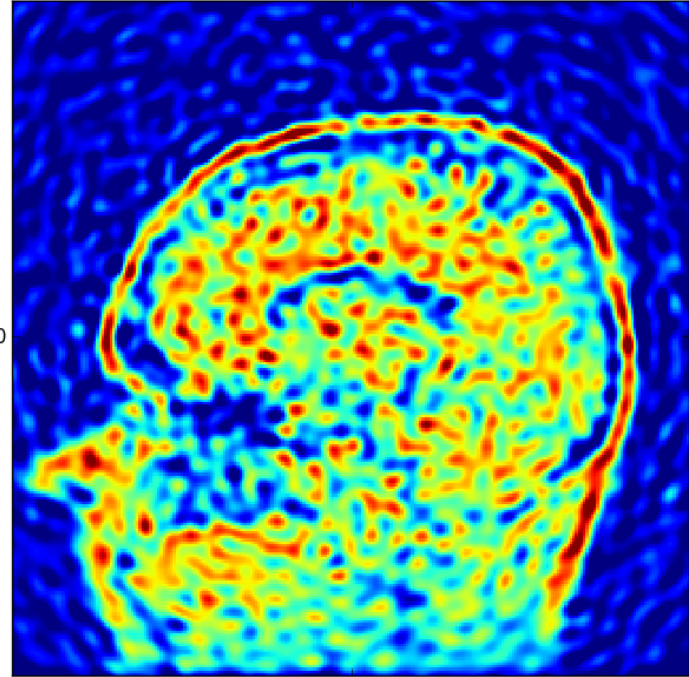
with noise

model



0

backprojection

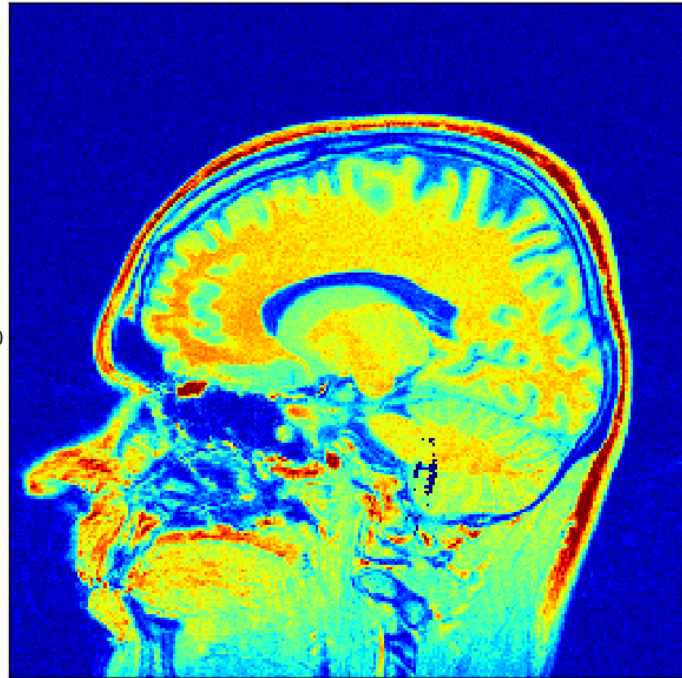


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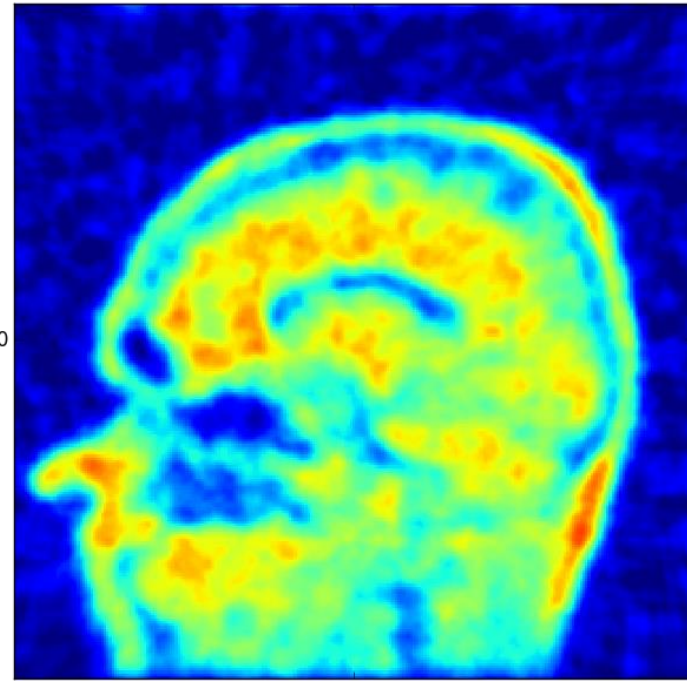
# Tomography X-ray CT

