

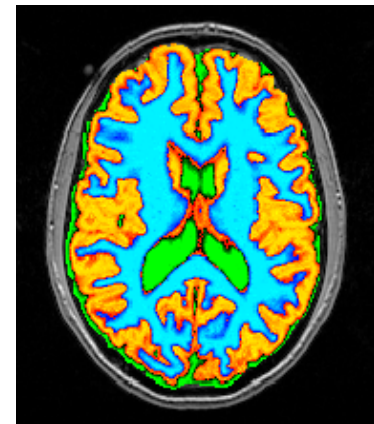


FAST

FMRI's Automated Segmentation Tool

generic tissue-type segmentation and bias field correction

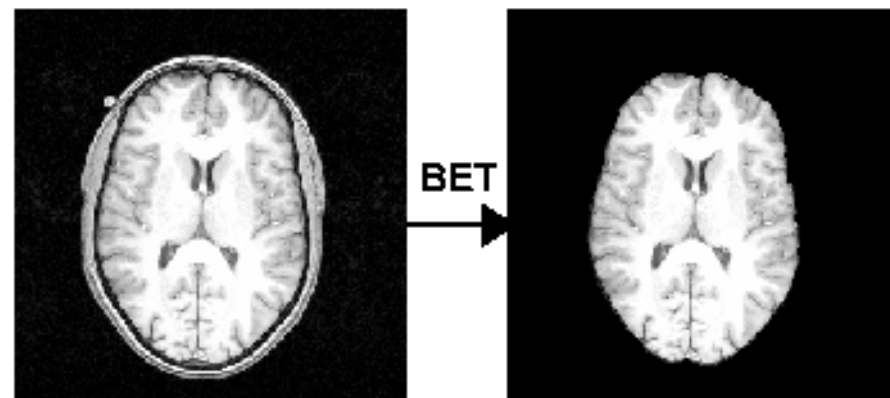
- Input: brain-extracted image(s)
- Segments into different tissue types
- At the same time, estimate bias field
- Robust to noise, because each voxel looks at neighbours



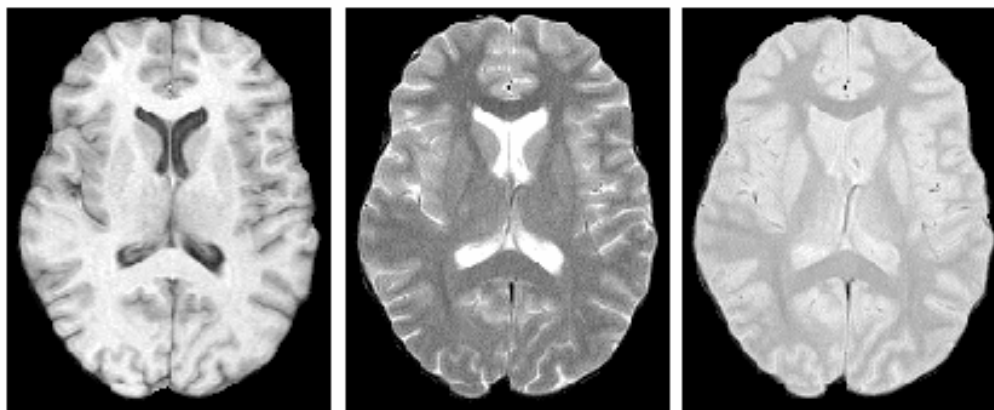


FAST: Input

- First use BET to remove non-brain
All *volumetric* results are *highly sensitive* to errors here.
For *bias-field correction alone* the errors do not matter that much



- Input is normally a single image (T1, T2, proton-density....)
- Or several inputs (“multichannel”)
- For multi-channel, all must be pre-aligned (FLIRT)

