

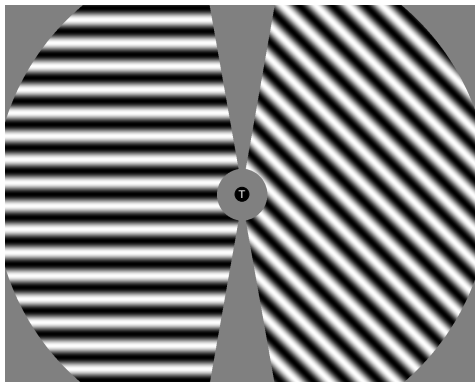
# Orientation Decoding at multiple resolutions at 7T

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Magdeburg

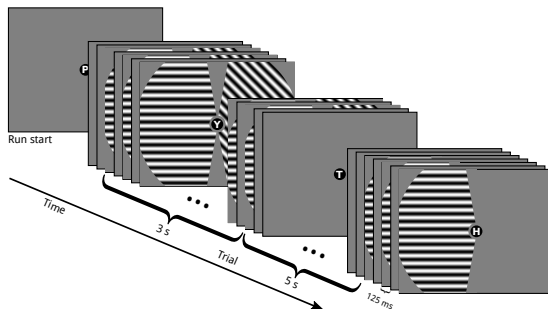
November 12, 2015

# Orientation Decoding in primary visual cortex (V1)



- ▶ Most extensively studied paradigm.
- ▶ Important studies like Kamitani and Tong (2005), Haynes and Rees (2005), Swisher et al., (2010), Alink et al., (2013) etc.

# Stimulus

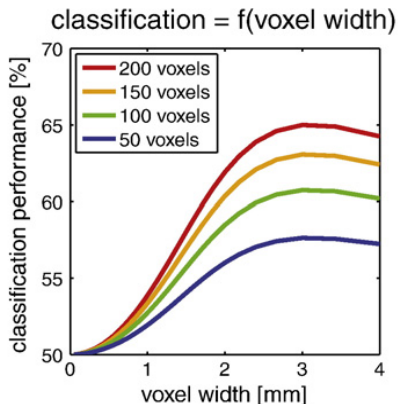


- ▶ 30 Trials = 1 Experimental run
- ▶ Number of runs = 10
- ▶ Total scan time = 40min
- ▶ 4 orientations in each hemifield ( $0^\circ$ ,  $45^\circ$ ,  $90^\circ$  &  $135^\circ$ ) with random phase shifts

# General Workflow of Orientation decoding analysis

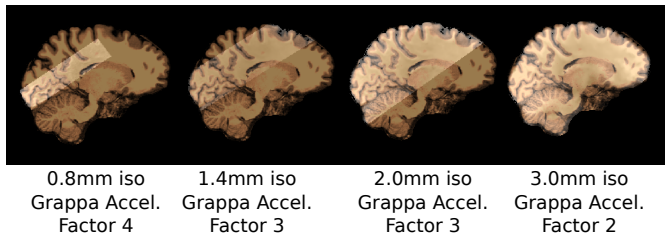
- ▶ EPI acquisition in one particular resolution
- ▶ Volumetric Gaussian filtering with increase in kernel width (expressed in FWHM)
- ▶ Within-subject leave-one-run-out cross-validation with LinearSVM classifier
- ▶ Conclusion about the spatial scale of the Orientation specific signals

# Simulation Study by Chaimow et al., 2010



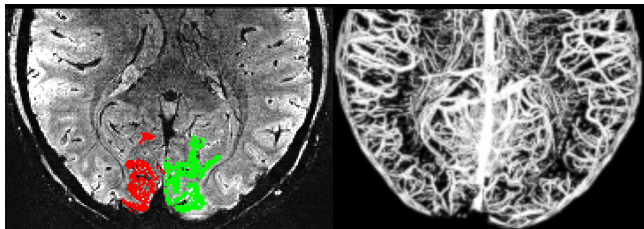
- Chaimow et al., 2010 simulated fMRI data to model decoding of ODCs at different acquisition resolutions.

