

## Correlation at the neuron and population levels

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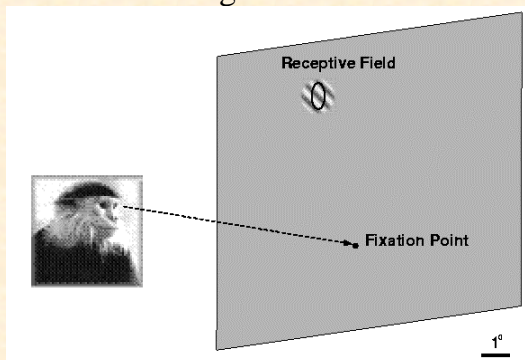
Collaborators

**St. Andrews:** P. Foldiak, D. Xiao, M. Nobbs, G. Fernie. **NIMH:** B. Richmond, M. Wiener, Z. Lui.  
**Brown:** N. Hatsopoulos, J. Donaghue

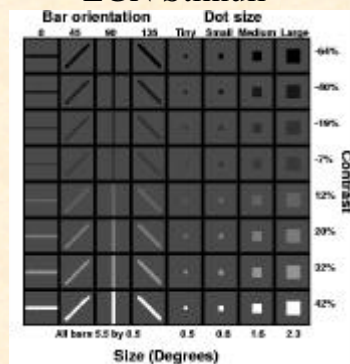
## Correlation at the neuron and population levels

- Correlation in responses of single neurones
  - Fine temporal structure
    - Repeating triplets / quadruplets
    - Response latency
- Correlation in populations of neurones
  - Pairs of neurones and synchrony
  - Simulations of pairs of neurones
  - Simulations of populations of neurones