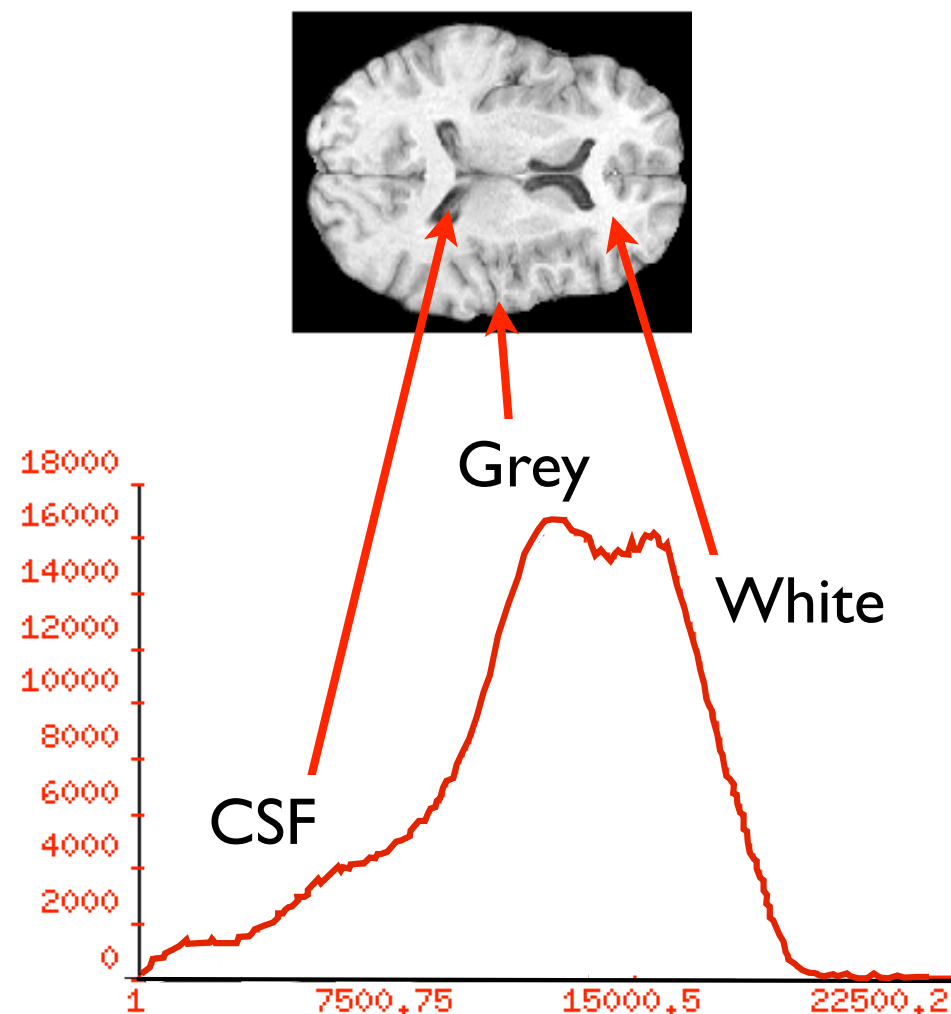




Intensity Model

tissue intensity distributions

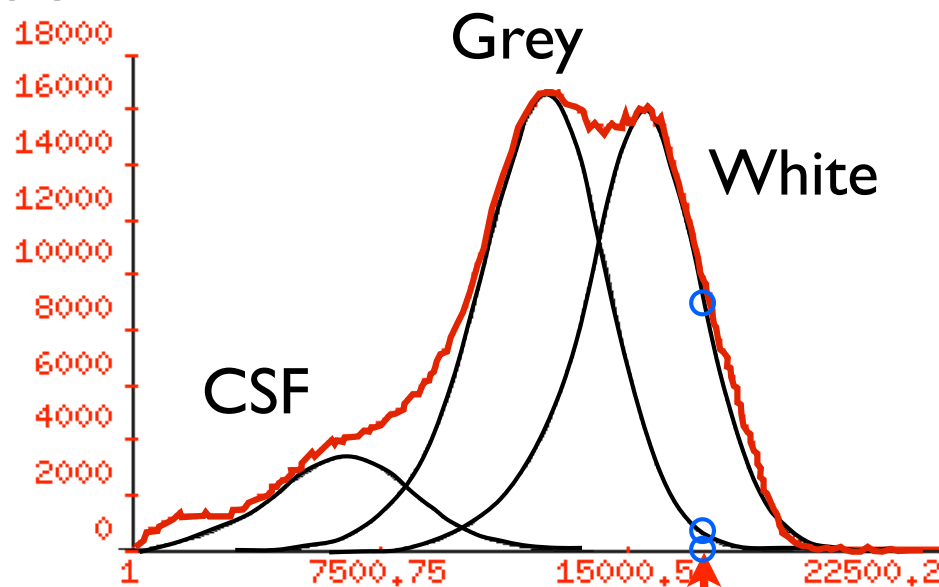
- Histogram = voxel count vs. intensity
- Model = mixture of Gaussians
- If well separated, have clear peaks; then **segmentation** easy
- Overlap worsened by:
 - Bias field
 - Blurring
 - Low resolution
 - Head motion
 - Noise