with noise

model



Wiener filter

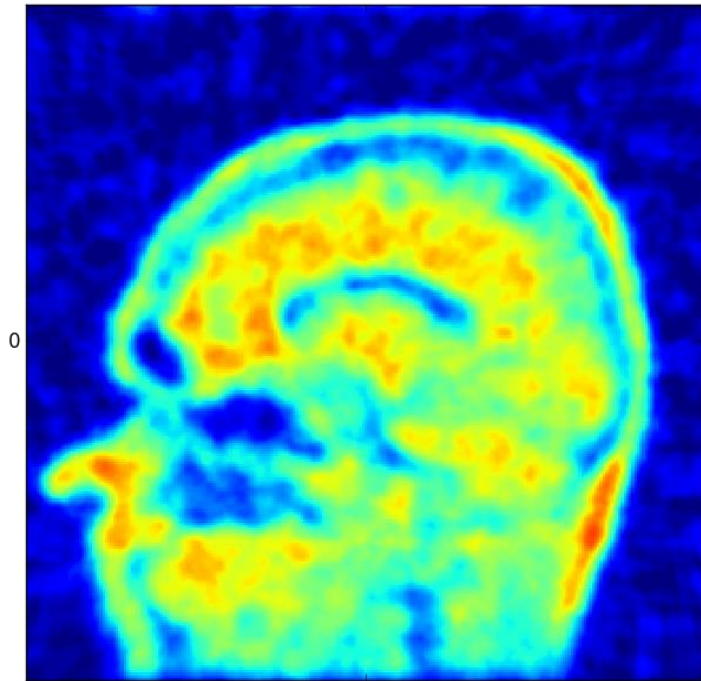


# Tomography X-ray CT

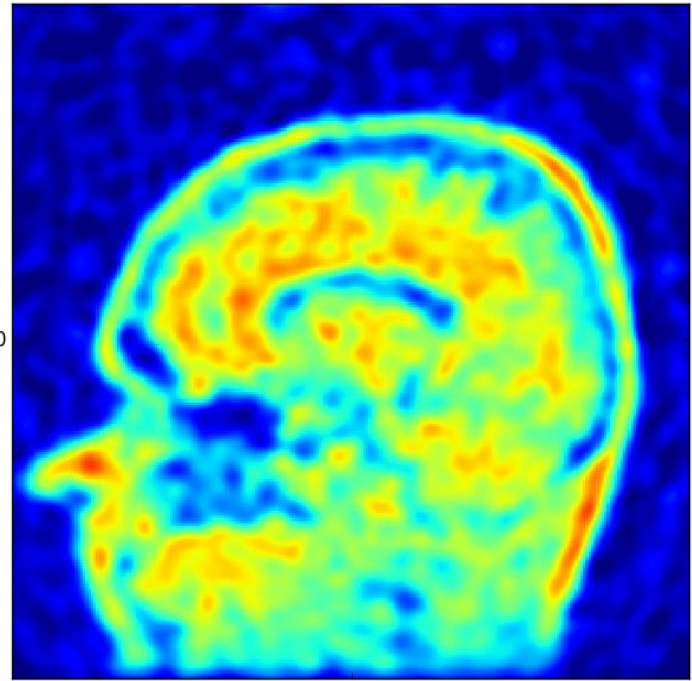
with noise

Wiener filter

filtered backprojection



0

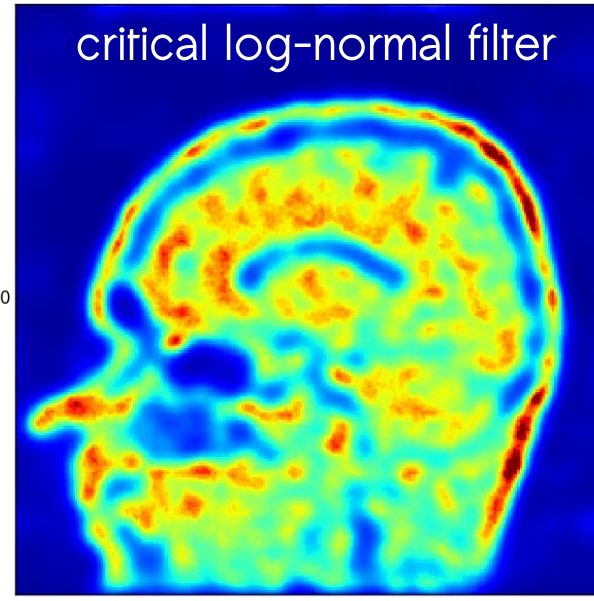
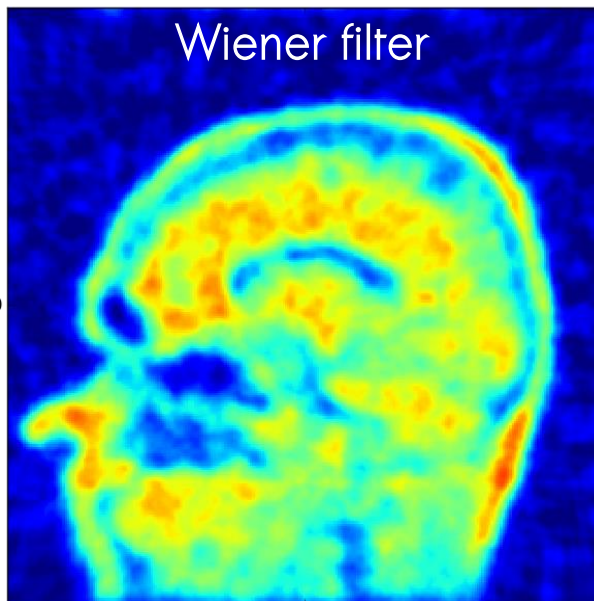
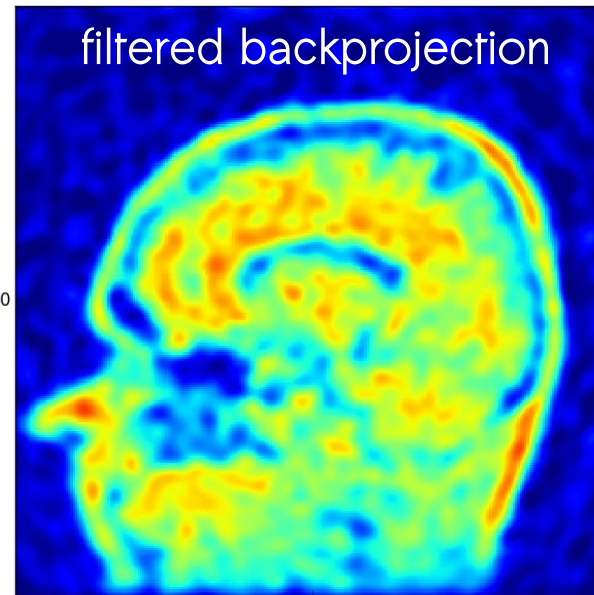
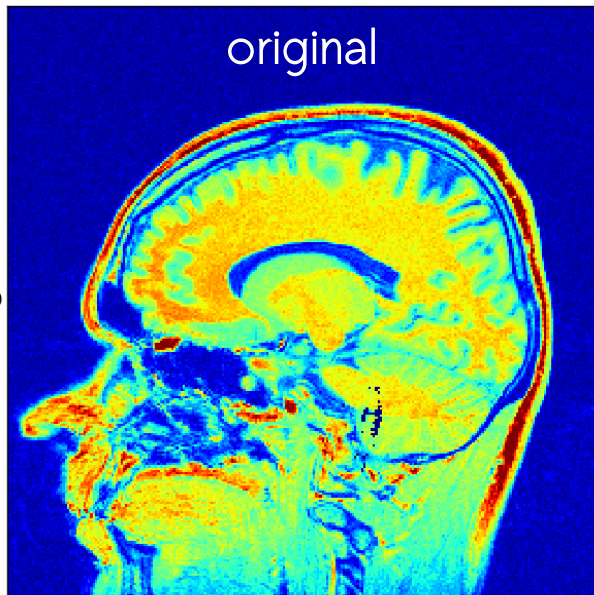


0



# Tomography X-ray CT

with noise



# Tomography of the interstellar medium

# Interstellar medium

as dilute as vacuum made in a laboratory

but over light years of distances still an important component

ionized part influences all electromagnetic radiation that reaches us

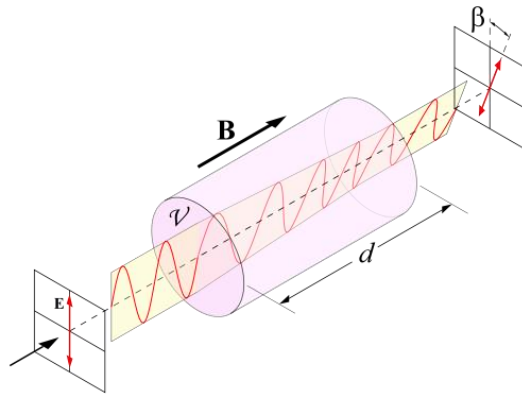
————→ ionized part characterized by free electron density

---

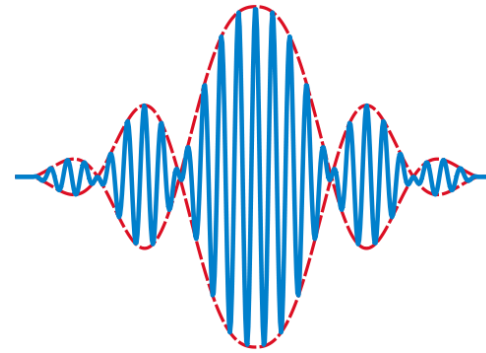
# Interstellar free electrons

## Influence on electromagnetic radiation

Faraday rotation

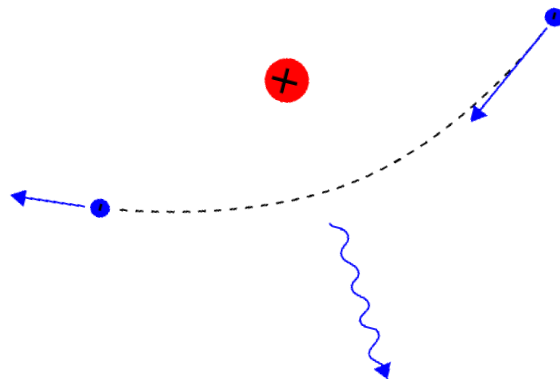


dispersion

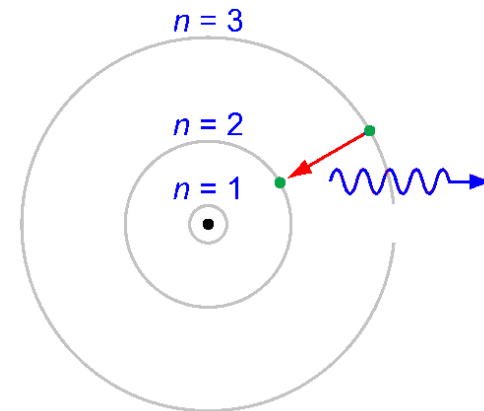


## Emission of electromagnetic radiation

free free emission



H-alpha emission



# Interstellar medium

as dilute as vacuum made in a laboratory

but over light years of distances still an important component

ionized part influences all electromagnetic radiation that reaches us

————→ ionized part characterized by free electron density

---

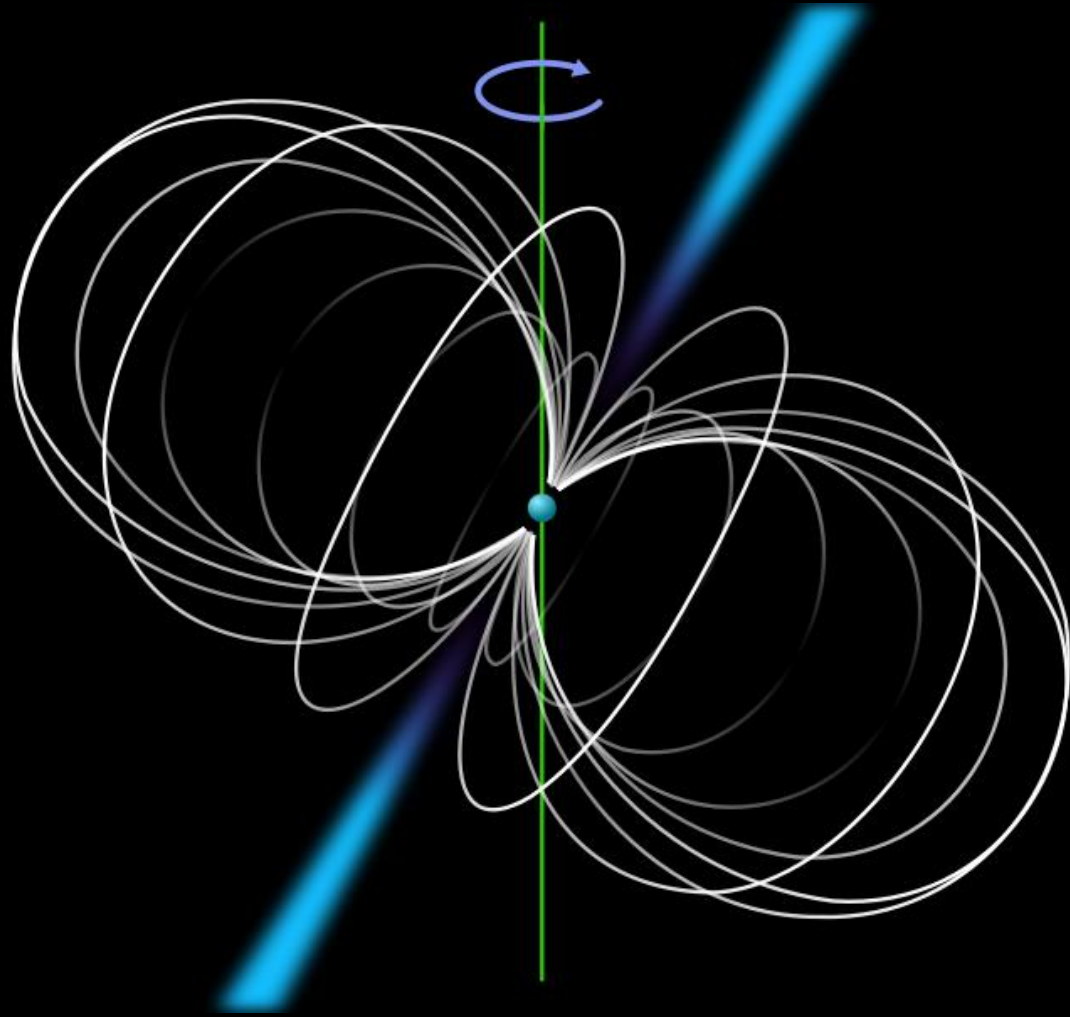
3D map of free electron density would be useful for

- understanding the structure and evolution of the Milky Way
- estimating the distance of pulsars
- learning the distribution of magnetic fields in the Milky Way
- and even cosmic magnetic fields...

