

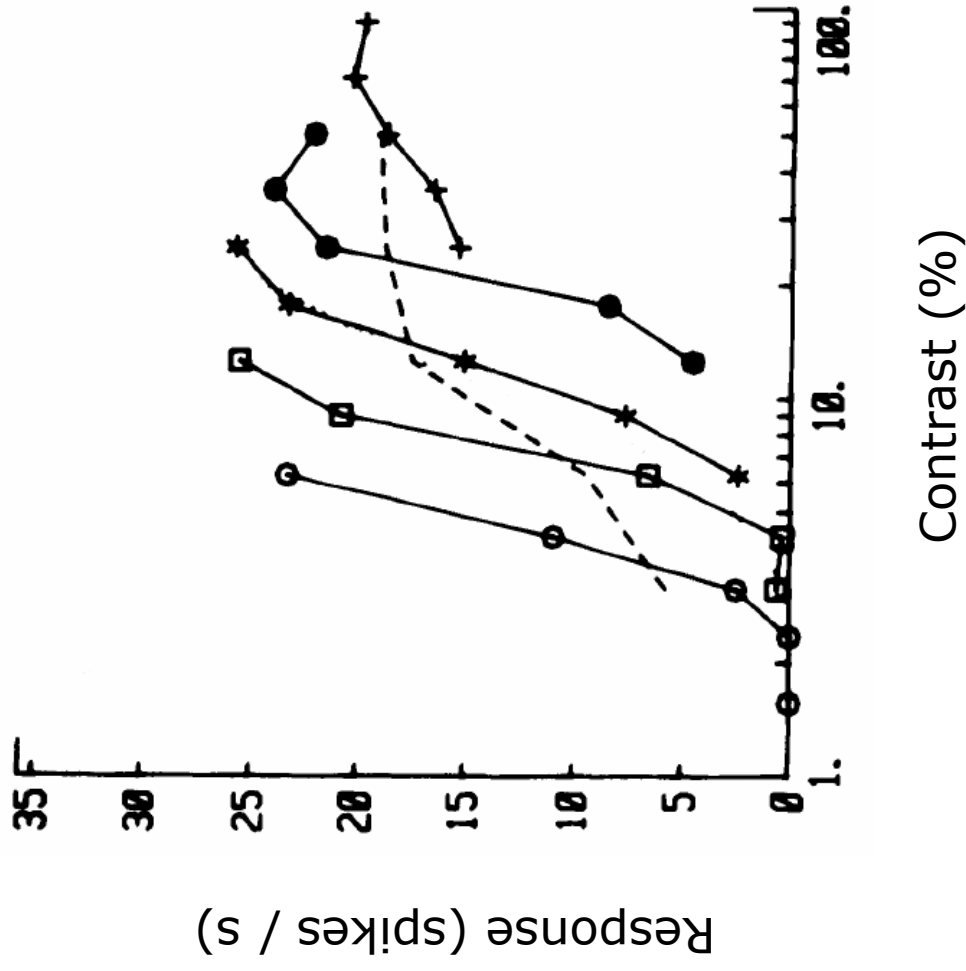
# Adaptive Coding of Motion in Macaque Visual Cortex

Nicolas Heeß & Wyeth Bair

Institute for Adaptive & Neural Computation  
School of Informatics  
University of Edinburgh

Department of Physiology, Anatomy & Genetics  
University of Oxford

# Adaptation in Sensory Systems - an Example: Cortical Contrast Gain Control

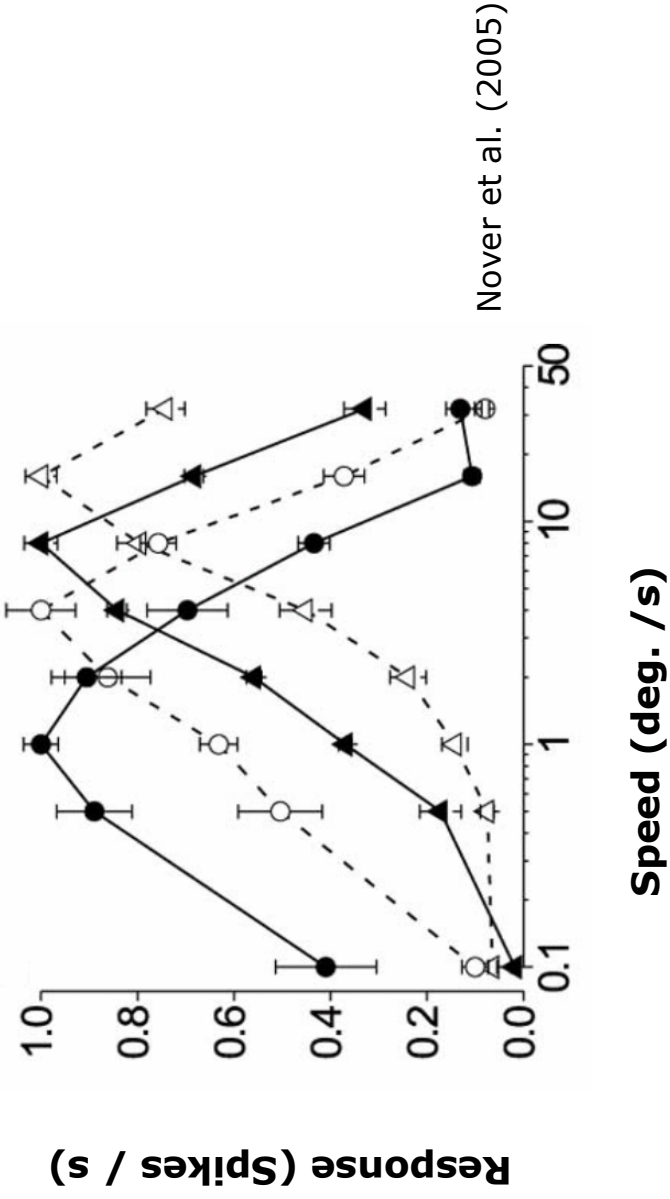


Ohzawa et al., 1985

[Recording from: V1 simple cell, anaesthetized cat]