Probability Model

- Histogram = probability distribution function
- Model = mixture of Gaussians
- Probability determined for each tissue class



For example:

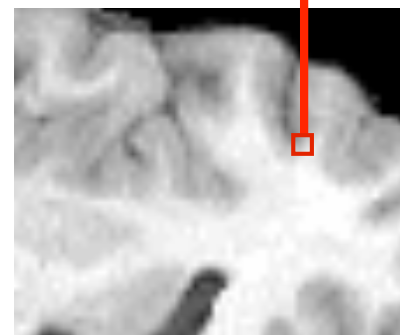
Voxel near WM/GM border

$P(\text{CSF})$ near zero

$P(\text{GM})$ low

$P(\text{WM})$ moderate

Intensity = 17203

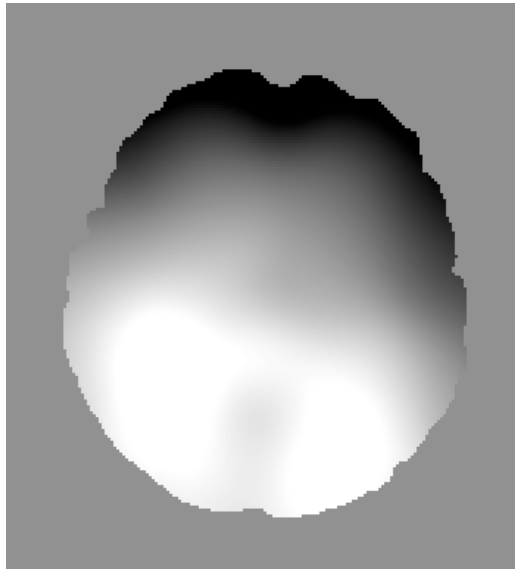




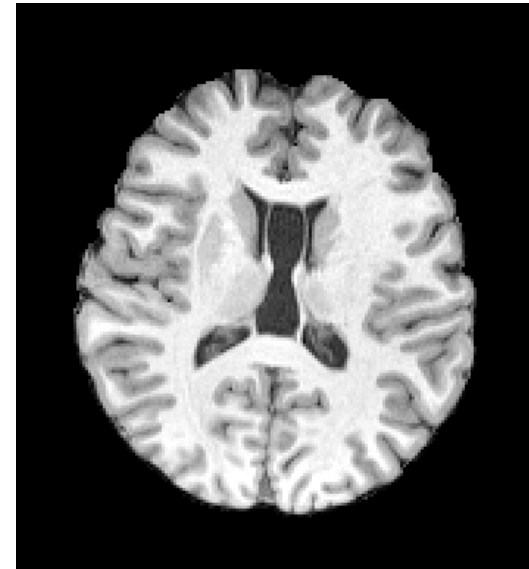
Bias Field Correction



Original



Bias



Restored

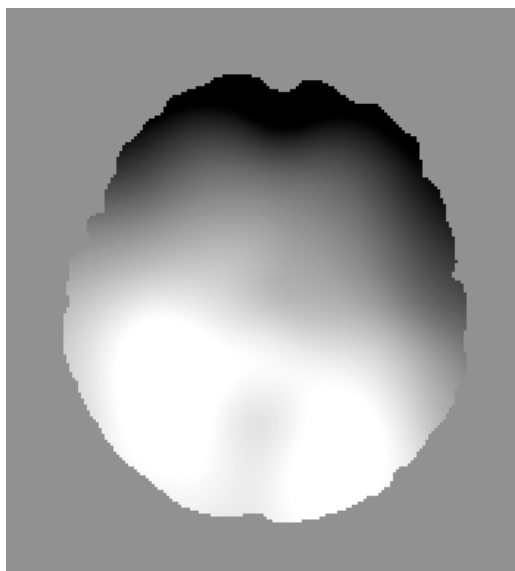
- MRI RF (radio-frequency field) inhomogeneity causes intensity variations across space
- Causes problems for segmentation
- Need to remove bias field before or during segmentation
- Becomes more common and problematic at high field



