

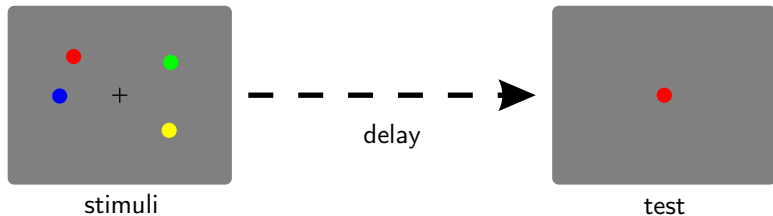
# Drift in neural population activity causes working memory to deteriorate over time

Sebastian Schneegans

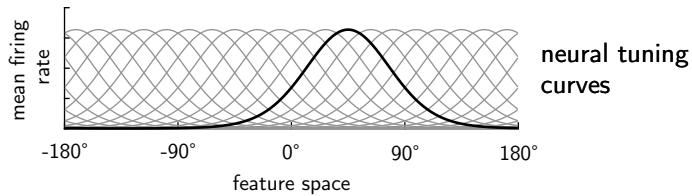
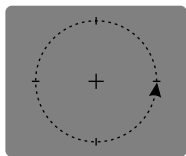


## Visual working memory

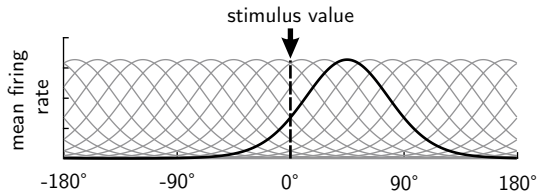
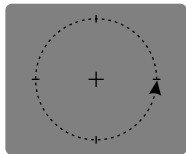
- detailed, but capacity-limited storage over short durations
- effects of set size: well studied, competing accounts either based on fixed slots or continuous memory resource (Zhang & Luck 2008; Ma, Husain & Bays 2014)
- effects of delay duration: less well understood, few quantitative models (Zhang & Luck 2009, Ricker, Spiegel & Cowan 2014)



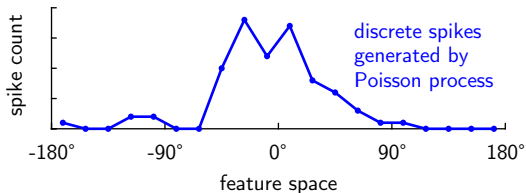
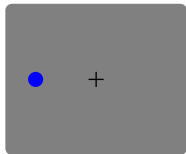
# Population coding



# Population coding

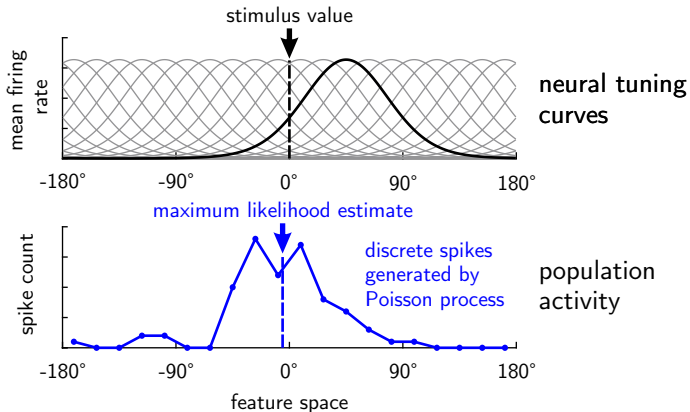
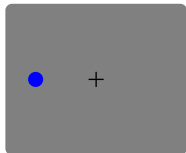
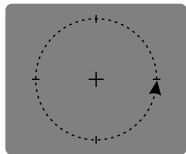


neural tuning curves

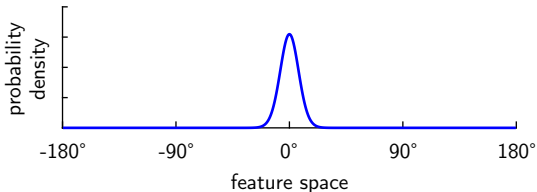
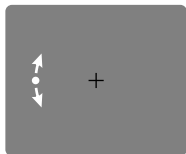
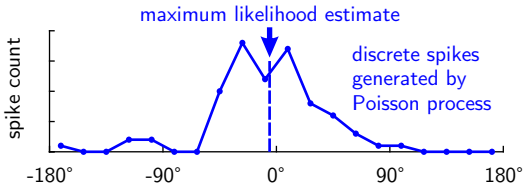
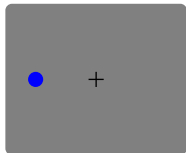
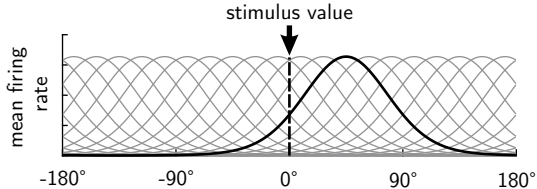
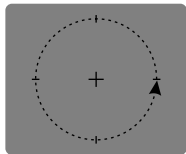