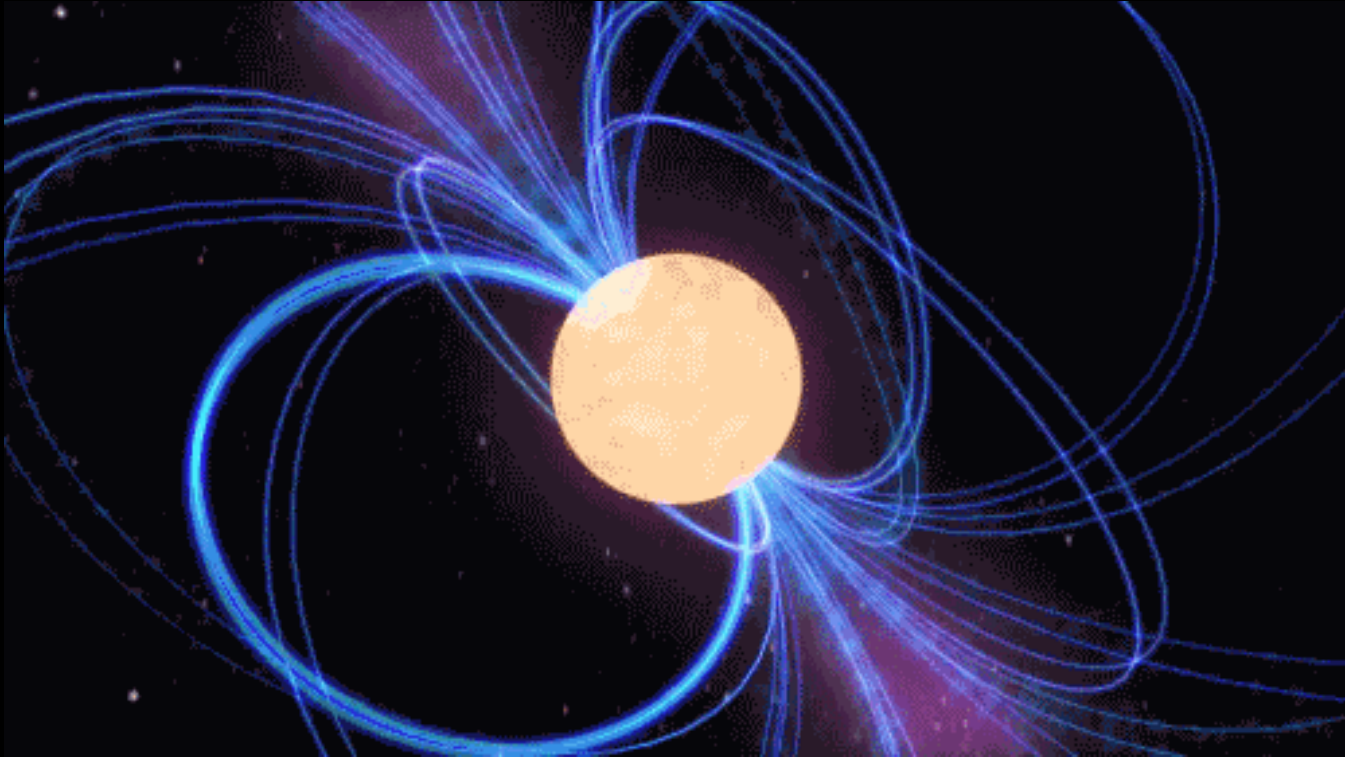
When big stars die  
- the birth of a neutron star -



The cool kind of neutron star  
- a pulsar -



The cool kind of neutron star  
- a pulsar -





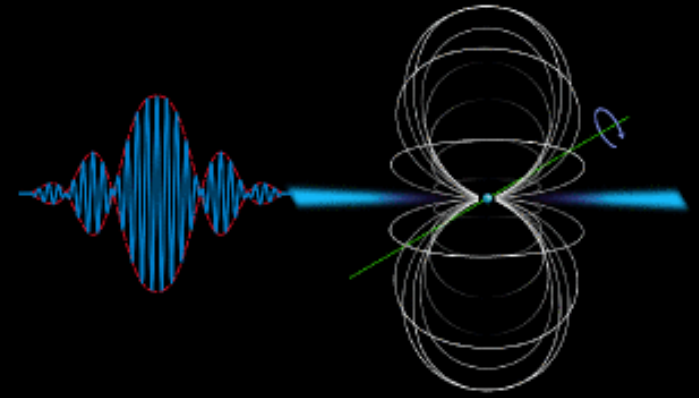
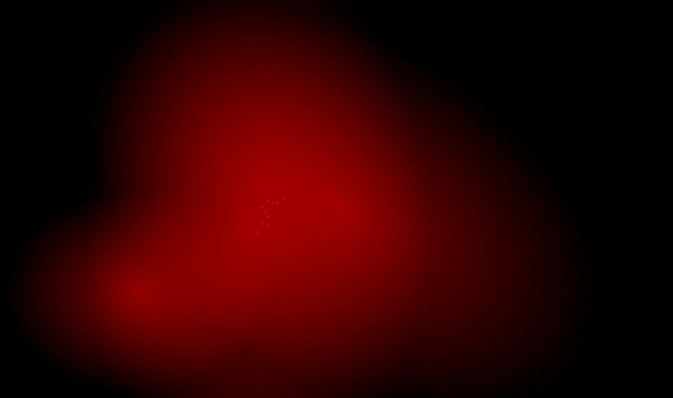
The cool kind of neutron star  
- a pulsar -



Crab Pulsar taken at 800nm (slow motion)

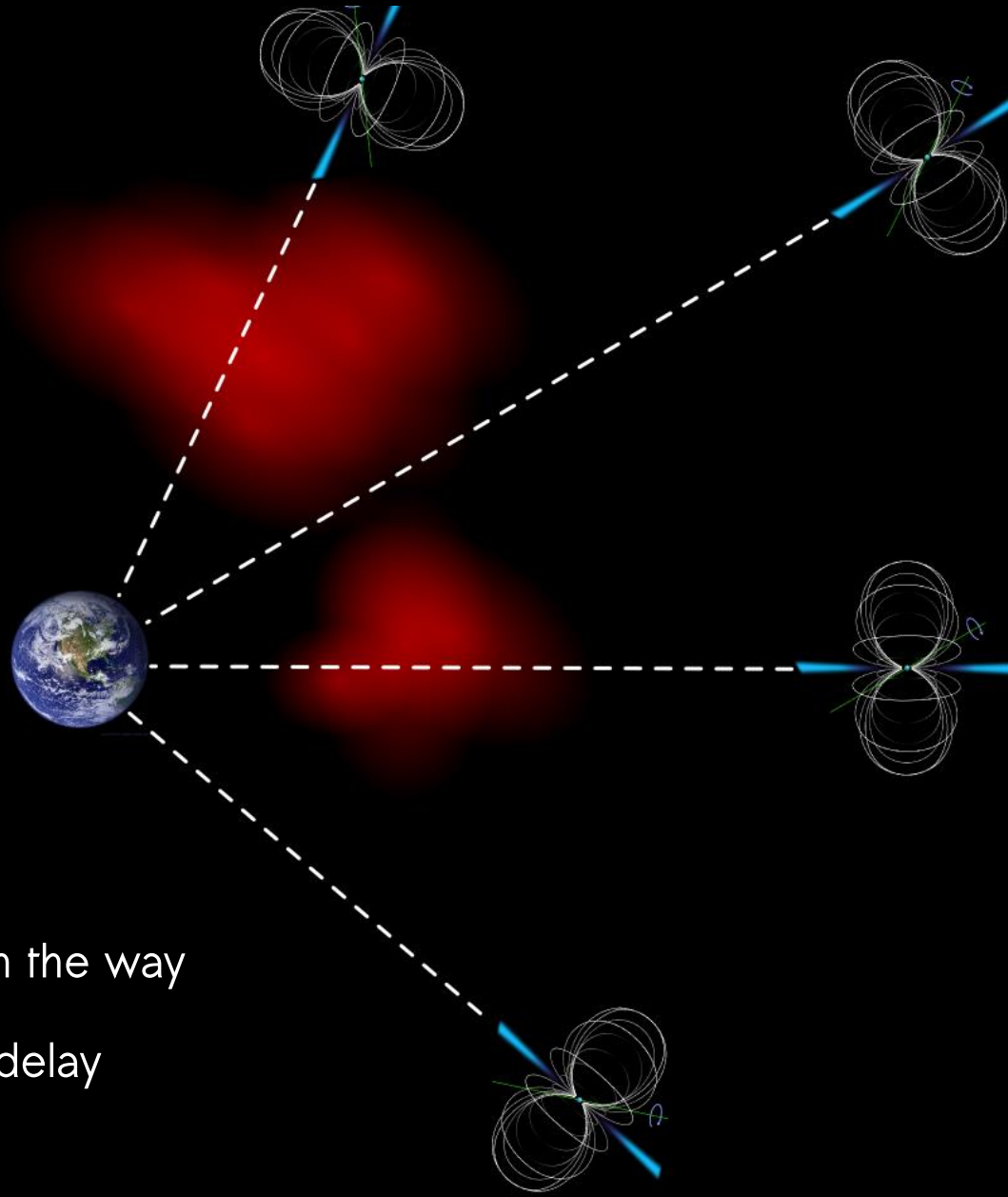
# Pulsars and tomography

- whats the connection? -



ionized cloud elongates wave packet  
→ time delay between different frequencies

# Pulsars and tomography - whats the connection? -



more ionized gas in the way

→ bigger time delay

# Pulsars and tomography

- whats the connection? -

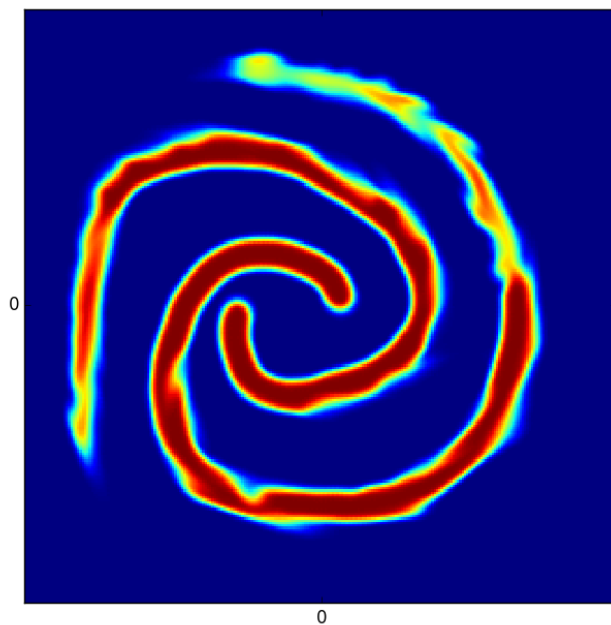
different frequencies emitted by pulsars arrive at different times

the time delay is proportional to the amount of ionized gas on the line of sight

same principle as X-ray tomography (but with static sources)