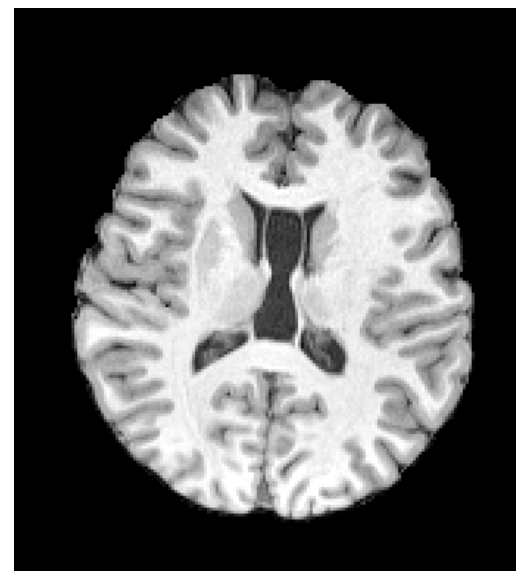
Bias Field Correction



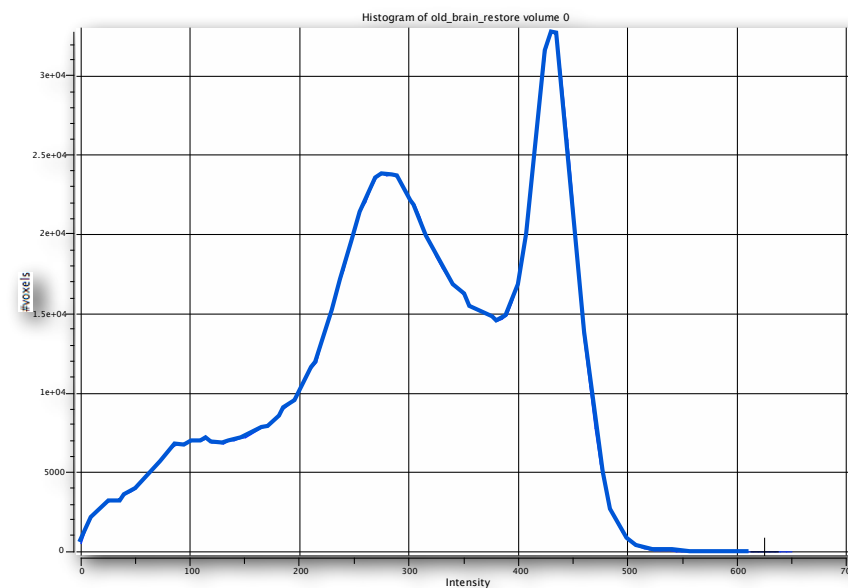
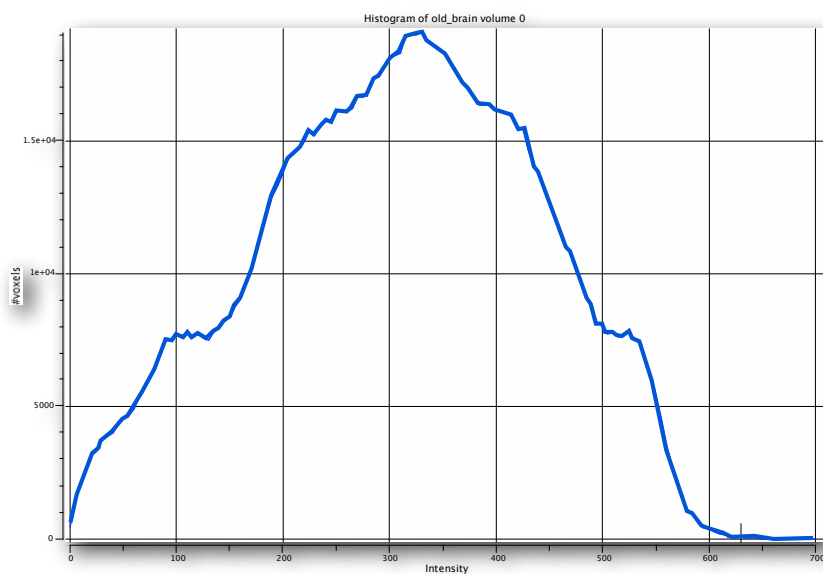
Original