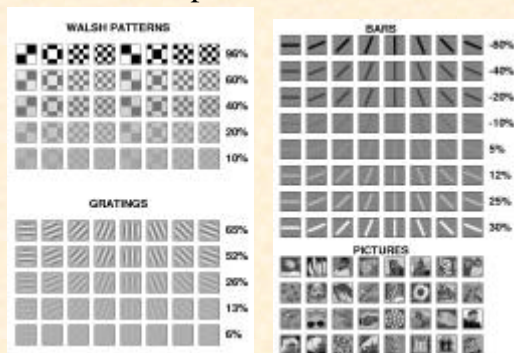
## Recording from LGN/V1



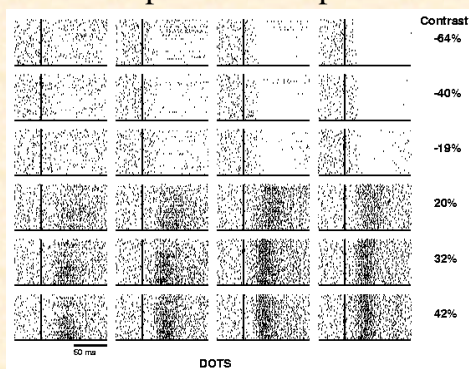
## LGN Stimuli



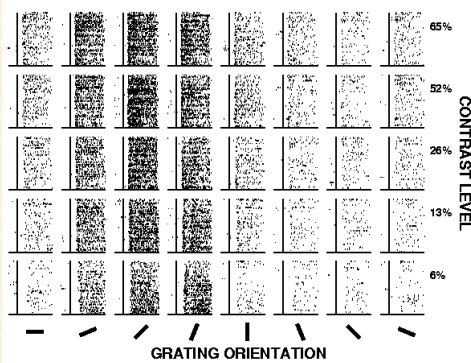
## Example V1 Stimuli



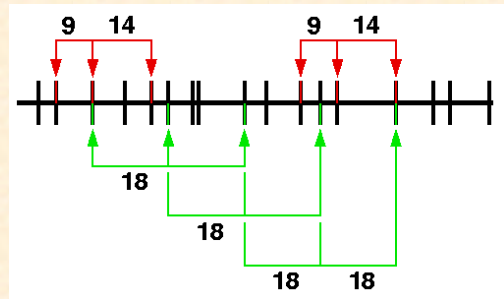
## Example LGN responses



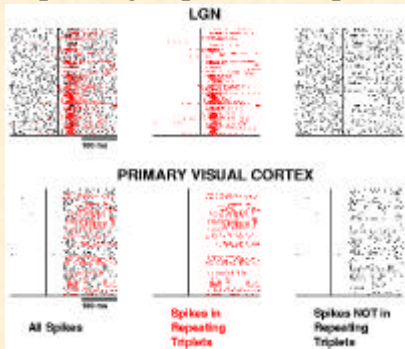
## Example V1 responses



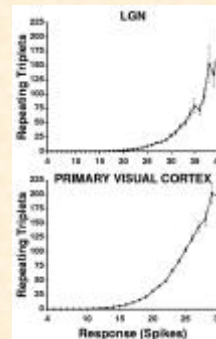
## Detecting repeating triplets



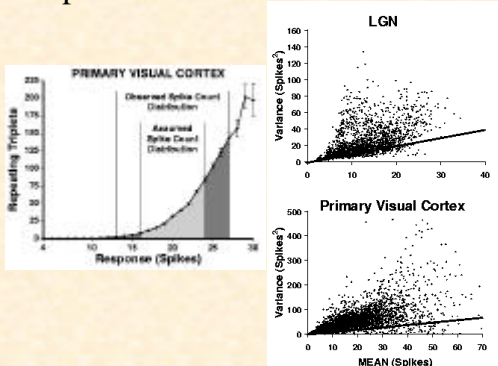
## Repeating triplets in responses



## Repeating triplets and spike count



## Spike count distribution matters



## Spike count matched model

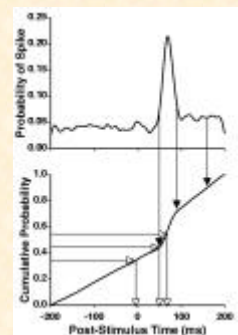
SCM Model

Generate the cumulative SDF

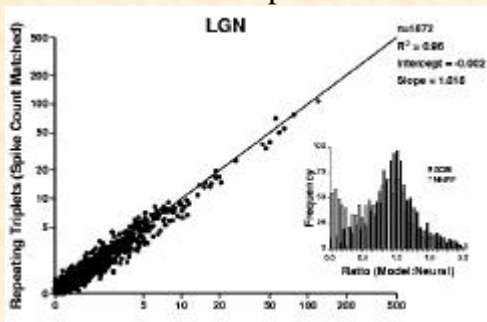
Take each observed spike count (e.g. 3)

Simulate a spike train using random numbers (0-1)

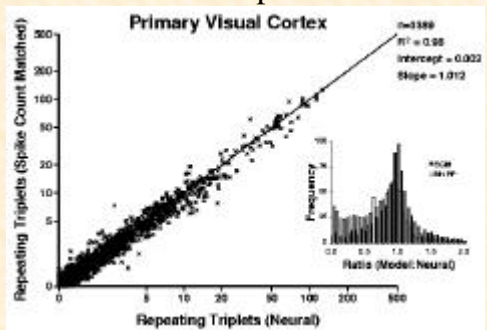
Adjust to match ISI



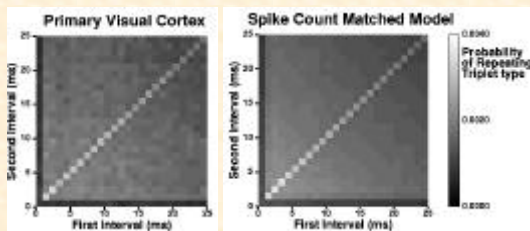
## Predicting fine temporal structure of LGN responses



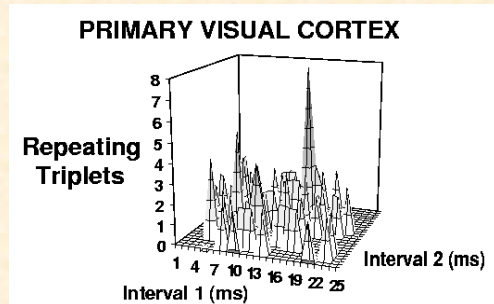
## Predicting fine temporal structure of V1 responses