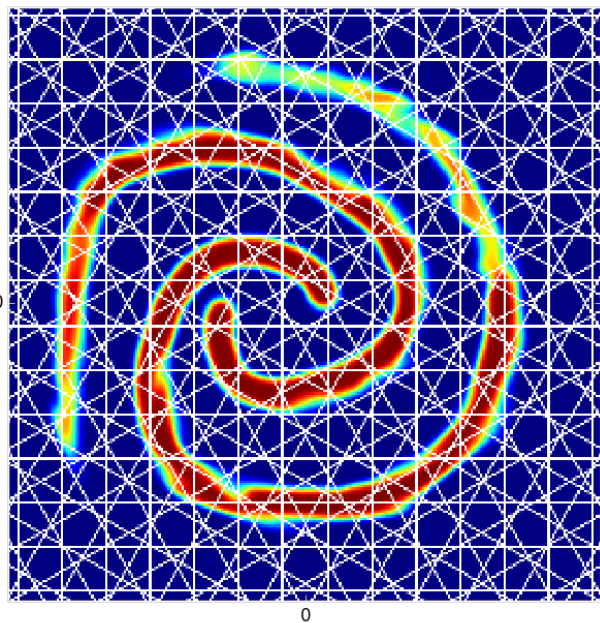
————→ use information theory to derive a 3D map of the interstellar medium

# Simple toy model

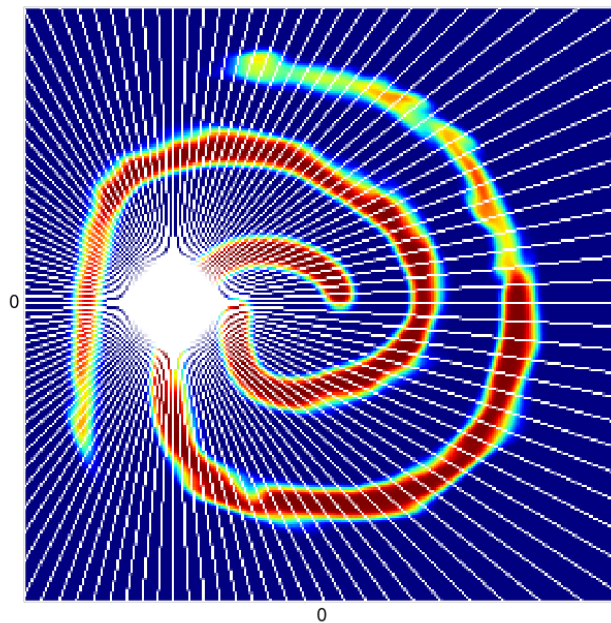


# Simple toy model

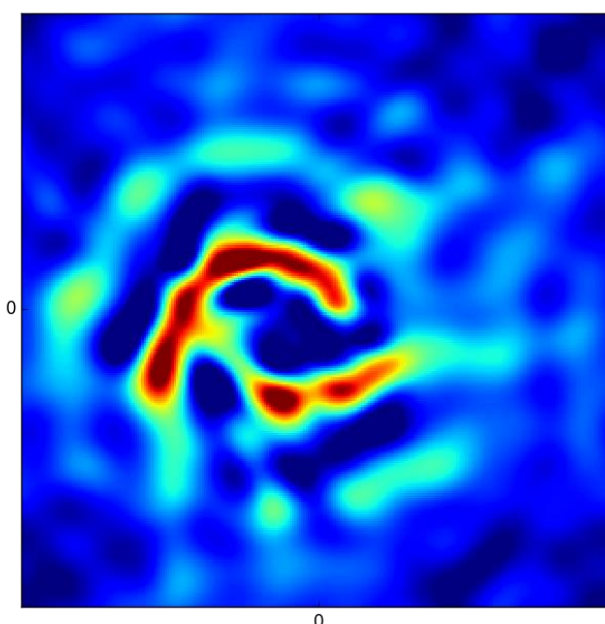
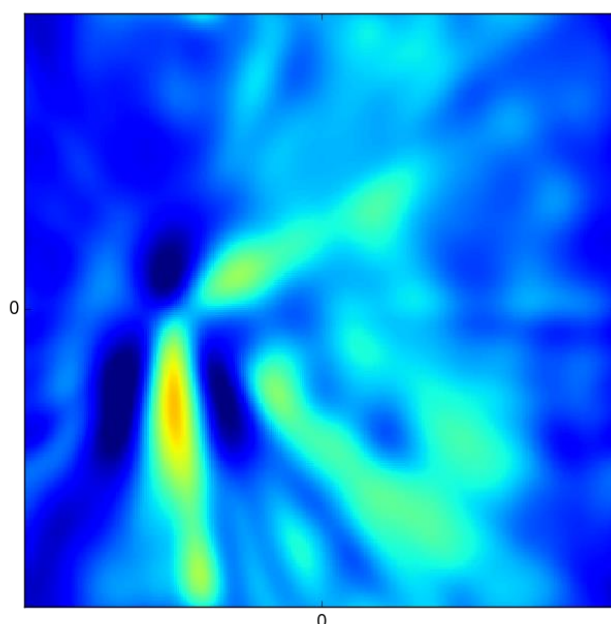
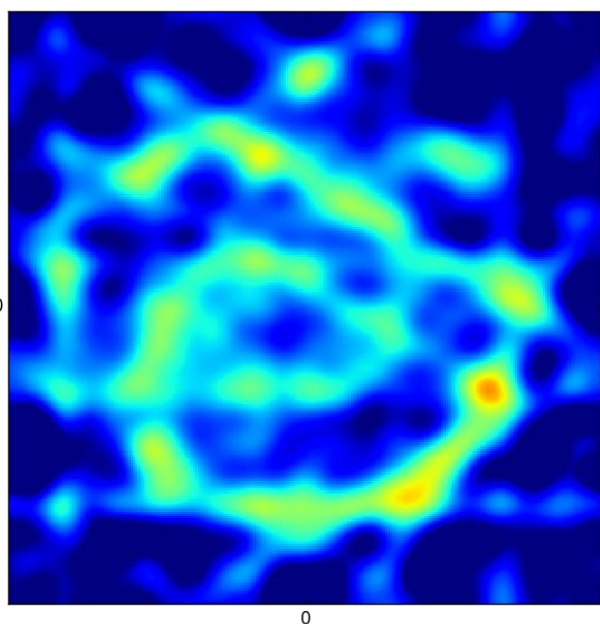
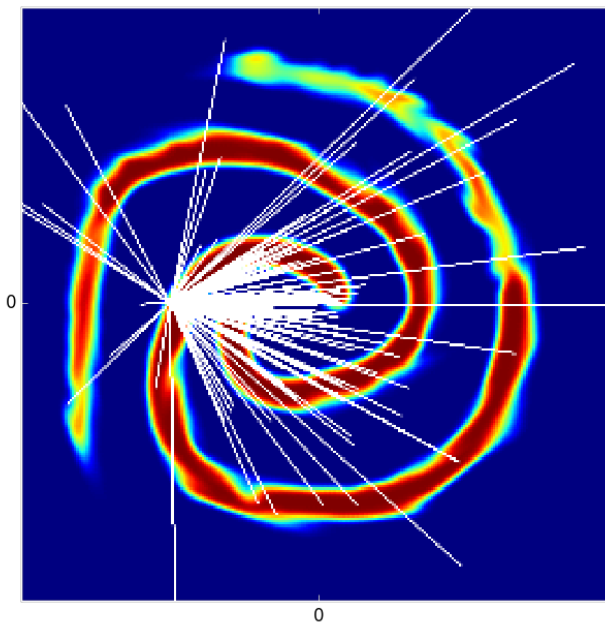
CT scan pattern