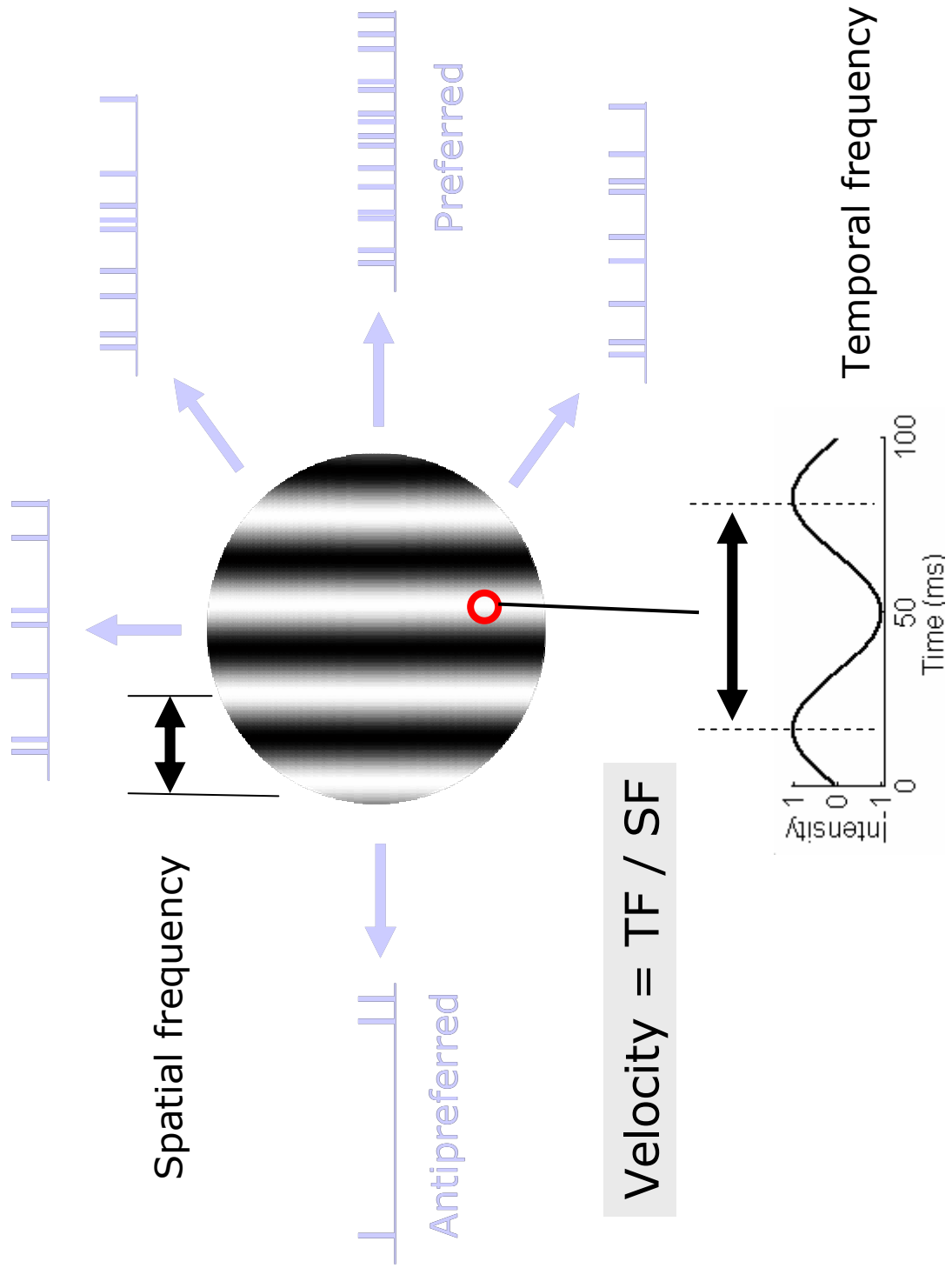
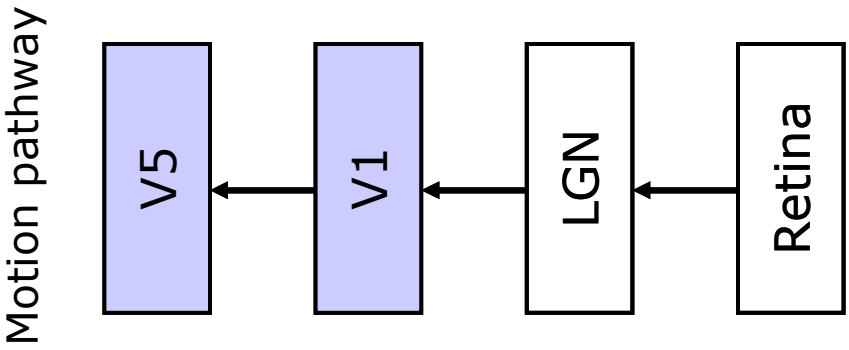
# Motion Coding in Visual Cortex