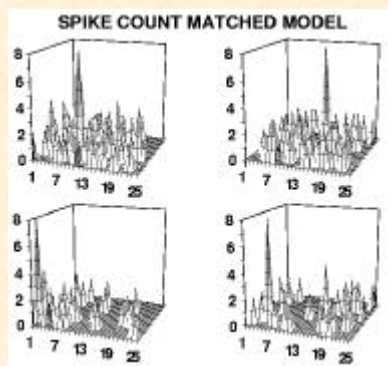
## Predicting type of repeating triplets



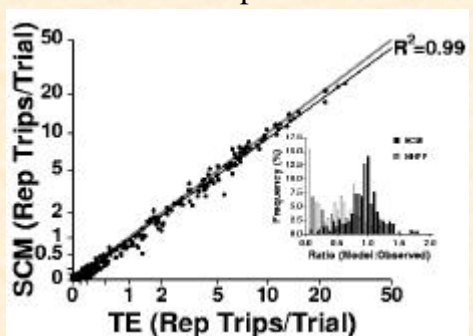
## LGN/V1 sticks out like a sore thumb



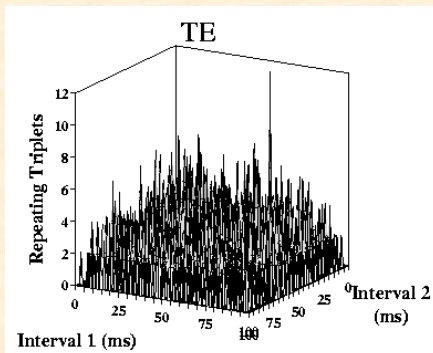
## SCM sticks out like a sore thumb



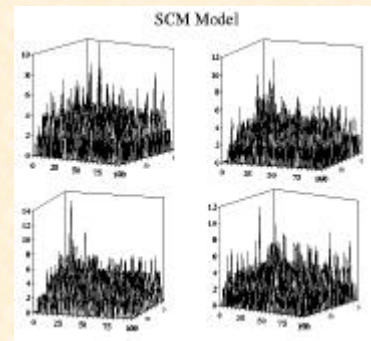
## Inferior temporal cortex



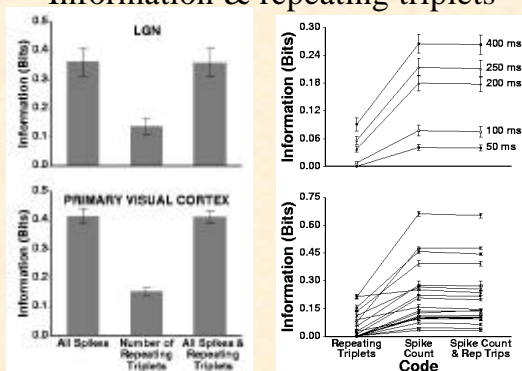
## IT & the sore thumb



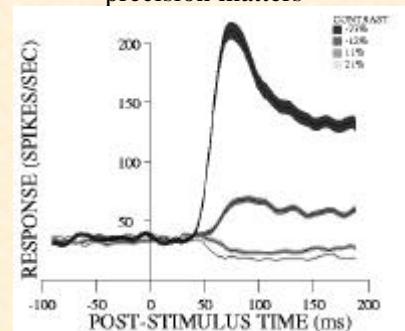
## SCM model of IT & sore thumbs



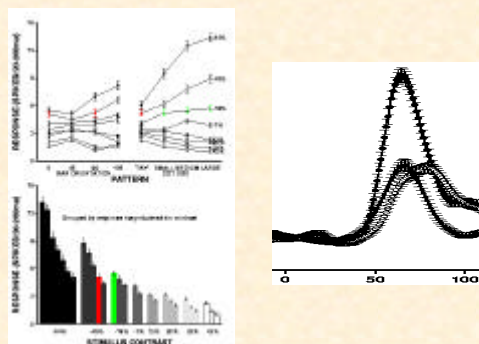
## Information & repeating triplets



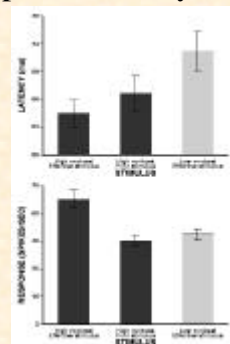
## Response latency: when temporal precision matters