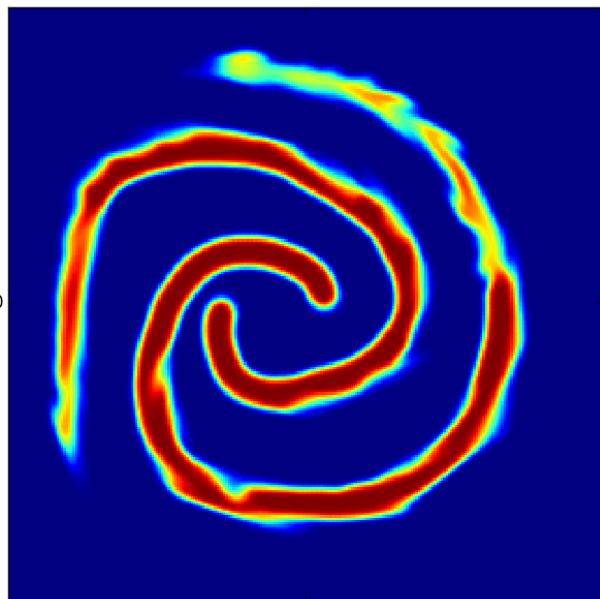
all sky map



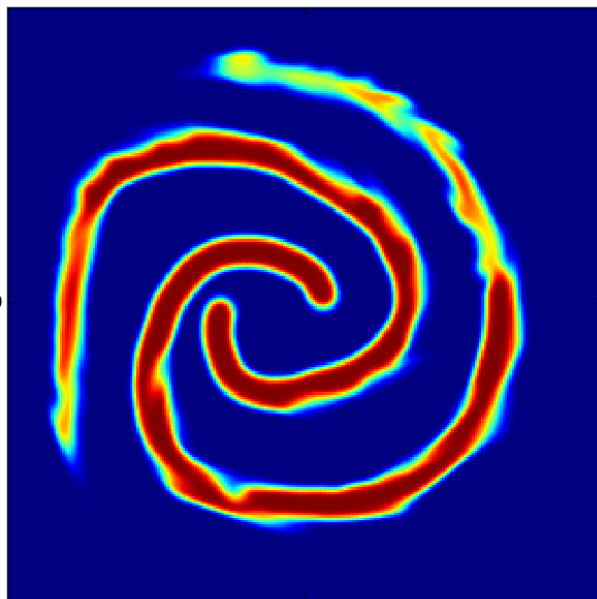
pulsar pattern



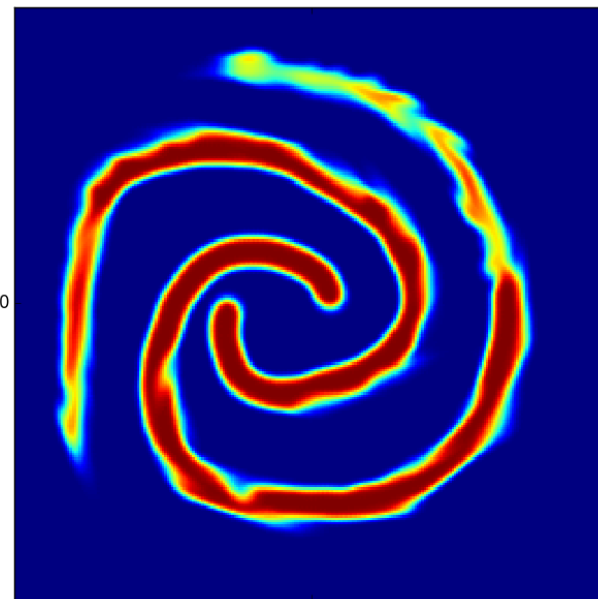
# Simple toy model



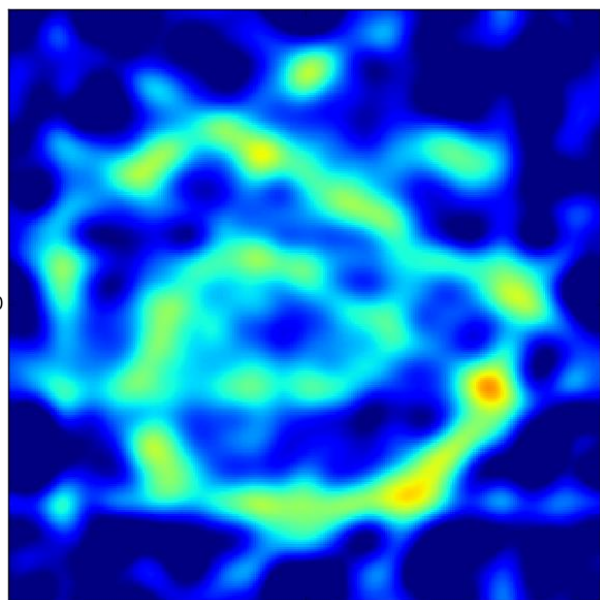
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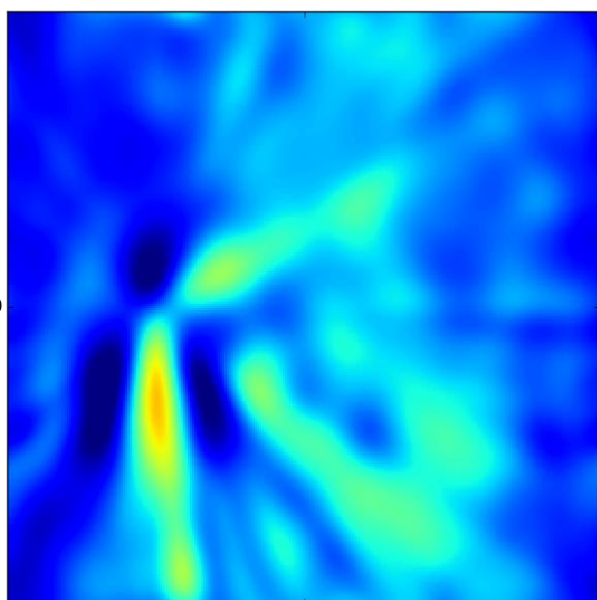
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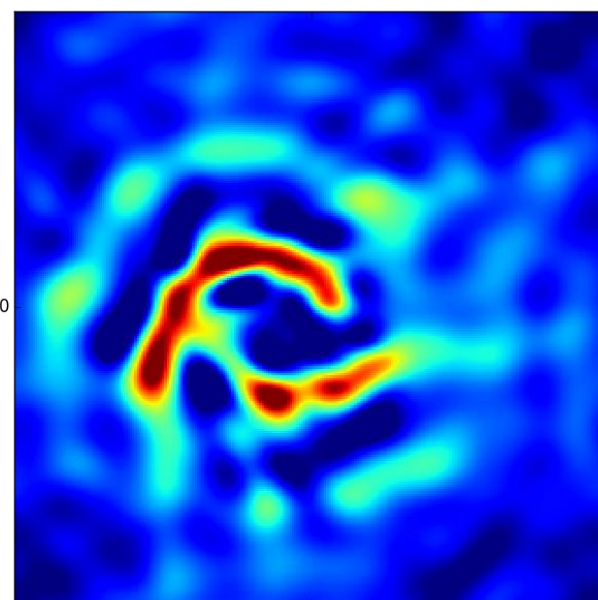
0



0



0



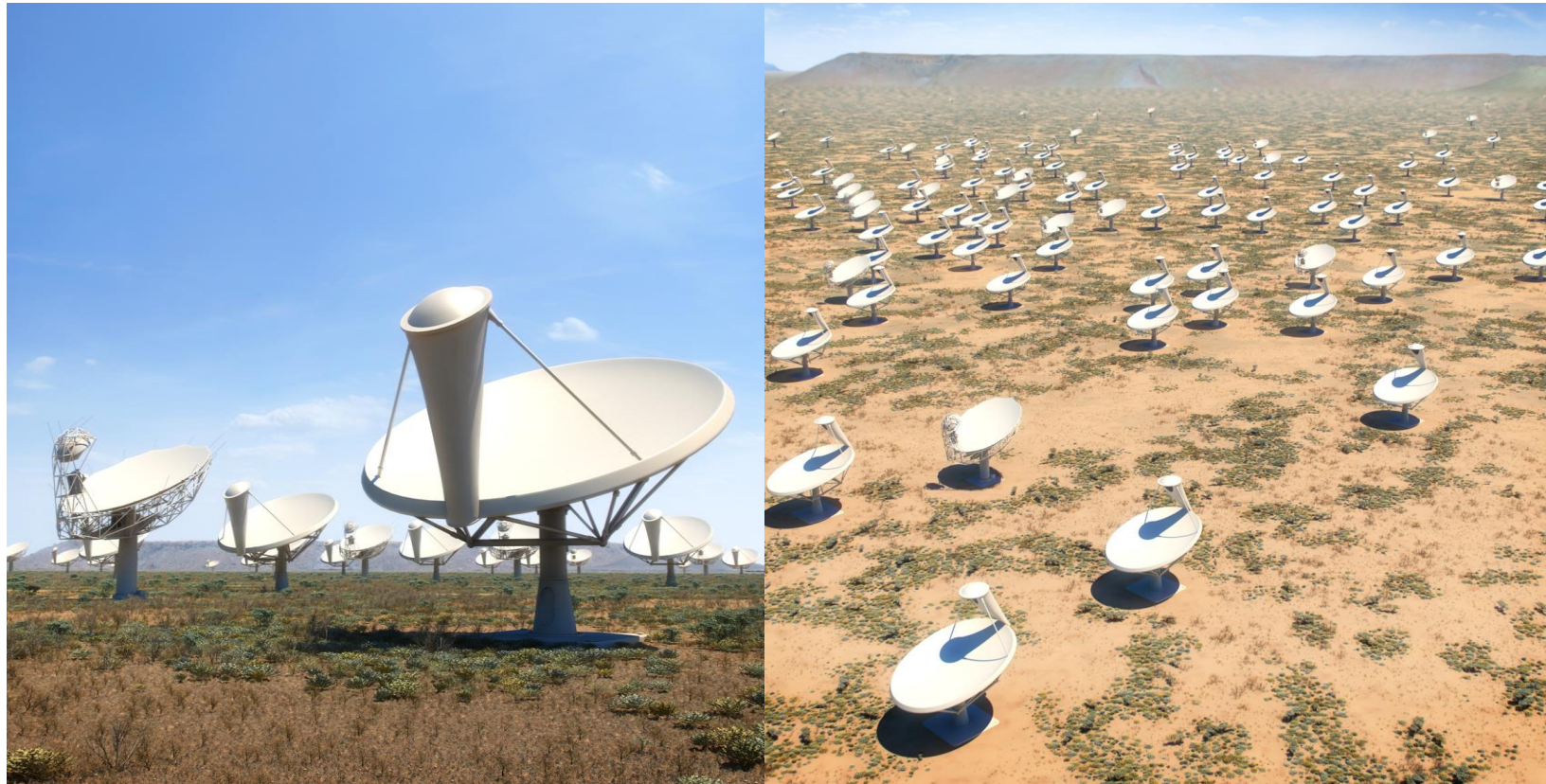
0

What will the SKA enable?