“Labeled-line” models based fixed tuning curves



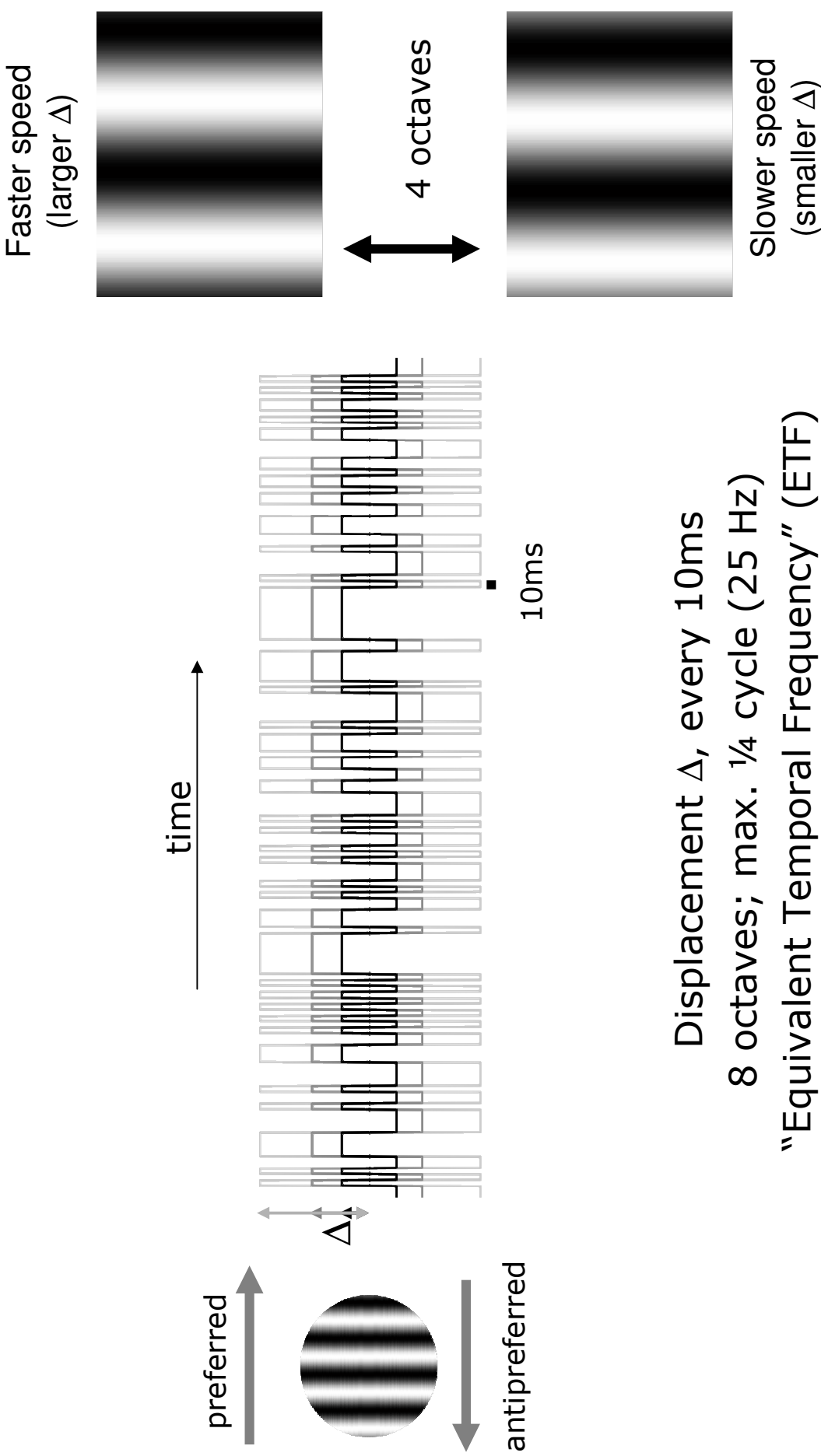
Are fixed tuning curves an appropriate representation of the motion sensitivity of direction selective cells under more variable stimulus conditions?