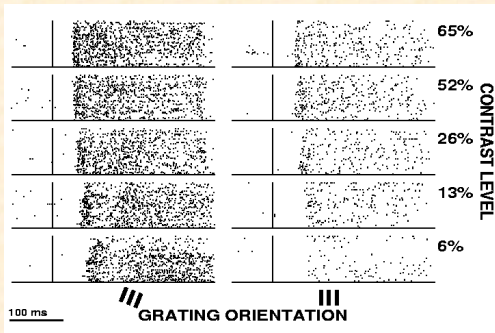
## LGN latency & response magnitude



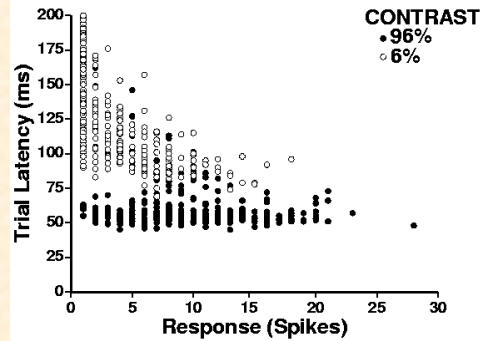
## LGN response latency & magnitude



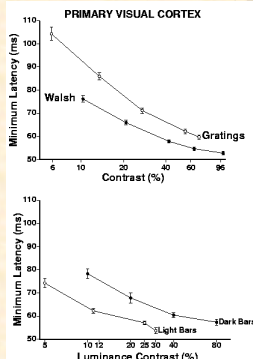
## V1



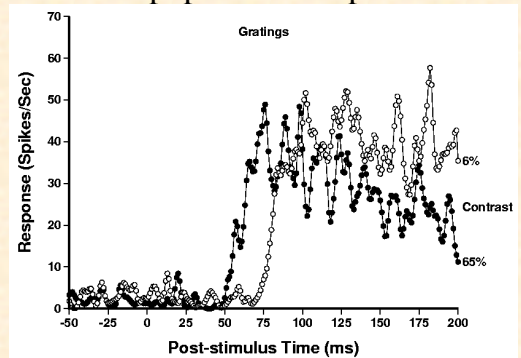
## Latency & magnitude independent



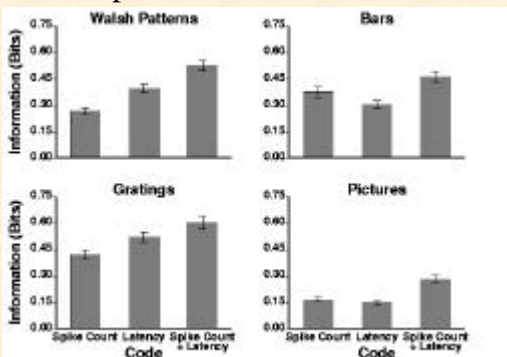
## V1 latency related to stimulus type & contrast