# The Square Kilometer Array (SKA)

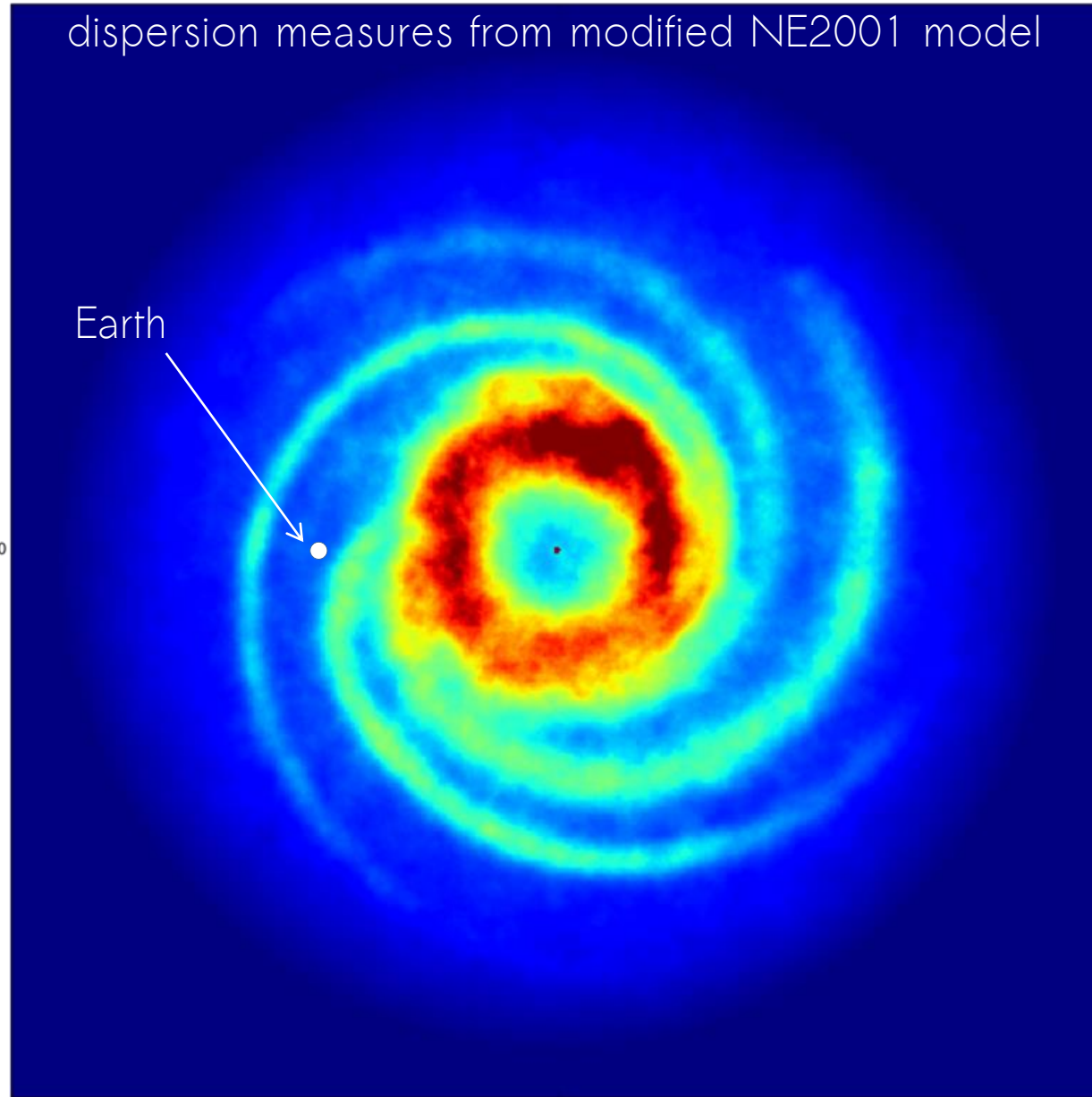
The SKA people hope to find ~ 10000 pulsars with distance uncertainties below 20%



# Simulated SKA data

simulated pulsar population and SKA observation  
(using PsrPopPy)

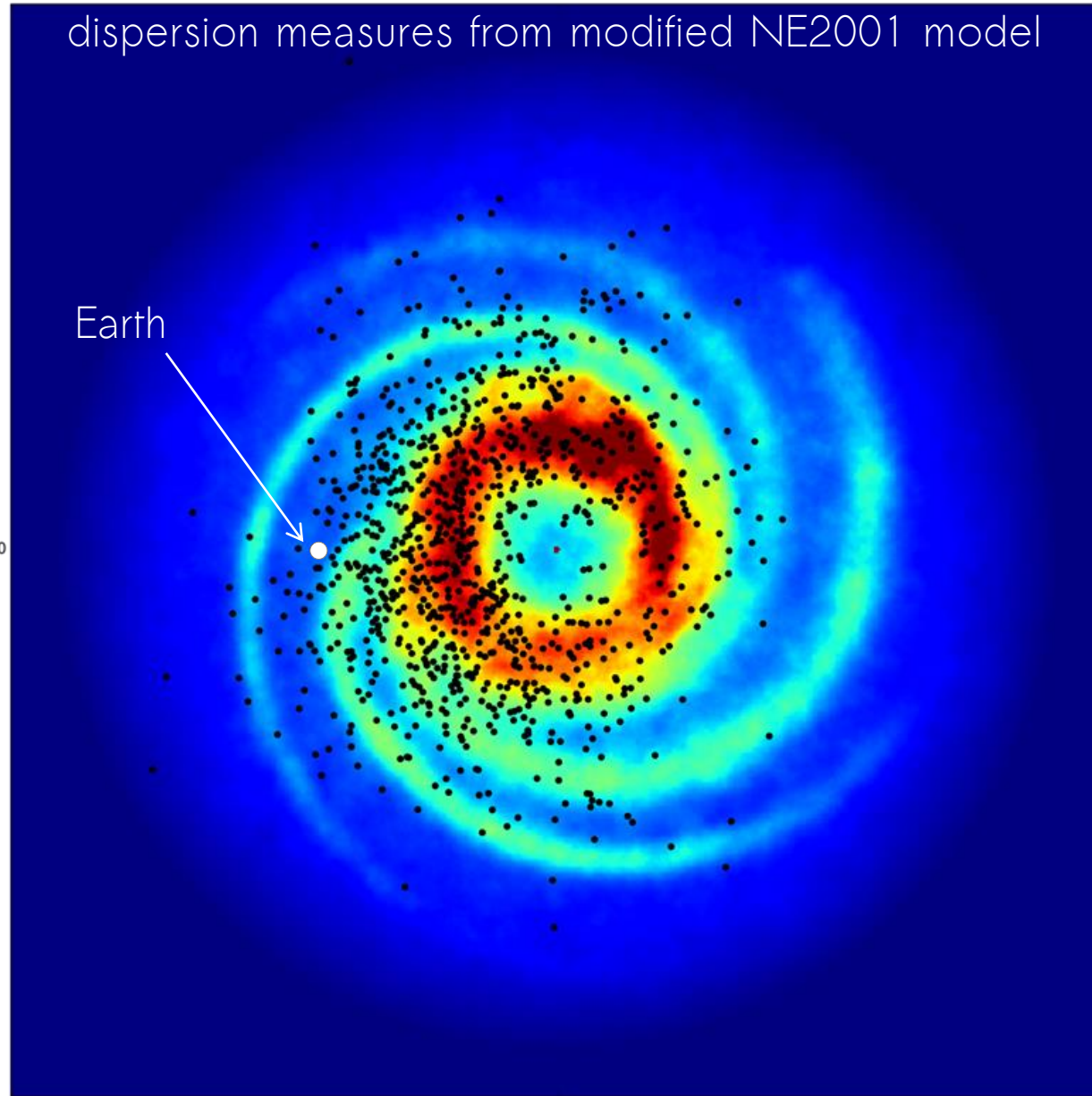
dispersion measures from modified NE2001 model