Bias



Restored

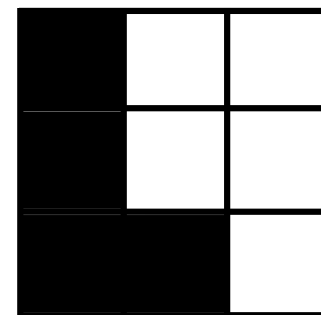


Histograms

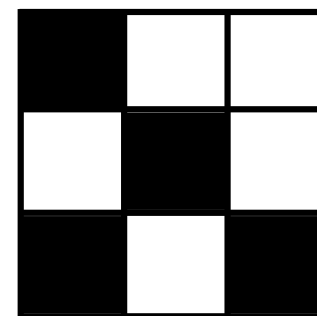


Use Spatial Neighbourhood Information (MRF)

- Neighbourhood information: “if my neighbours are grey matter then I probably am too”
- Simple classifiers (like K-means) do not use spatial neighbourhood information
- More robust to noise
- Need the right balance between believing neighbours or intensity



Likely configuration
High probability



Unlikely configuration
Low probability



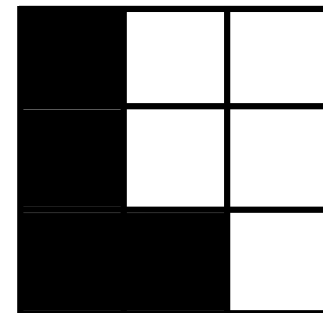
Use Spatial Neighbourhood Information (MRF)

Combine with probability based on Gaussian Mixture Model:

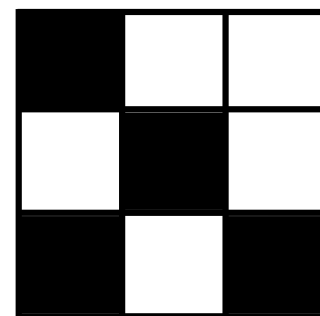
$$\text{Final log probability} = \log p(\text{intensity}) + \beta \log p(\text{MRF})$$