# Empirical Study (*under review*)



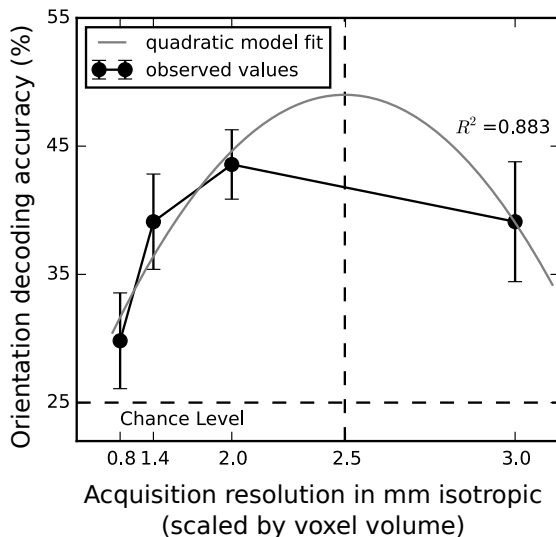
- ▶ Siemens 7 Tesla scanner with 32 channel head coil (Nova Medical, Wilmington, MA)
- ▶ T2\*-weighted echo planar images (EPI) ( $TR/TE=2000/22$  ms,  $FA=90^\circ$ )
- ▶ Sequential acquisitions with 10% inter-slice gap parallel to calcarine sulcus (on a tilted axial plane)

# Region of interest localization



- ▶ Retinotopic mapping to delineate V1 region.
- ▶ Susceptibility weighted imaging to localize veins.

# Classification Results (V1)

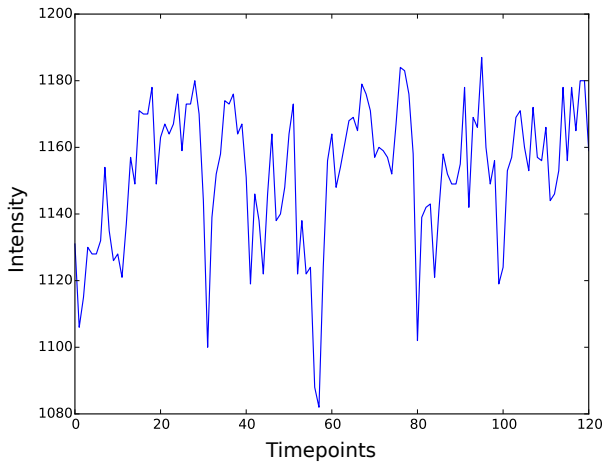




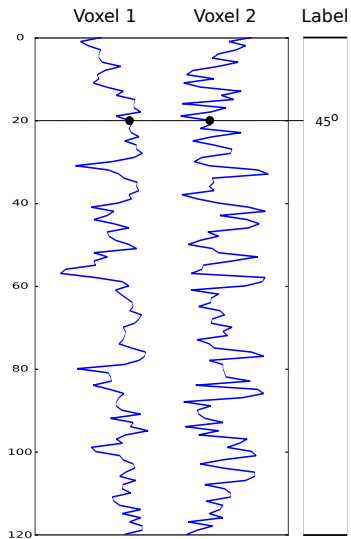
# Classification / Orientation Decoding / MVPA