population activity

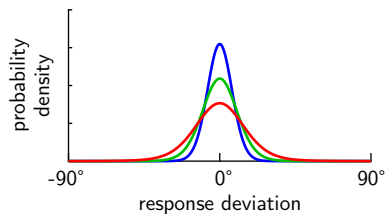
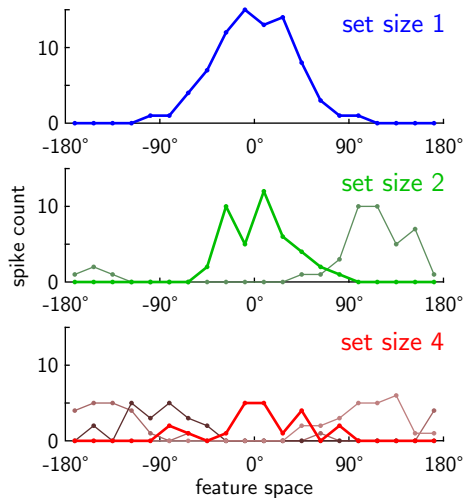
# Population coding



# Population coding

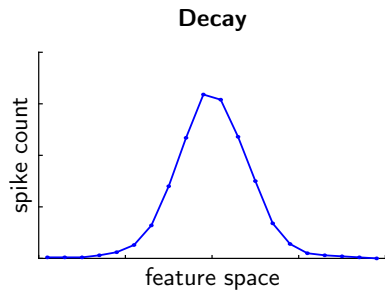


## Set size effects



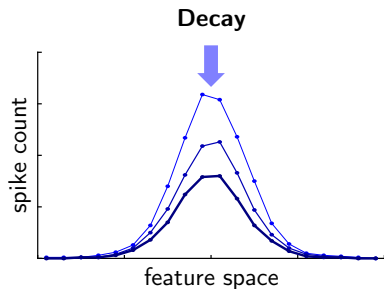
set size effects explained by normalization of total activity in the population (Bays 2014)

# Delay effects



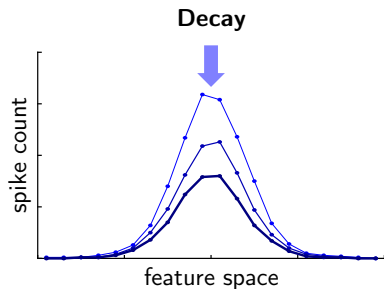


# Delay effects

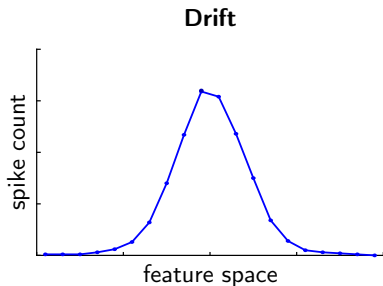


decreasing spike count over  
time (equivalent to set size  
effect)

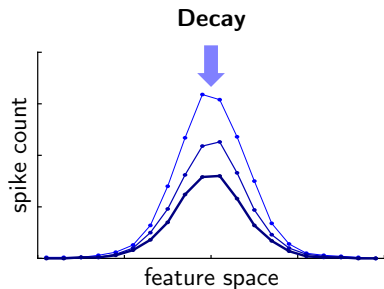
# Delay effects



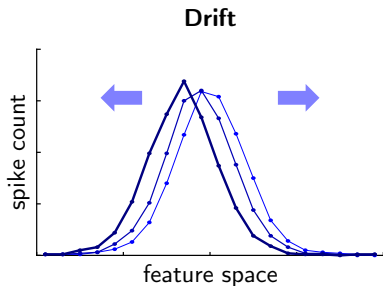
decreasing spike count over time (equivalent to set size effect)



# Delay effects



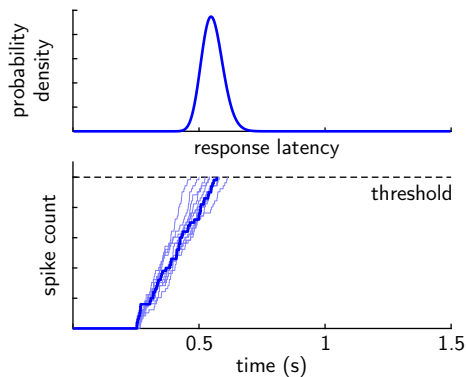
decreasing spike count over time (equivalent to set size effect)



decreasing precision without change in spike count (as in line attractor / dynamic field models)