# Direction Selective Cells in Visual Cortex

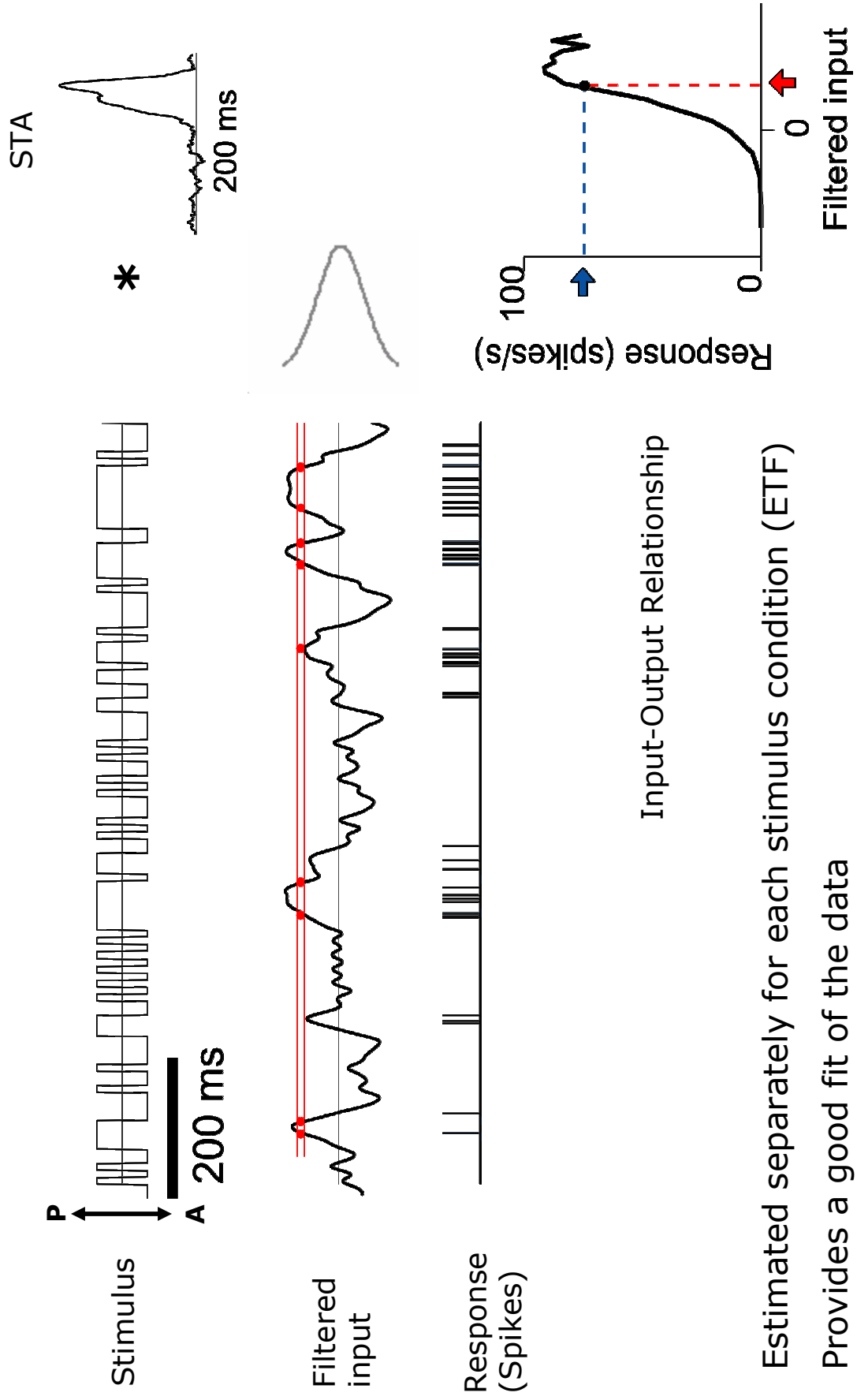


# Binary Random Motion Stimulus

[ All data recorded from DS cells in anaesthetized macaques ]