## How was it performed ?

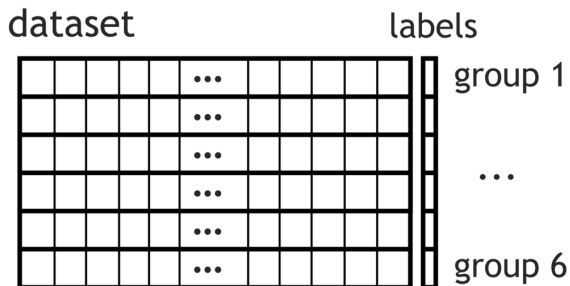
# Voxel Timeseries



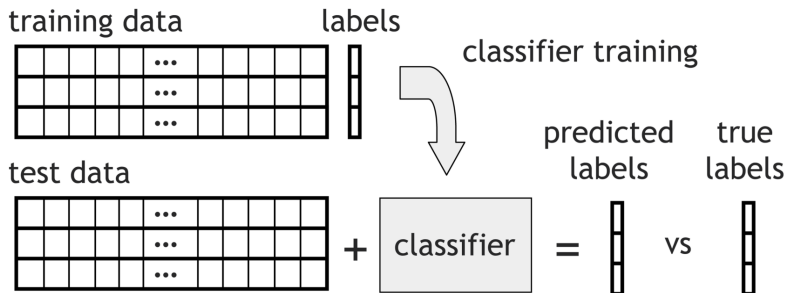
# Voxel Timeseries to MVPA dataset



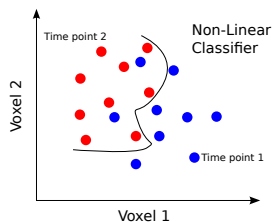
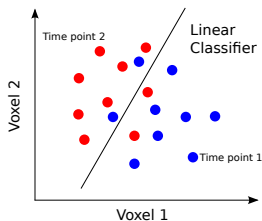
# MVPA dataset



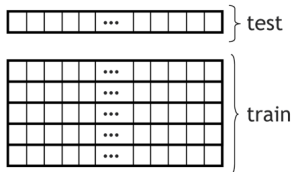
# Classification Procedure



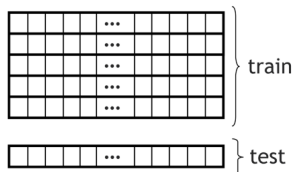
# Cross Validation



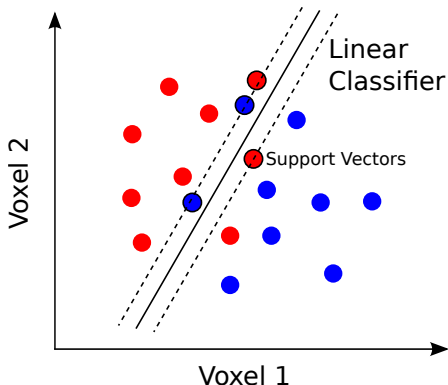
cross-validation fold 1



cross-validation fold 6

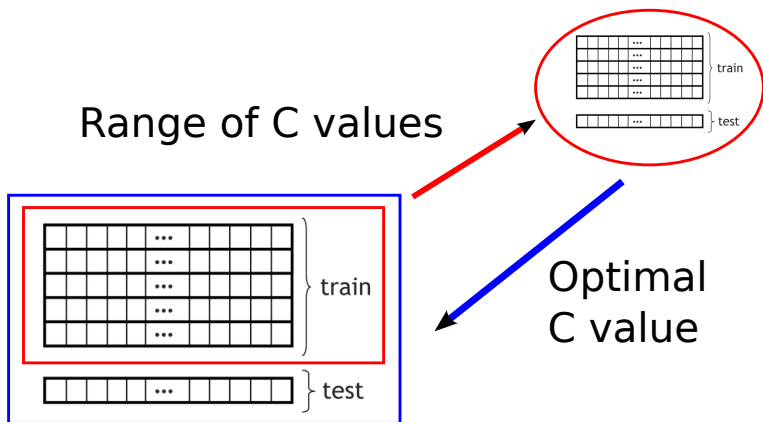


## C parameter in LinearCSVM



- ▶ C parameter - Trade-off parameter between margin width and number of support vectors.
- ▶ Higher C more rigid margin SVM.