# Simulated SKA data

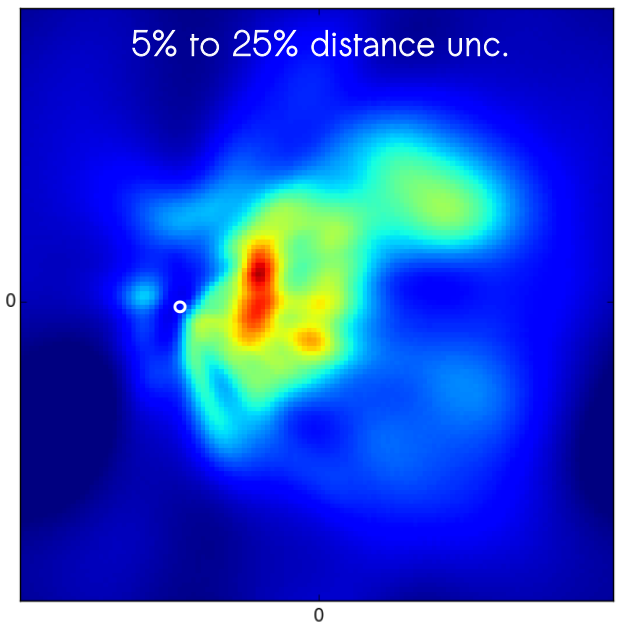
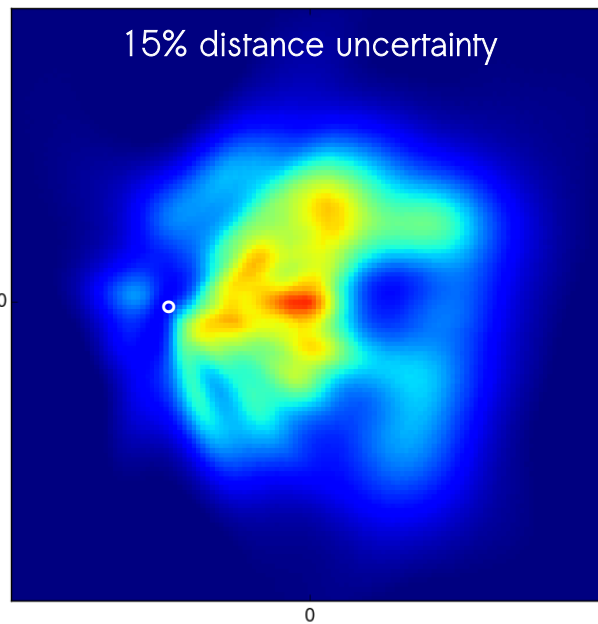
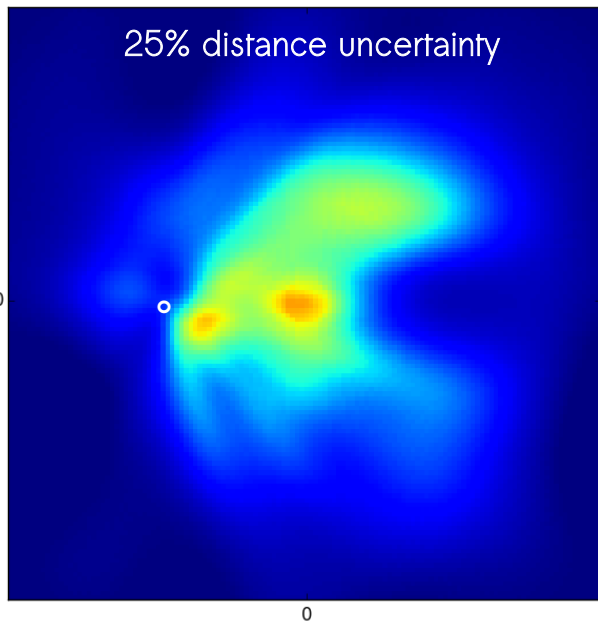
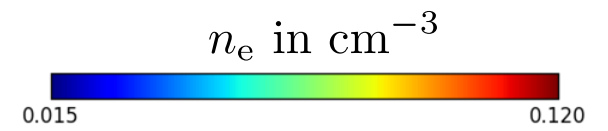
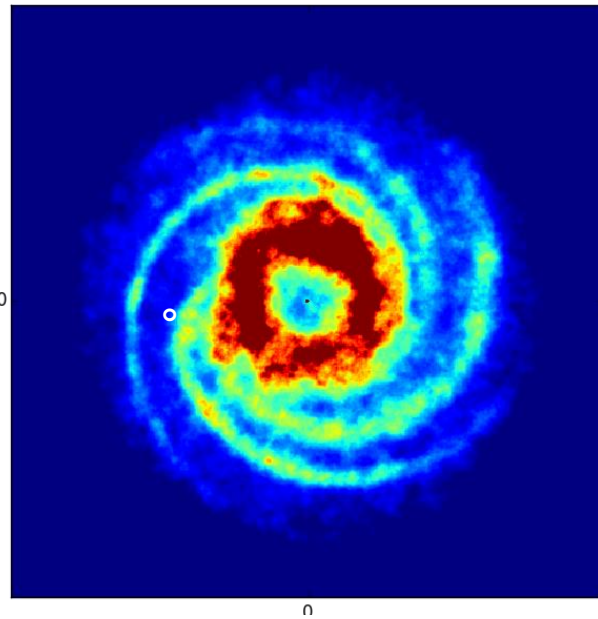
simulated pulsar population and SKA observation  
(using PsrPopPy)

dispersion measures from modified NE2001 model



# Simulated SKA data

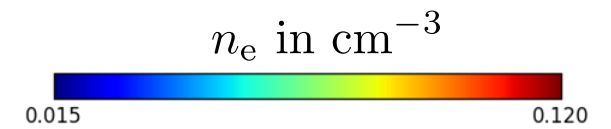
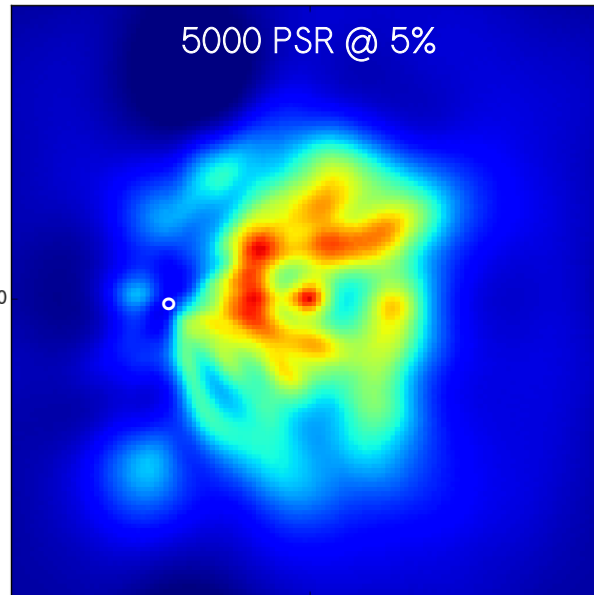
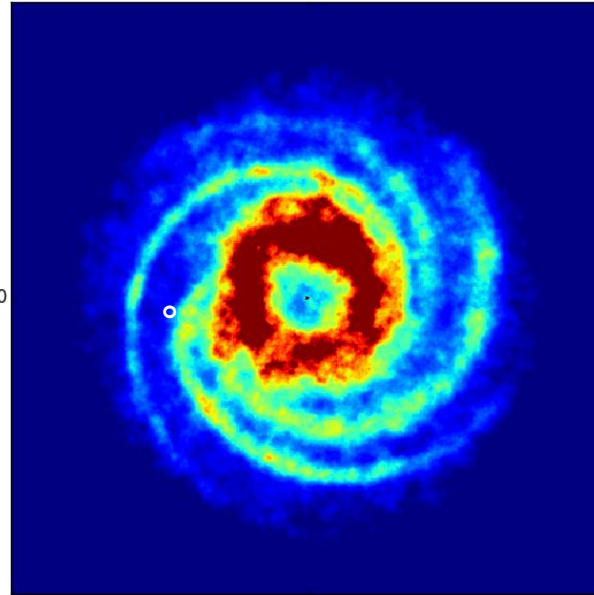
- 10000 pulsars -



# Simulated SKA data

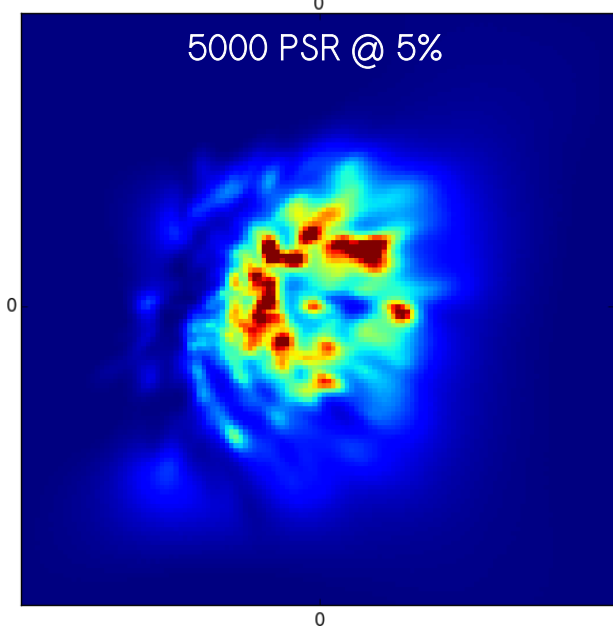
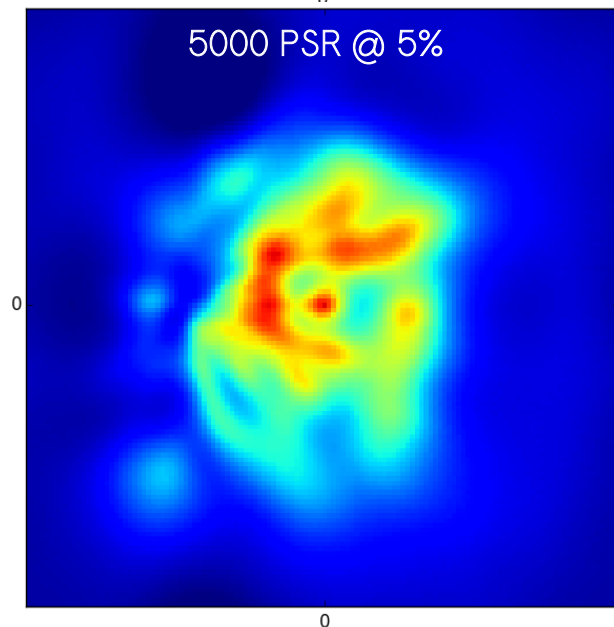
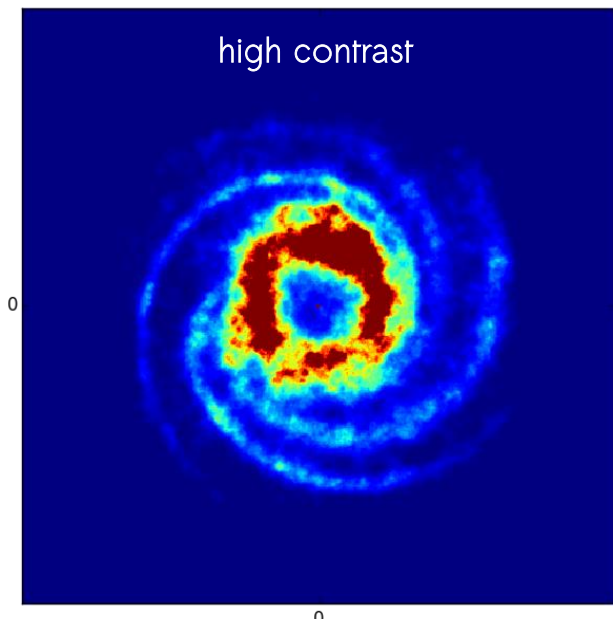
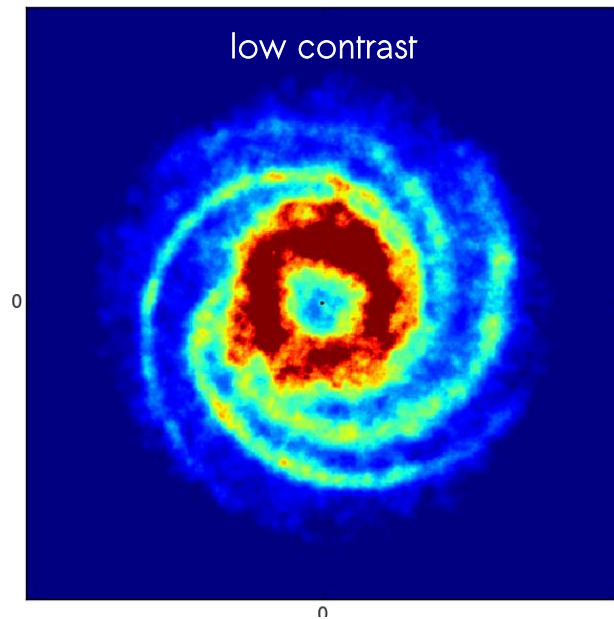
- wish for low distance uncertainties -