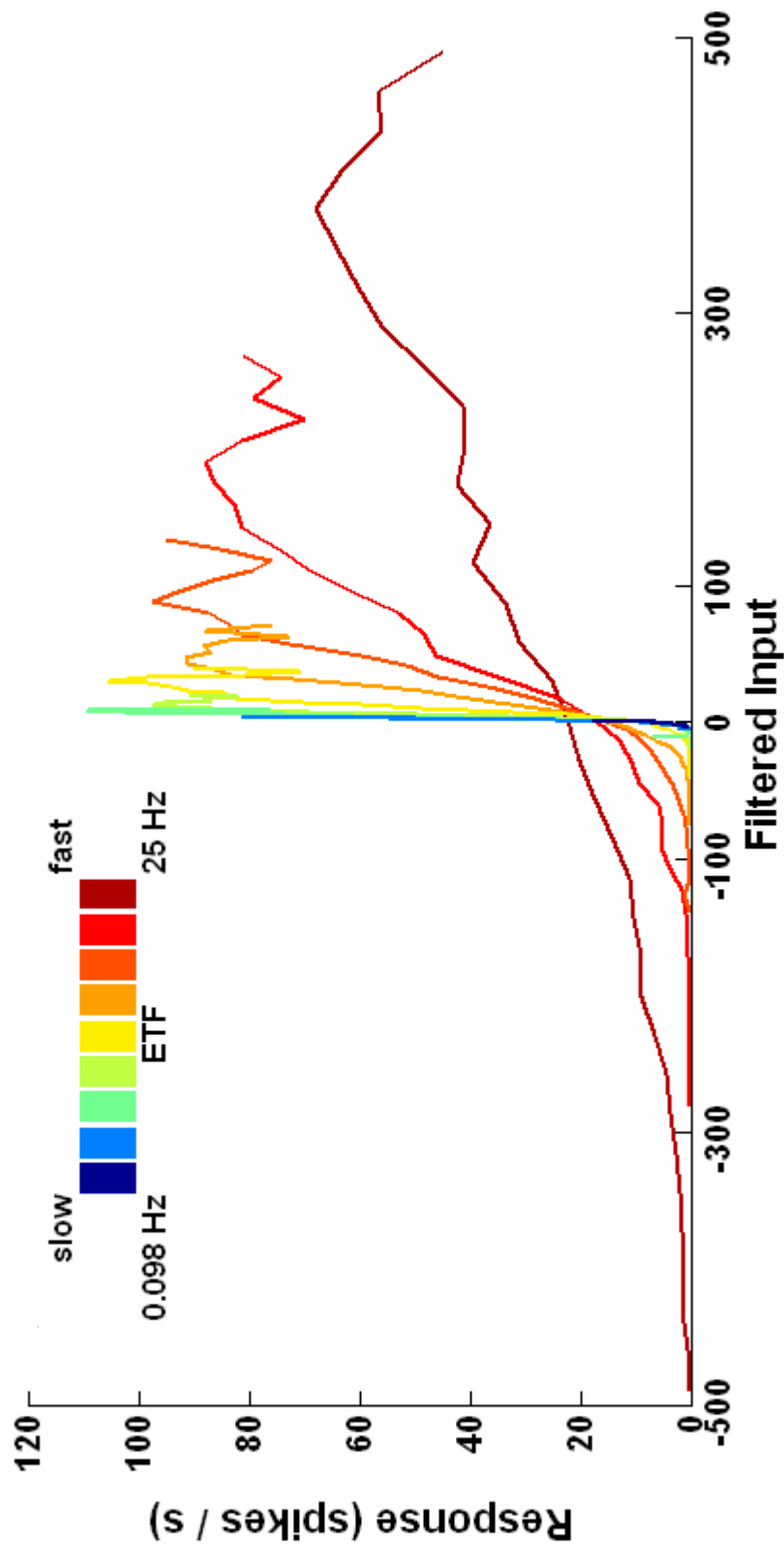


# Input-Output Relationship

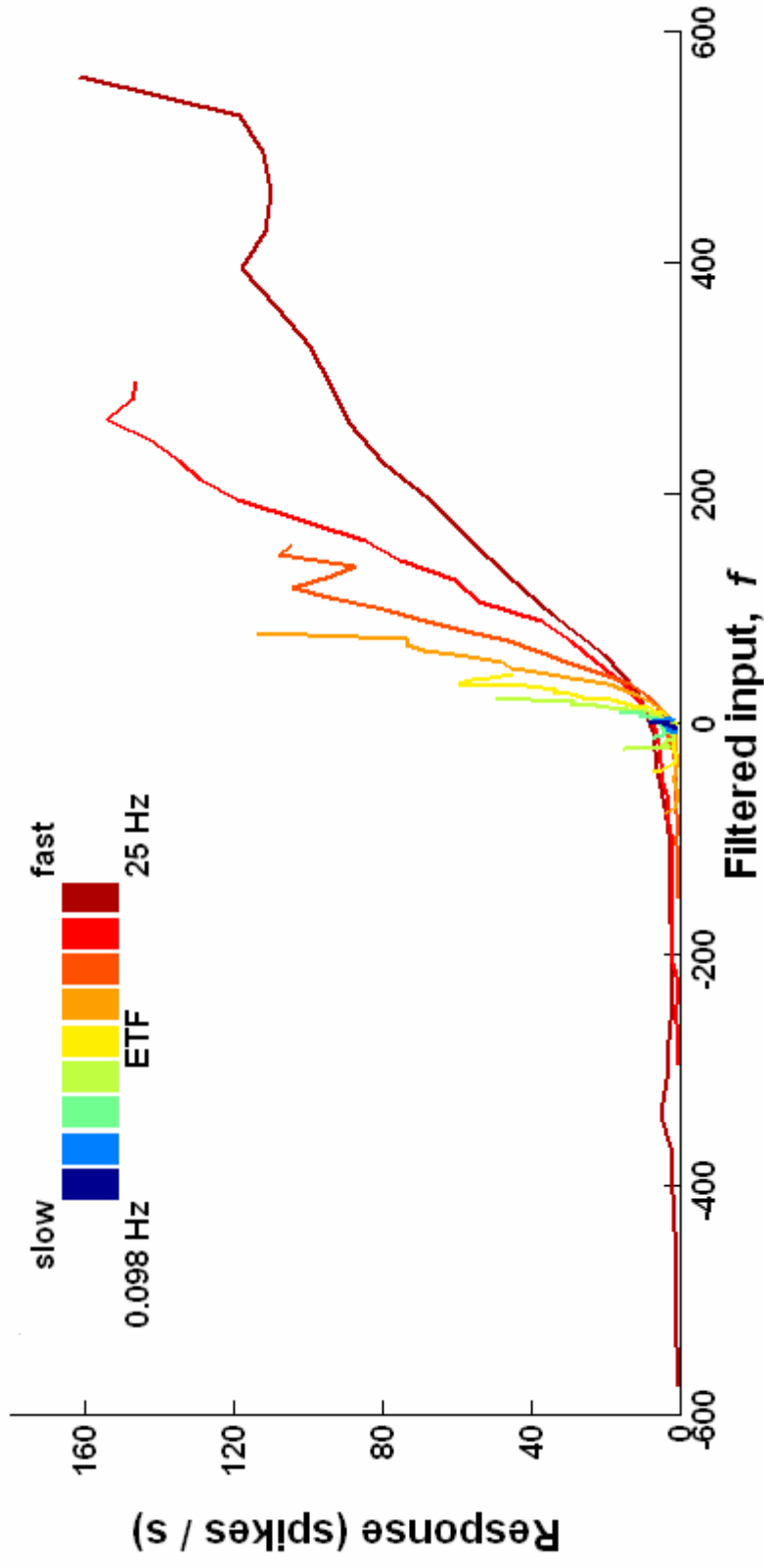


Estimated separately for each stimulus condition (ETF)  
 Provides a good fit of the data