# Nested Cross Validation

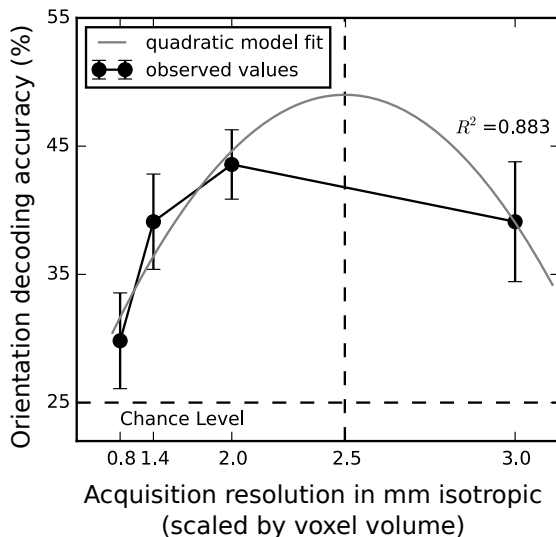




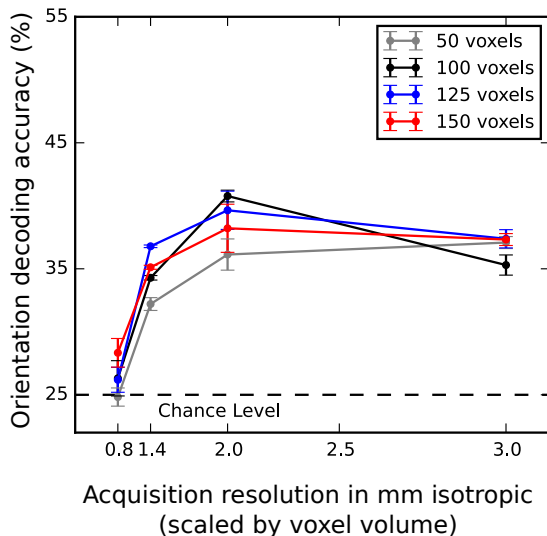
# Confusion Matrix

		Targets			
		0°	45°	90°	135°
Predictions	135°	2	2	0	5
	90°	0	4	0	0
	45°	3	4	5	3
	0°	5	0	5	2

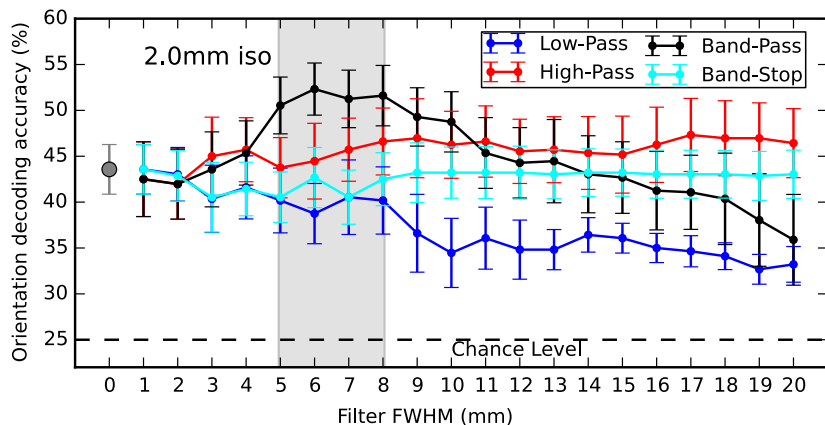
# Classification Results (V1)



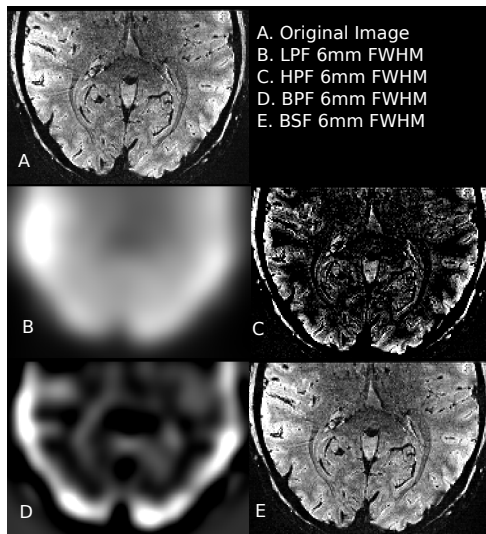
# Classification Results (Fixed Number of Voxels)