Final result depends on β value

This is user-adjustable



Likely configuration
High probability

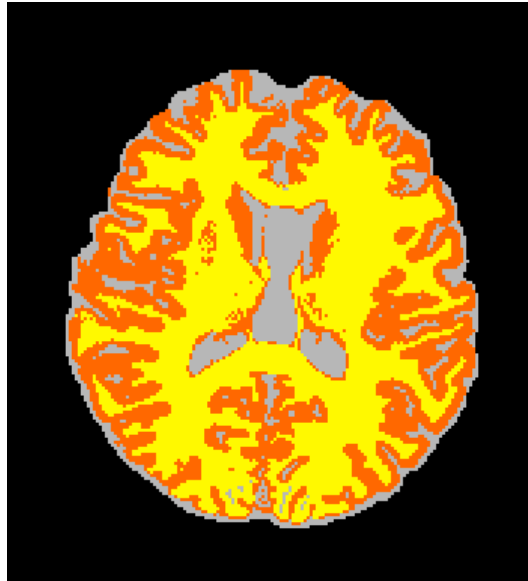


Unlikely configuration
Low probability

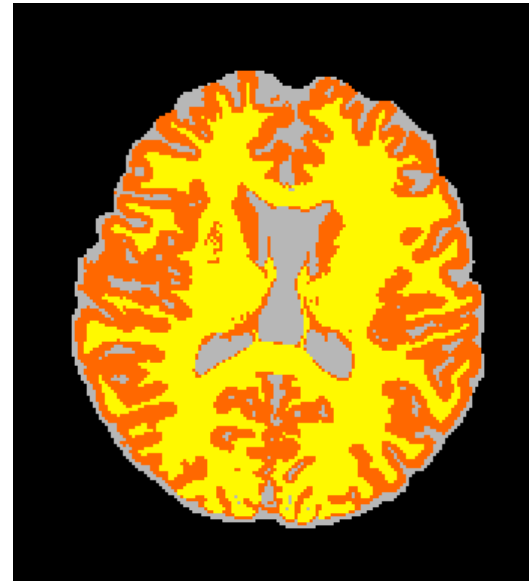


Effect of MRF Weighting

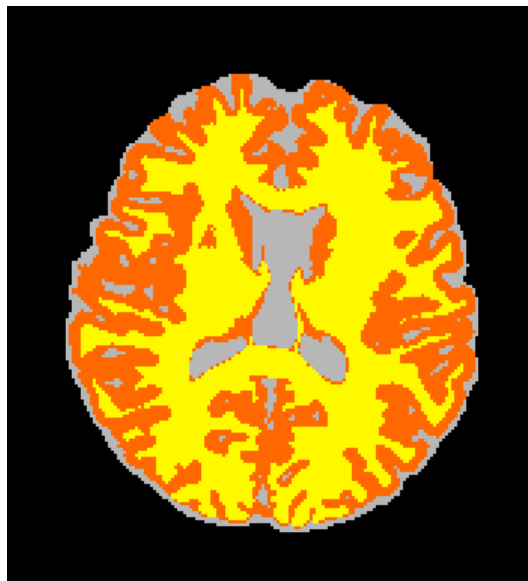
$\beta=0$



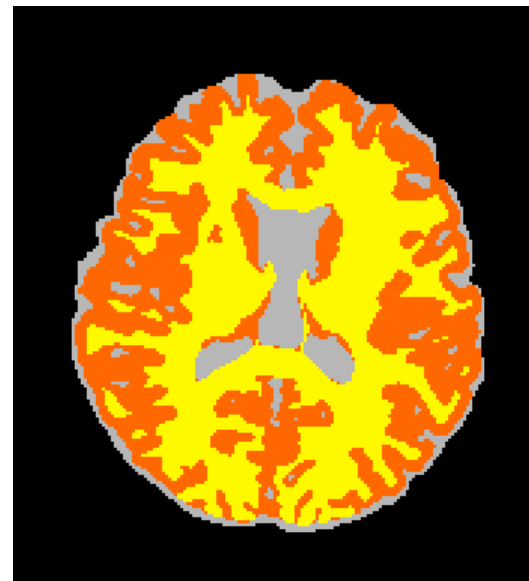
$\beta=0.1$