# Example Cell (V1)

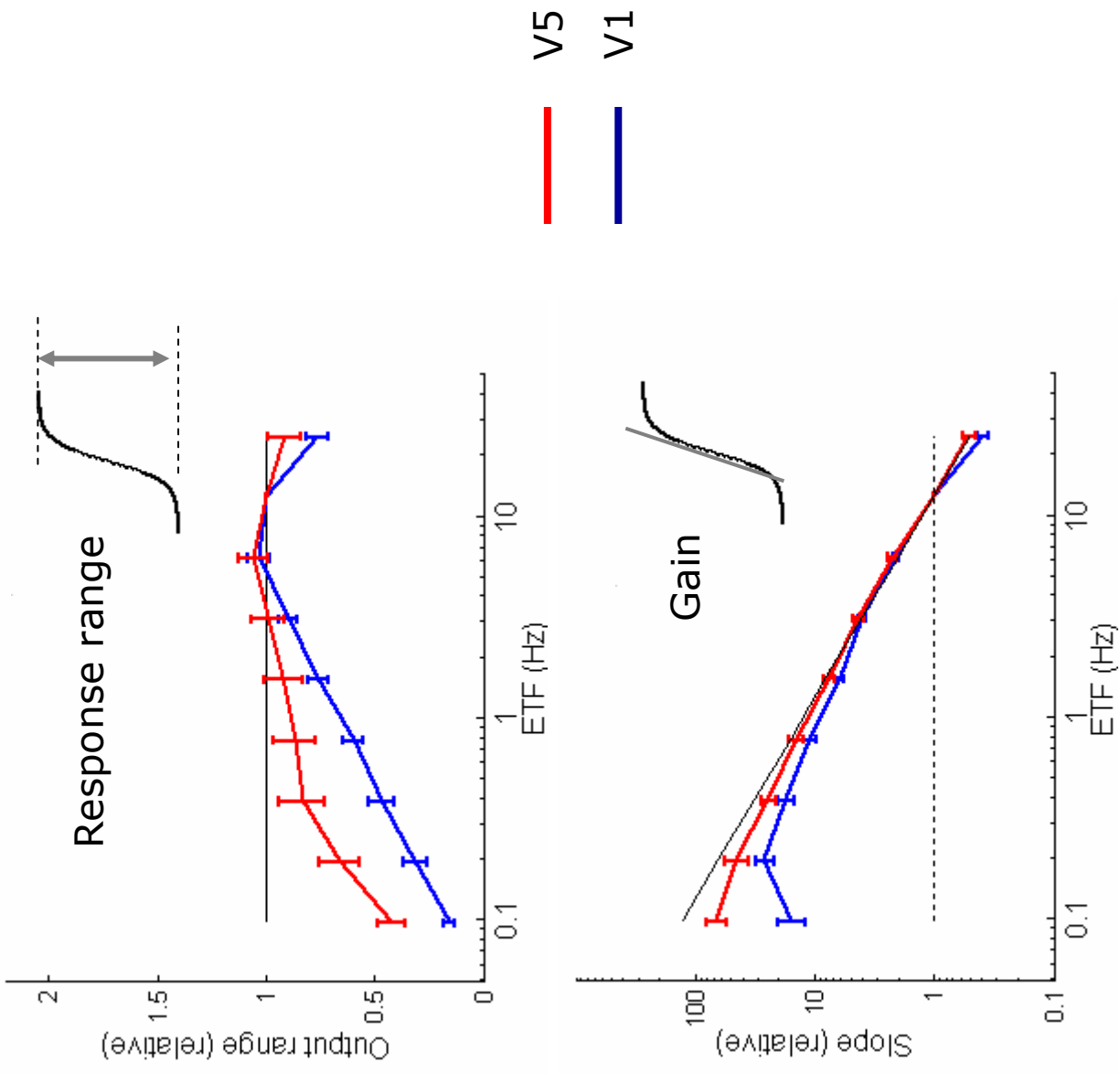


# Example Cell #2 (V1)



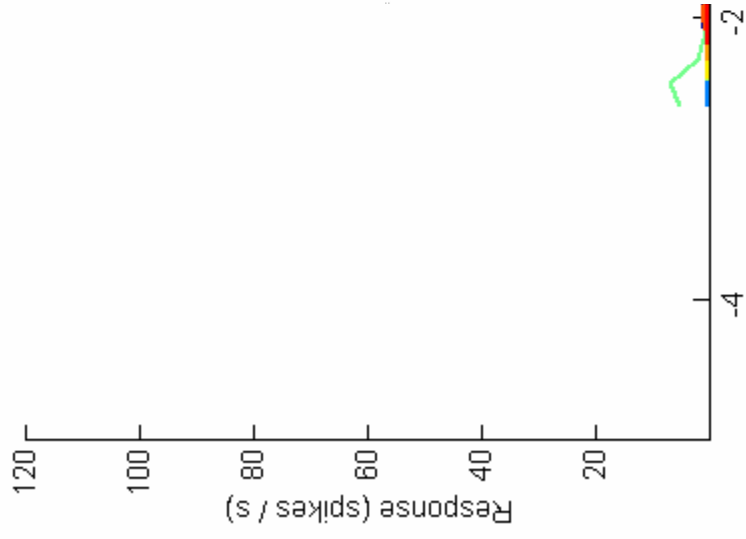


# Gain & Range Changes Across the Population

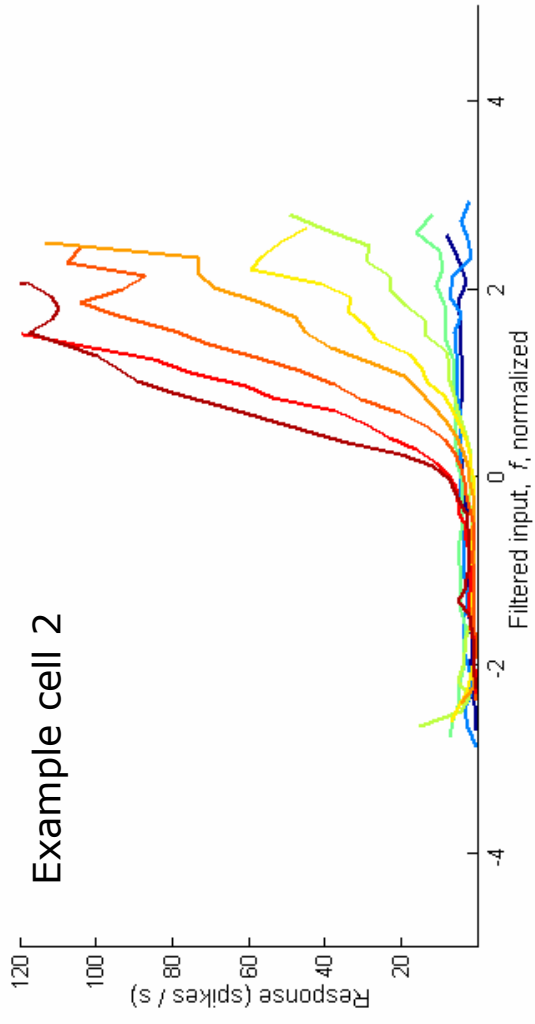


# Constant “relative sensitivity”

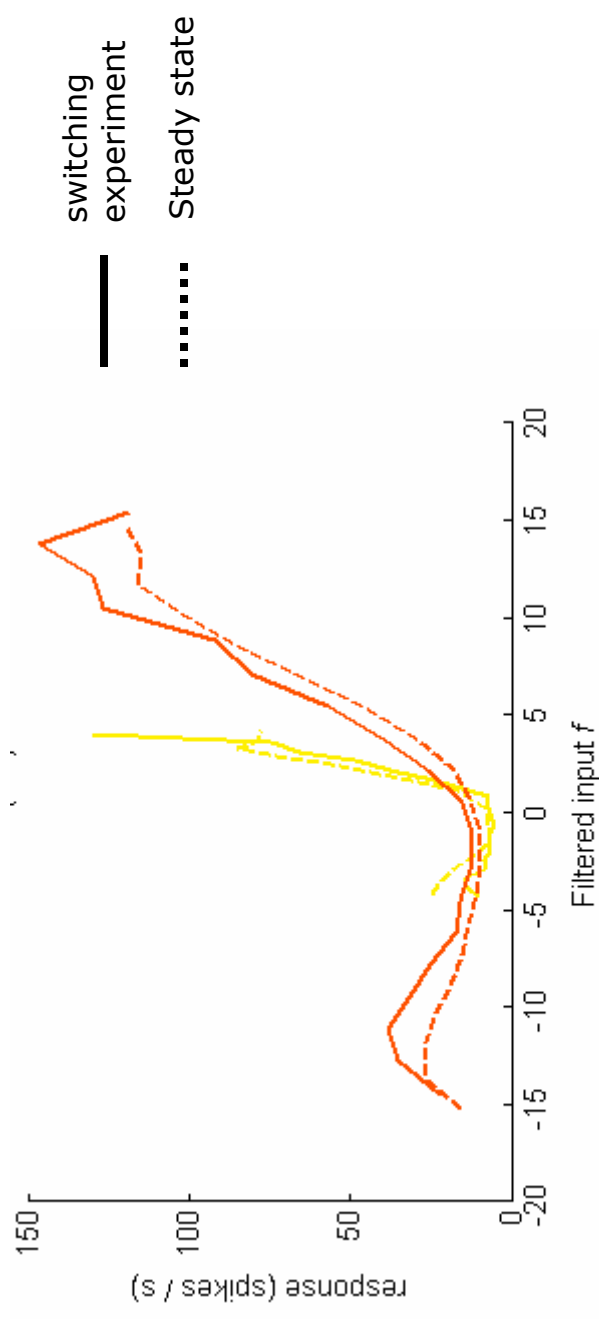