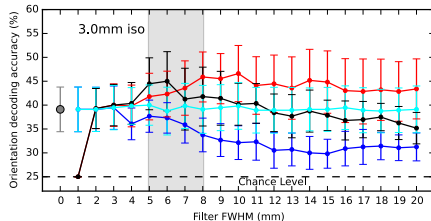
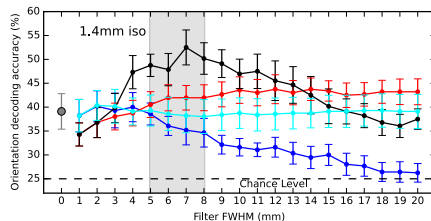
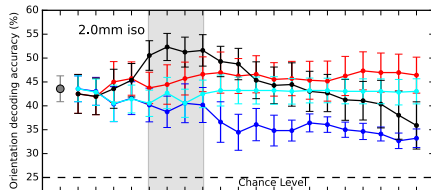
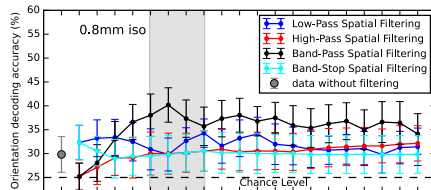
# Classification Results after Spatial Filtering



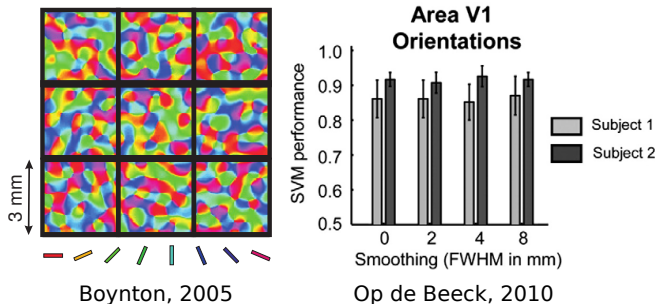
# Classification Results after Spatial Filtering



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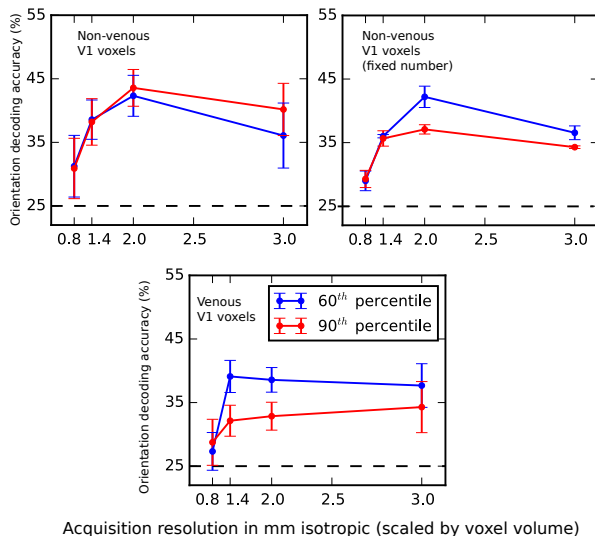


# Spatial smoothing does not hurt Orientation decoding



- ▶ Reliable Orientation decoding is possible with 3mm iso voxel size. (Kamitani and Tong, 2005 and Haynes and Rees, 2005)
- ▶ Above chance level decoding could be performed after spatial Gaussian smoothing.

# Contribution of veins to decoding





# Conclusions

- ▶ Optimal Acquisition Resolution is  $\approx 2.5\text{mm}$  iso.
- ▶ Aliasing is improbable. Highest accuracy of band-pass components  $\approx 5\text{-}8\text{mm}$  FWHM for all resolutions.
- ▶ Low spatial frequency components contribute to noise.
- ▶ Veins carry little orientation specific signal.