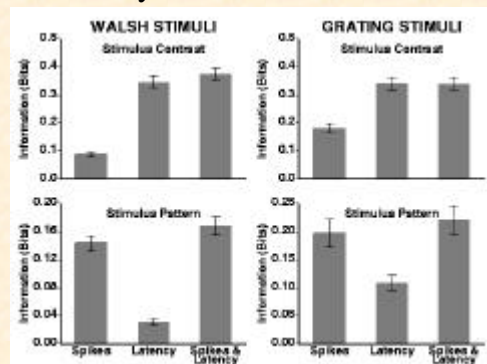
## V1 population response



## Independence of information

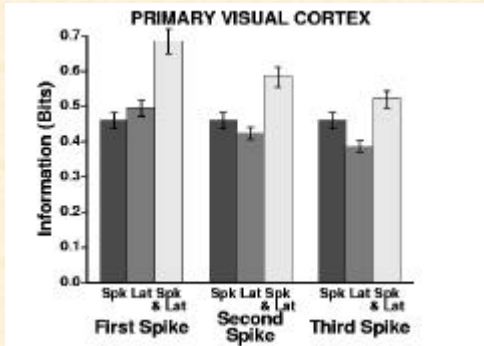


## Latency = contrast, count = ID





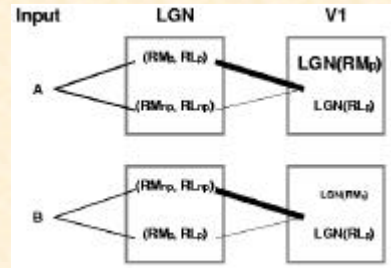
## 1st spike matters



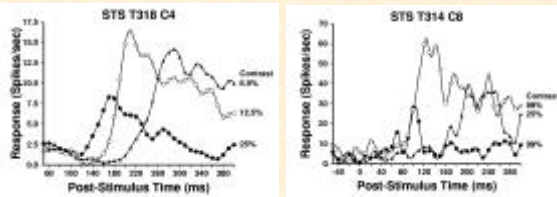
## Moving from LGN to V1

LGN: latency is related to spike count.

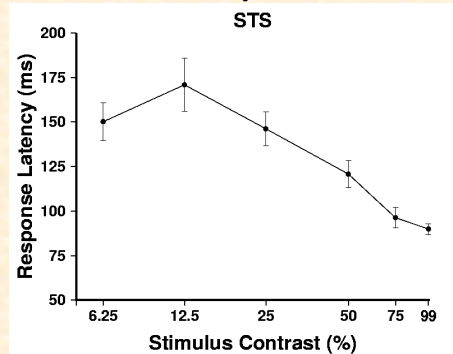
V1: latency almost independent of spike count.



## STS - contrast & latency



## STS - Latency & contrast



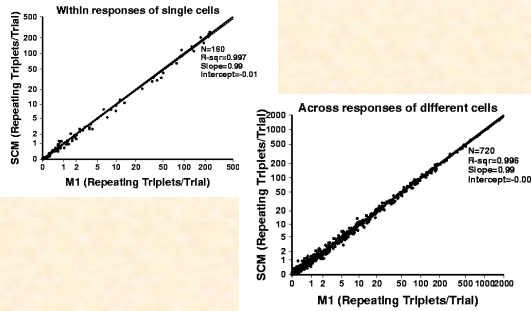
## Summary of single cell codes

- Spike count distribution induces correlation
- Fine temporal structure at chance level
  - Need to include correlation for spike count
- Response latency (1st Spike)
  - Latency carries information about contrast
  - Spike count carries information about ID
- To describe responses of single cells
  - Spike count distribution
  - Spike density function (response envelope)
  - Do we need a different SDF for each contrast?

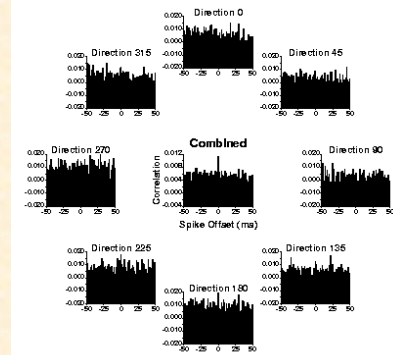
## Pairs of neurones & synchrony

- Recordings from single neurones in M1
  - Nicho Hatsopoulos (Brown University)
- Recorded using Utah array
- Total of 96 pairs
- Monkey making arm movements to move manipulandum to a target light
- Examined responses for triplets & synchronous spikes