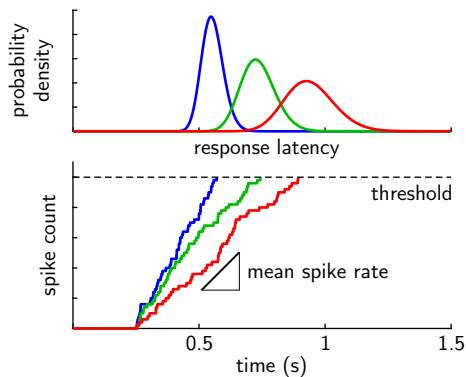
# Response latencies

- using response latencies in saccade task to estimate activity levels
- assuming integration to threshold for response initiation (Ratcliff 1978, Carpenter & Williams 1995, Pearson et al. 2014)

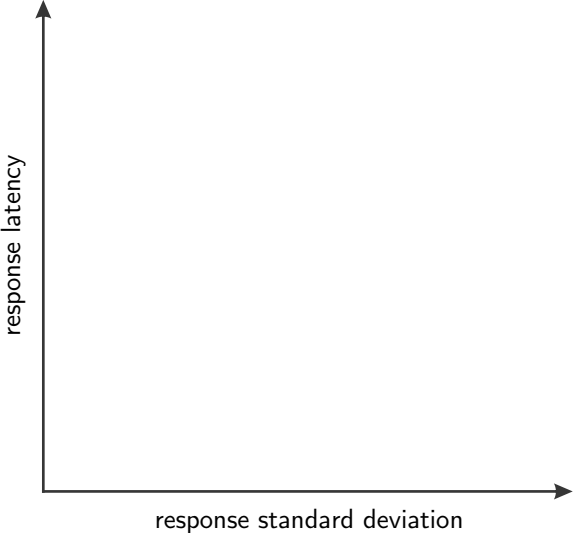


## Response latencies

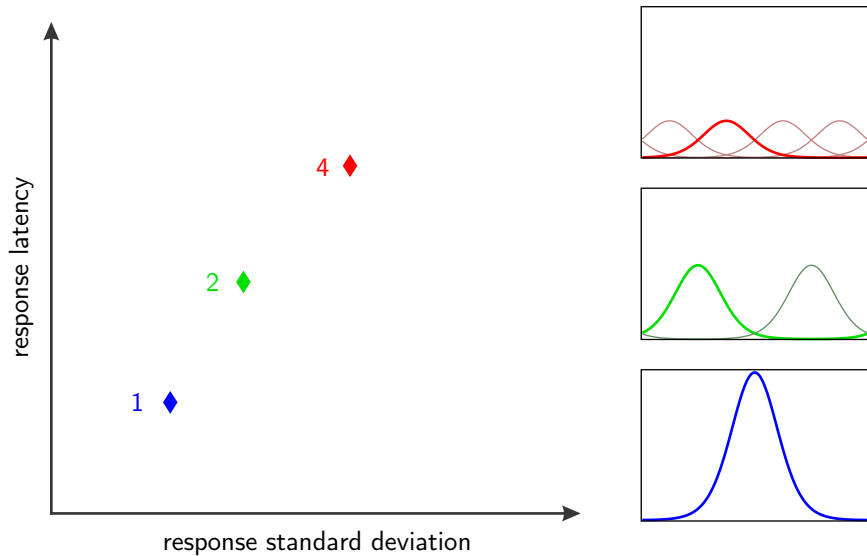
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- assuming integration to threshold for response initiation (Ratcliff 1978, Carpenter & Williams 1995, Pearson et al. 2014)



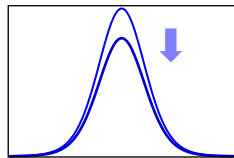
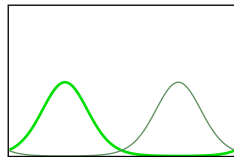
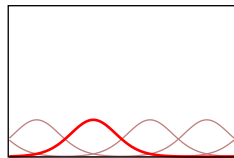
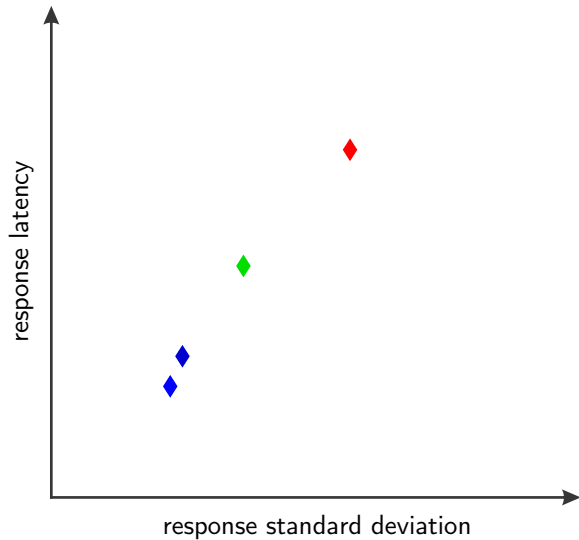
# Predictions: Latency vs. precision