If we could go to 5%  
distance uncertainty,  
reconstruction would  
improve strongly

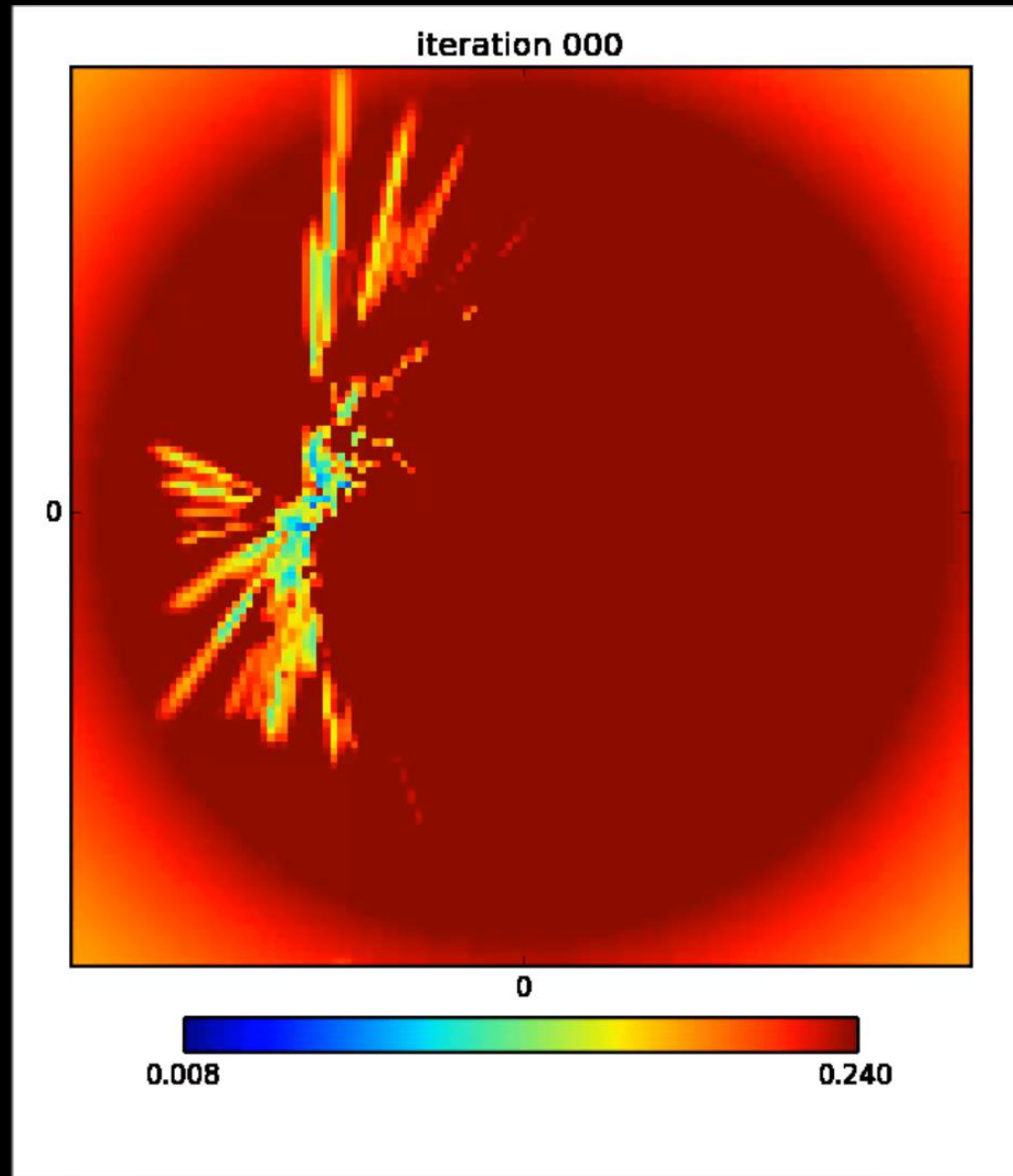


# Simulated SKA data

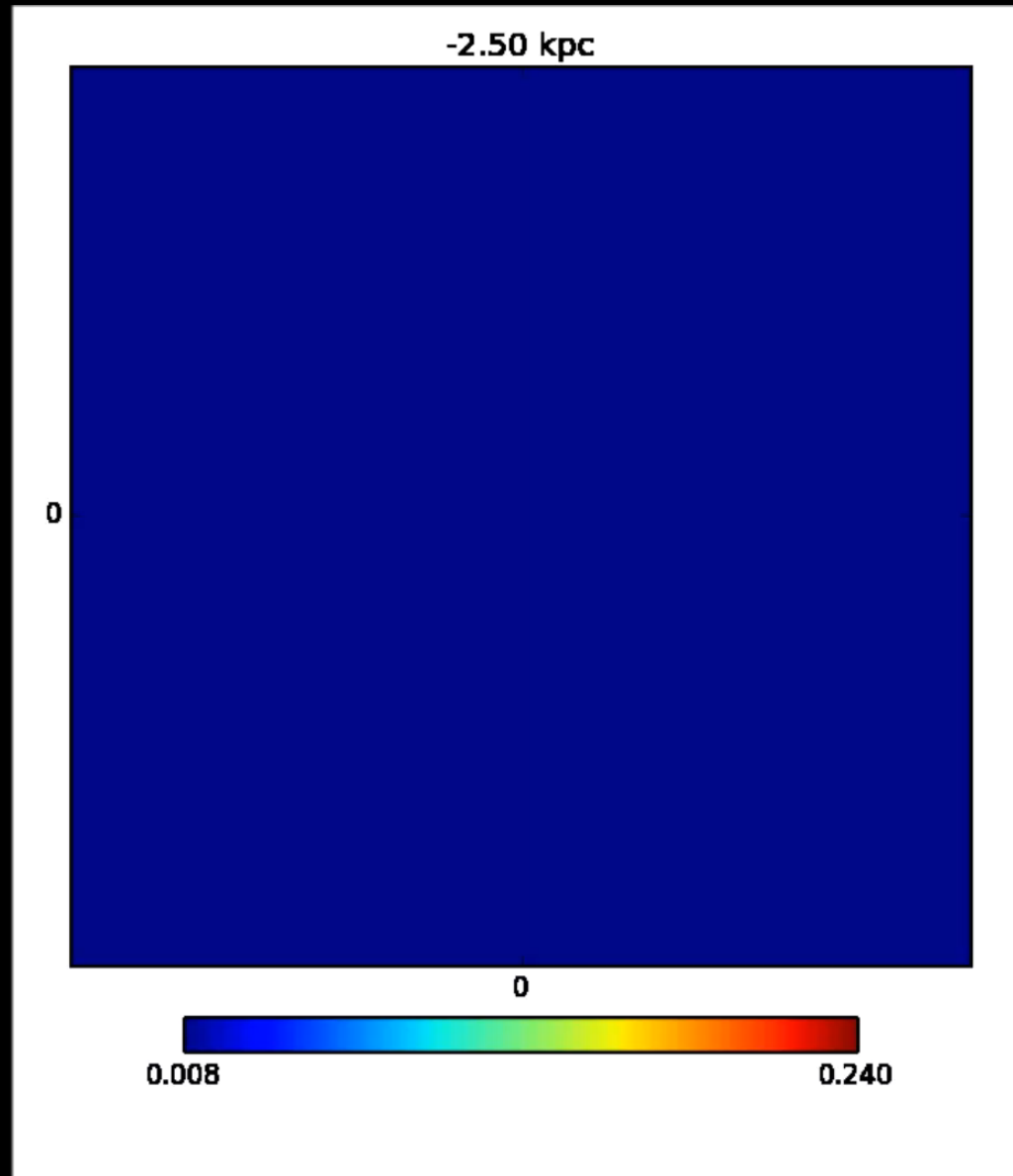
- wish for low distance uncertainties & high contrast -



# power spectrum iteration



# 3D movie





# Conclusions

## data to images

knowledge about measurement process +  
prior information (e.g. correlation structure)  
→ map (most likely image)

## X-Ray tomography

Wiener filter only slightly better than filtered backprojection  
log-normal critical filter better

## tomography of free electron density

tomography: line-integrals to image  
pulsar radiation → line-integrals through  $n_e$

## SKA

$10^4$  lines of sight  
tomography of  $n_e$  promising