$\beta=0.3$



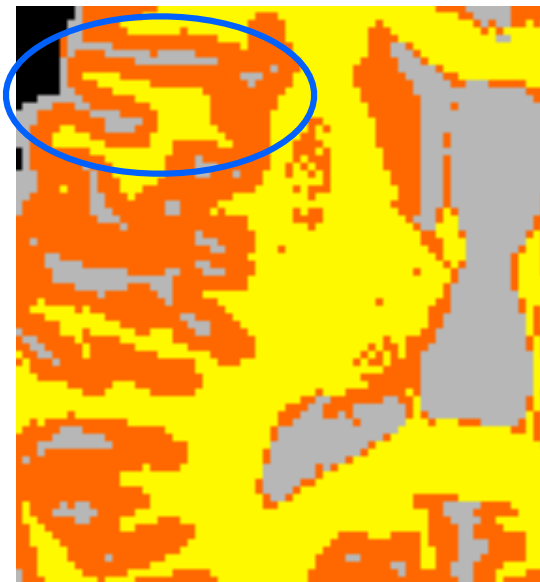
$\beta=0.5$





Effect of MRF Weighting

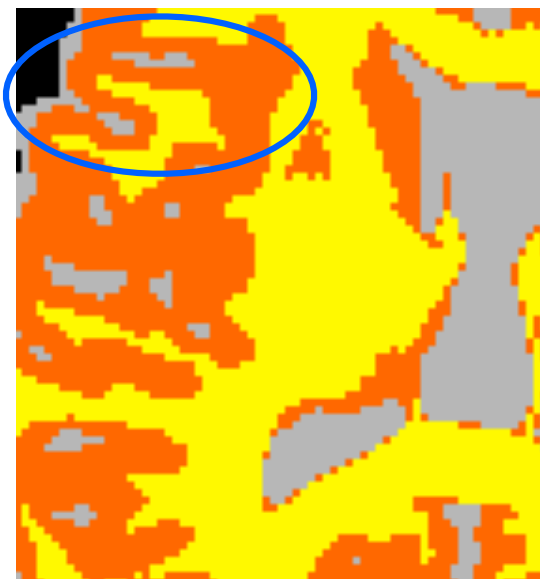
$\beta=0$



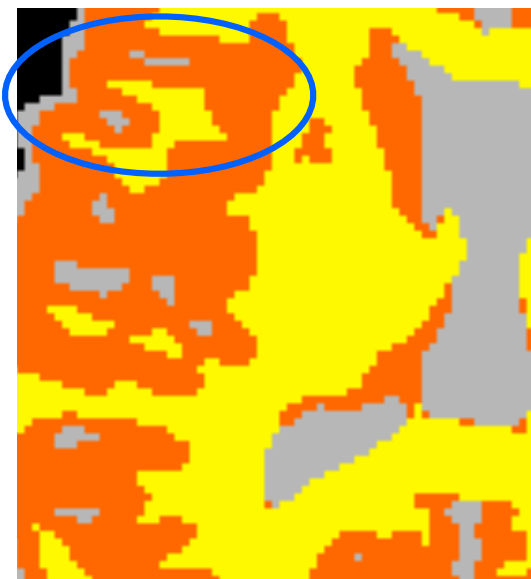
$\beta=0.1$



$\beta=0.3$



$\beta=0.5$

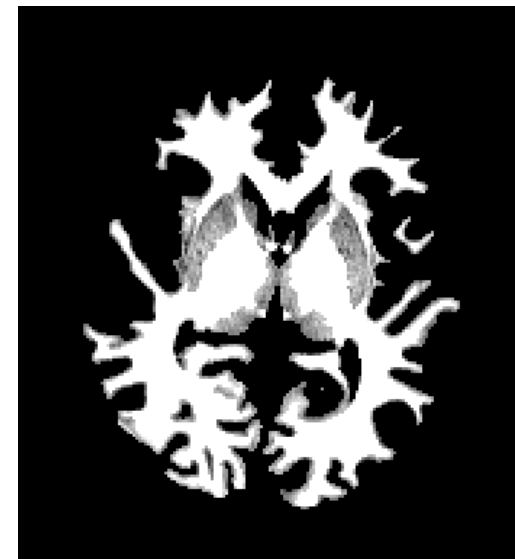
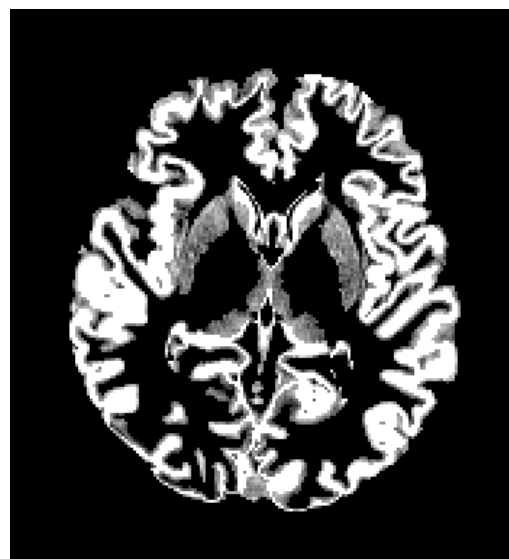
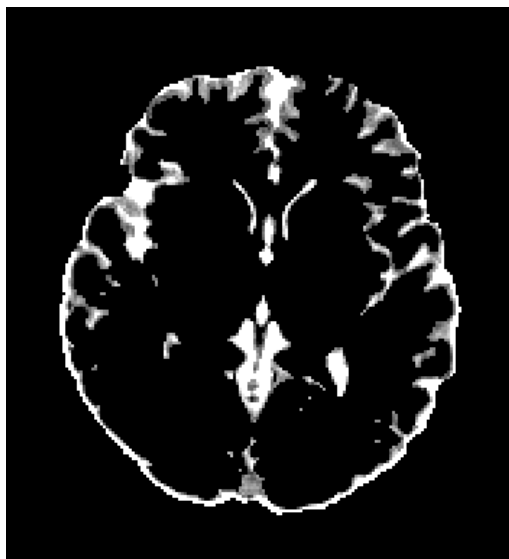