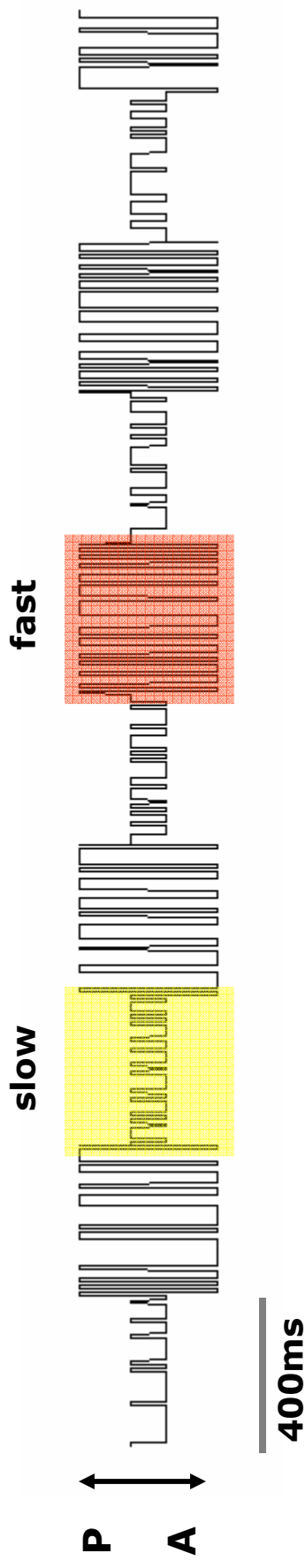
Example cell 1



Example cell 2



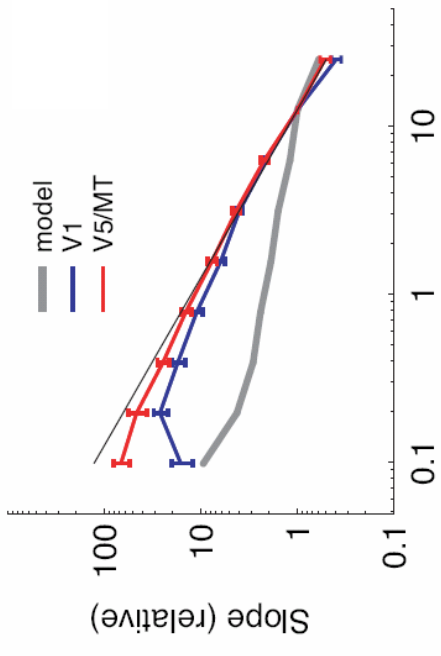
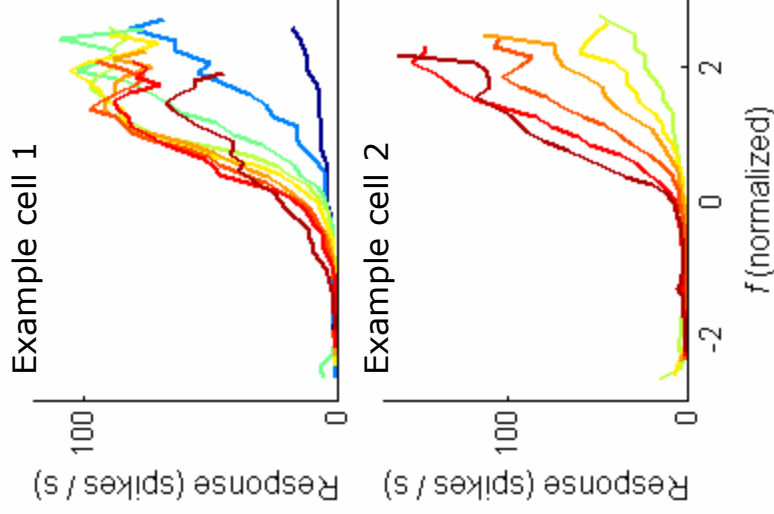
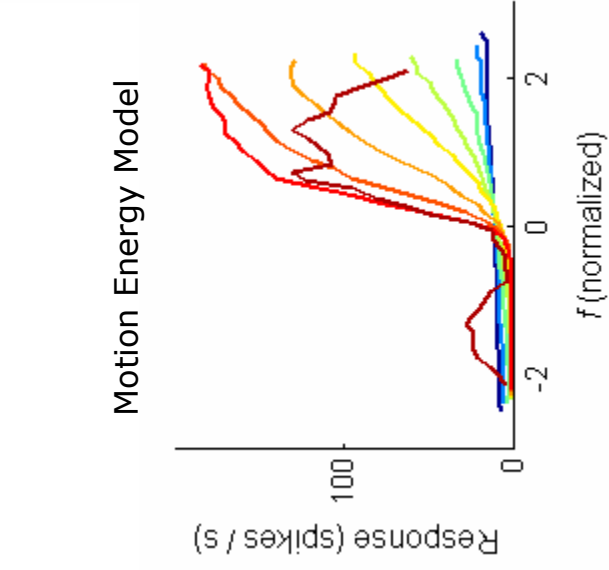
# Motion gain changes rapidly