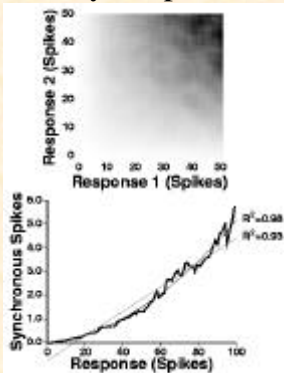
## SCM model predicts triplets



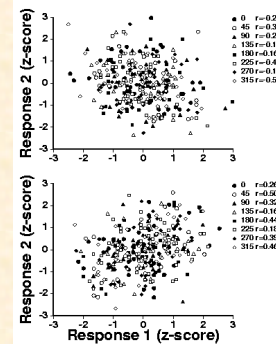
## Synchrony in M1 neural responses



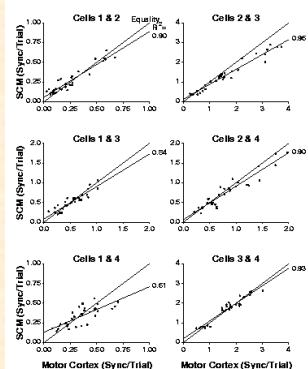
## Synchrony & spike counts



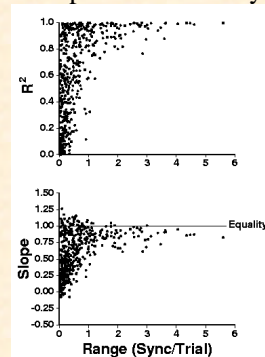
## Coarse correlation



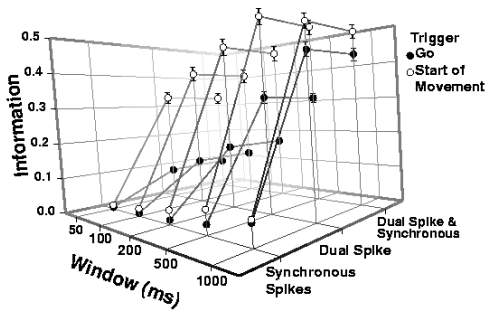
## SCM model underestimates synchrony



## SCM model explains variability in synchrony



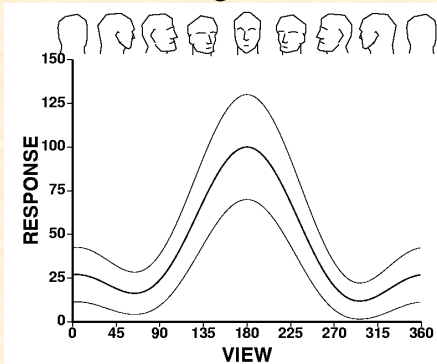
## Sync spikes don't carry unique information



## Summary of pairs of neurones

- Synchronous spikes related to product of spike counts
  - Independent of variability (assuming Gaussian)
  - Dependent on coarse temporal correlation of spike counts
- When synchrony exceeds chance levels
  - Ensure that no relationship between spike counts and number of synchronous spikes
  - A scaling between predicted & observed implies no useful/unique signal
  - Use several experimental conditions

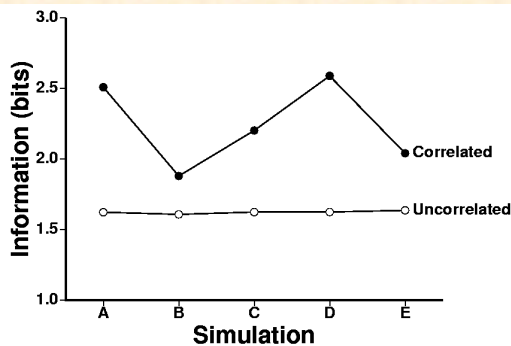
## Tuning curves



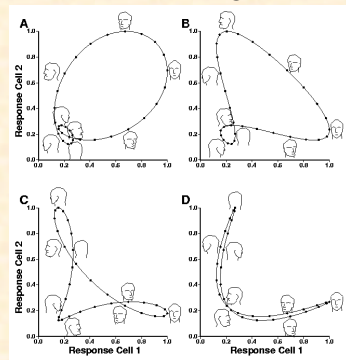
## The effect of coarse temporal correlation

- Used simulations of small populations
  - Truncated Gaussian to model spike count distribution
- Examined details using a simulated pair of neurones
  - Varied mean~variance relationship (Fano)
  - Varied correlation of response variability