Partial Volume Modelling

- A better model is what fraction of each voxel is tissue X?
- “partial volume” = fraction of CSF, GM or WM

PVE
CSF, GM, WM



Image



“Hard”
Segmentation



PVE (GM)

- This substantially improves accuracy of volume estimation



FAST - The Overview

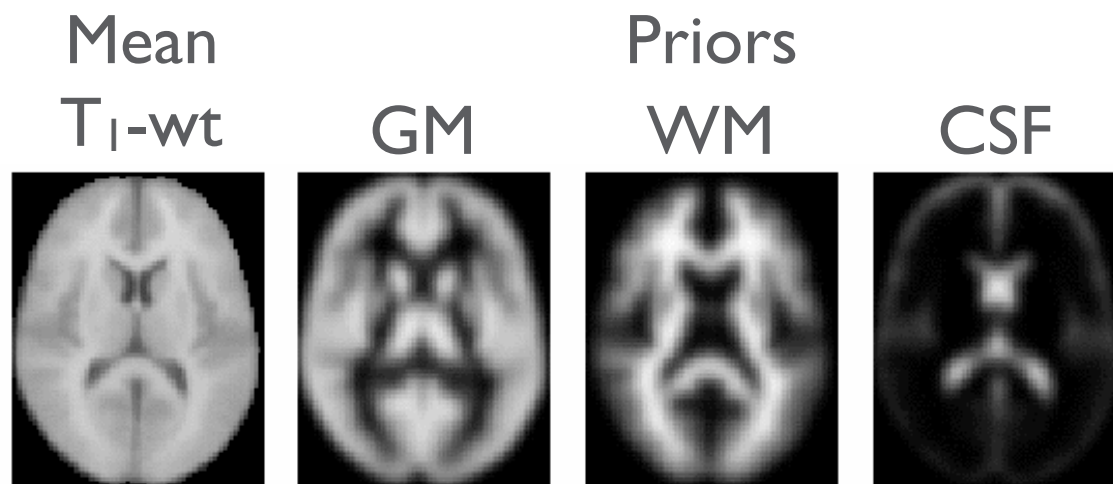
- Initial (approximate) segmentation
 - Tree-K-means
- Iterate
 - Estimate bias field
 - Estimation segmentation; iterate
 - Update segmentation (intensity + MRF)
 - Update tissue class parameters (mean and standard deviation)
- Apply partial volume model
 - MRF on mixel-type (how many tissues)
 - PV Estimation





Optional Use of Priors (tissue probability maps)

- Segmentation priors = average of many subjects' segmentations
- Can use priors to weight segmentation, but can skew results (e.g. due to misalignment)
- FAST does not use priors by default
- If bias field is very bad, priors can be turned on to help initial segmentation (alternatively, do more iterations)
- Can also be turned on to feed into final segmentation (e.g. to aid segmentation of deep grey but see FIRST)





Other Options

FAST:

- **Bias field smoothing (-l)**
 - vary spatial smoothing of the bias field
- **MRF beta (-H)**
 - vary spatial smoothness of the segmentation
- **Iterations (-I)**
 - vary number of main loop iterations

fsl_anat:

- This is a new, alternative tool that performs brain extraction and bias field correction (along with other things) in a different way and so is worth trying out too



FAST

FMRIB's Automated Segmentation Tool

Summary

- Typically use a single T1-weighted image
- Multichannel is an option
- Segments into three main tissue-types:
 - Grey Matter, White Matter and CSF
- Models and corrects for bias field
 - **Can be used just for bias field correction**
- Combines intensity and neighbourhood information
- Partial Volumes Estimates (PVE) are most useful and more accurate for volume calculations
- Can use priors, but can cause bias, so not the default
- Have several adjustable parameters to optimise output