There is also a slow component – but it is very weak in comparison

# Gain control in models of motion detection

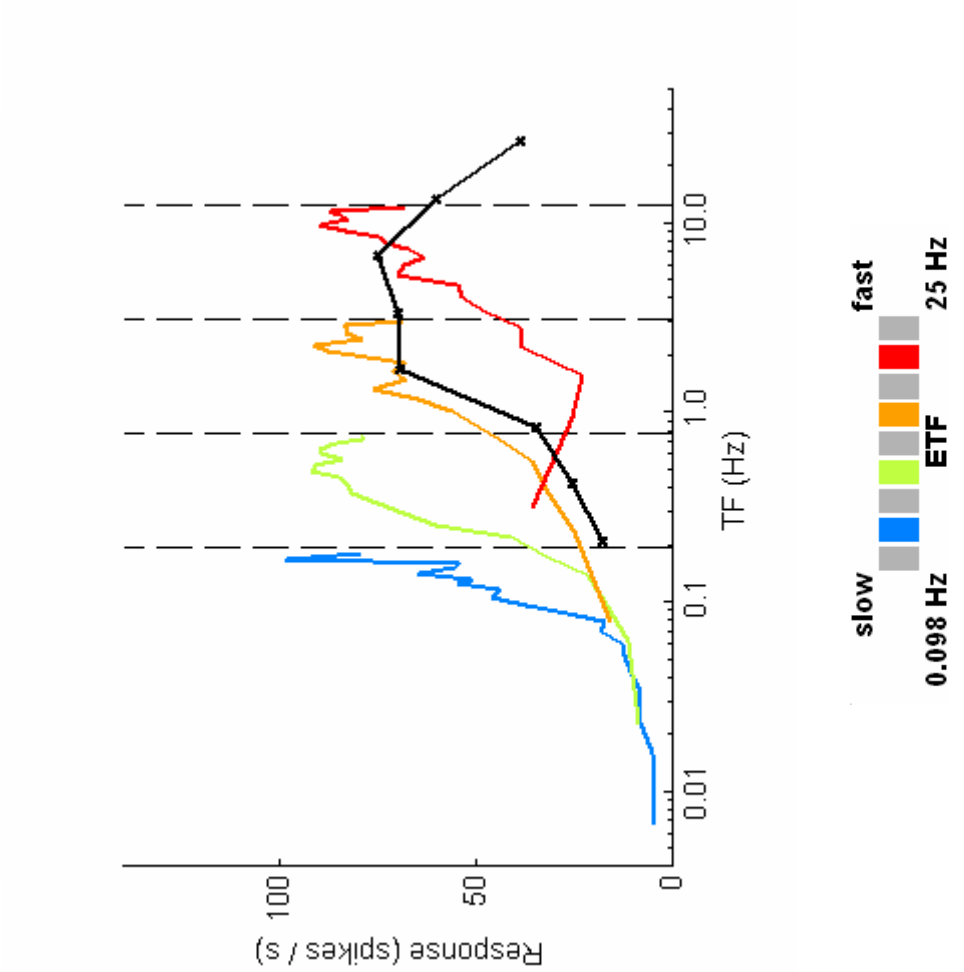
Motion Energy Model with conductance based LIF spike generation...



...explains only a portion of the change in gain

...see also: Borst et al. (2005)

# Tuning curves revisited...



# Summary & Conclusions

- A *random motion stimulus* suggests that motion encoding by DS cells is highly context dependent (here: variance)
    - Change in *temporal integration* (Bair & Movshon, 2004)
    - Change in *gain (IO relationship)*
- ⇒ Direction selective cells seem to be poorly characterized by a single input-response (tuning) curve
- Potentially functionally beneficial
    - Allows to encode stimulus values efficiently over a broad range
    - High gain compensates for weak signal (slow stimulus)
  - But what about the resulting ambiguity?
    - Seems to be hard to reconcile with the idea of labeled-line models

# Summary & Conclusions (contd.)

- Results are surprisingly consistent with studies in other species and other sensory modalities  
**Brenner et al (2000), Fairhall et al (2001)**, Borst et al (2005) (fly, motion);  
Chander & Chichilnisky (2001), Kim & Rieke (2001), Baccus & Meister (2002)  
(retina, contrast) Dean et al (2005), Nagel & Doupe (2006) (sound intensity)  
Maravall et al., 2007 (whisker deflections); **Adam Kohn (motion, monkey)**  
See also Ringach & Malone (2007) for related results
- BUT:
  - the effect is very different from classical adaptive phenomena (e.g. cortical contrast gain control)
  - Perhaps better described as an “*adaptive nonlinearity*”
- And of course:
  - The linear-nonlinear model is still a very limited description of the cells’ response properties
- Open questions:
  - Underlying mechanism(s)?
  - How would such a representation be read out?