## Coarse correlation and population information

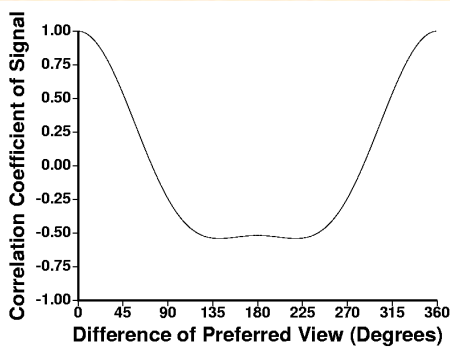


## Offset of tuning curves

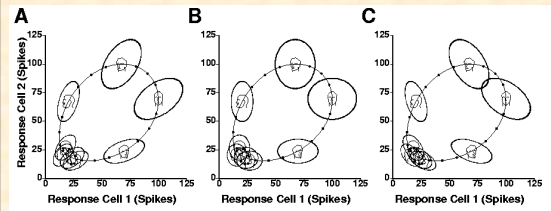




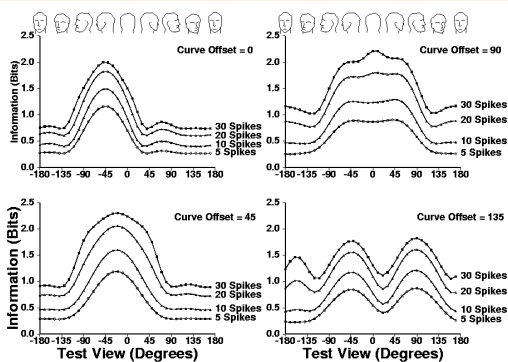
## Signal correlation



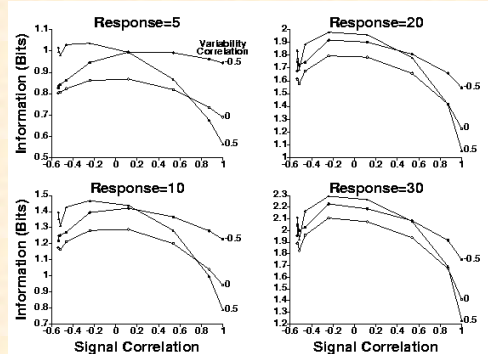
## Noise correlation



## Effect of spike count range



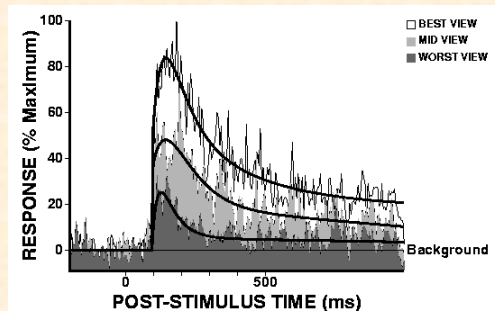
## Signal & noise correlation



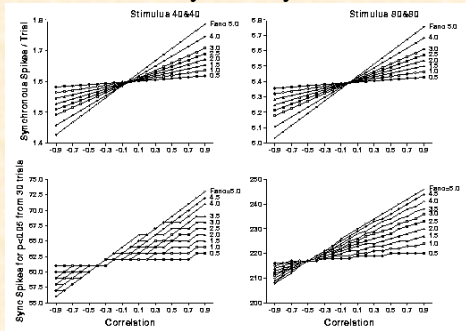
## Simulations of synchrony

- Used SCM model with average spike density function of STS neurones
- Measured distribution of synchronous spikes from 10,000 “trials” at each spike count pair (1..100,1..100)
- Calculated synchronous spike distribution to different stimuli
  - Defined stimuli by mean and variance (truncated Gaussian distribution)
  - Used range of fano factor & correlation

## Simulated spike density function



## Effect of variability and correlation on synchrony



## Summary

- Correlation of “noise” tends to increase the transmitted information
- The effect of the correlation of the response variability depends on
  - the distribution of the stimuli
  - the maximum response
  - suggests there is no generic answer
- Synchronous spikes is related to correlation of response variability
  - A possible code for signaling correlation on a trial by trial basis