# Acknowledgements

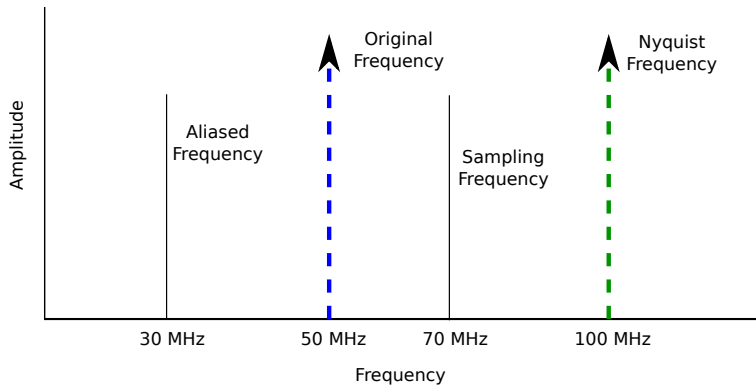
- ▶ Jun. Prof. Dr. Michael Hanke
- ▶ Renat Yakupov
- ▶ Prof. Dr. Stefan Pollmann
- ▶ Prof. Dr. Oliver Speck



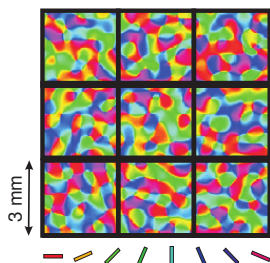
**cbbs**  
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brain sciences

# Questions

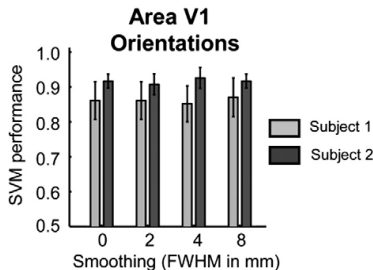
# Discussion: Nyquist Sampling Theory



# Discussion: Spatial smoothing does not hurt Orientation decoding



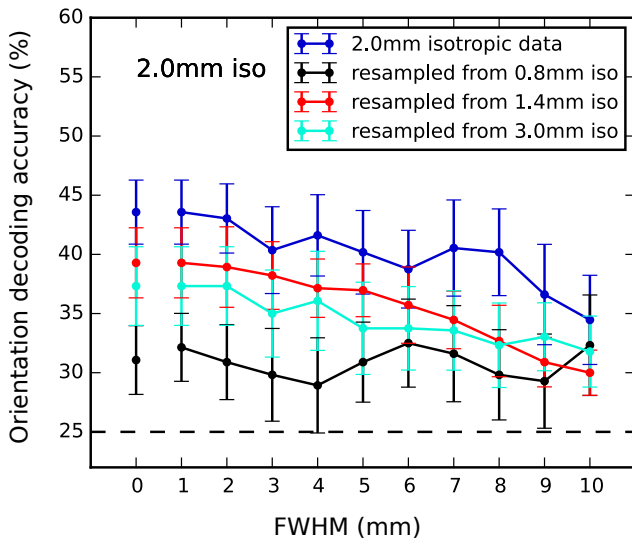
Boynton, 2005



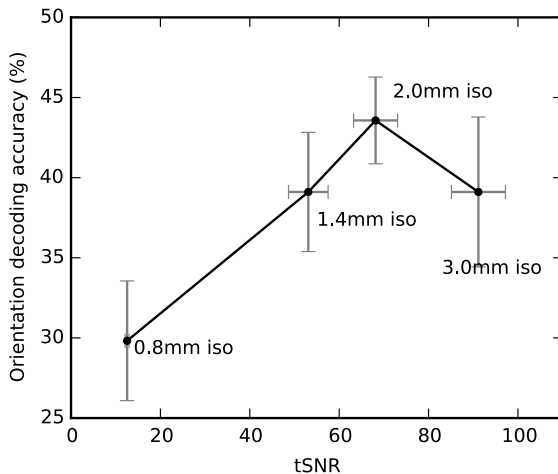
Op de Beeck, 2010

- ▶ Reliable Orientation decoding is possible with 3mm iso voxel size. (Kamitani and Tong, 2005 and Haynes and Rees, 2005)
- ▶ Above chance level decoding could be performed after spatial Gaussian smoothing.

# Discussion: Spatial Re-sampling to Other Resolutions



# Dependence on temporal SNR



# Mean Percentage BOLD signal change