## Predictions: Set size effects

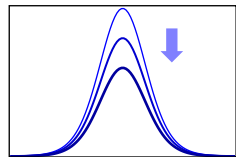
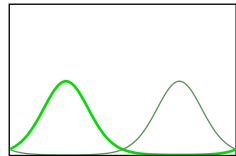
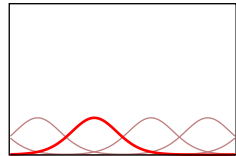
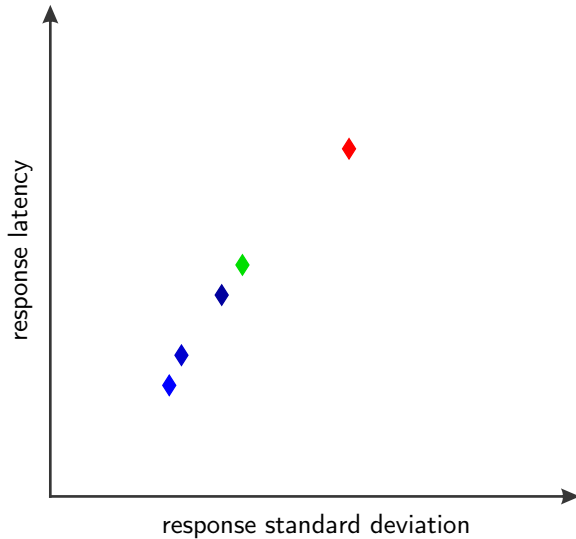


## Predictions: Decay model

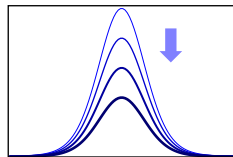
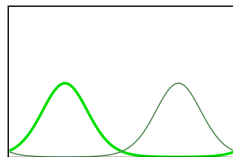
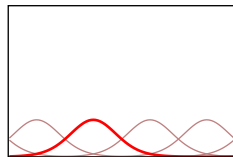
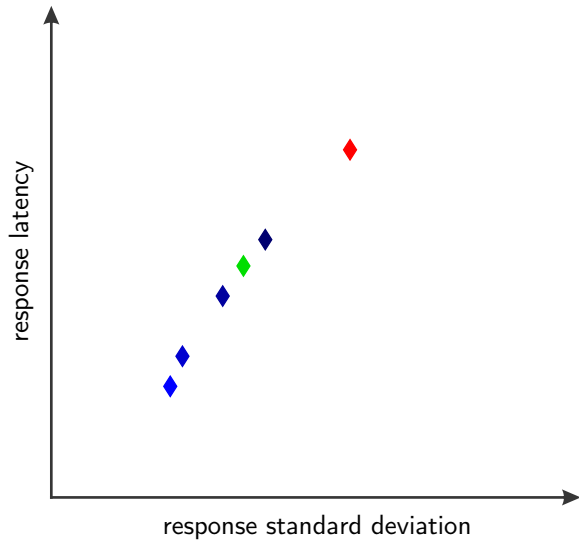




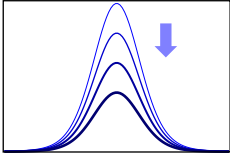
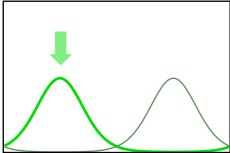
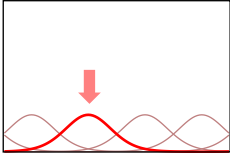
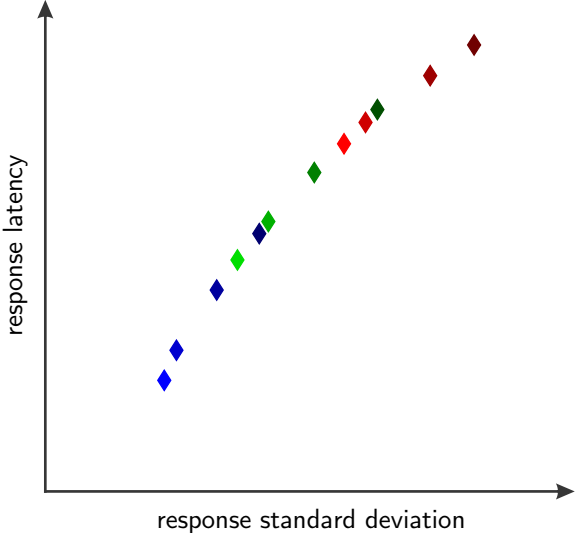
# Predictions: Decay model



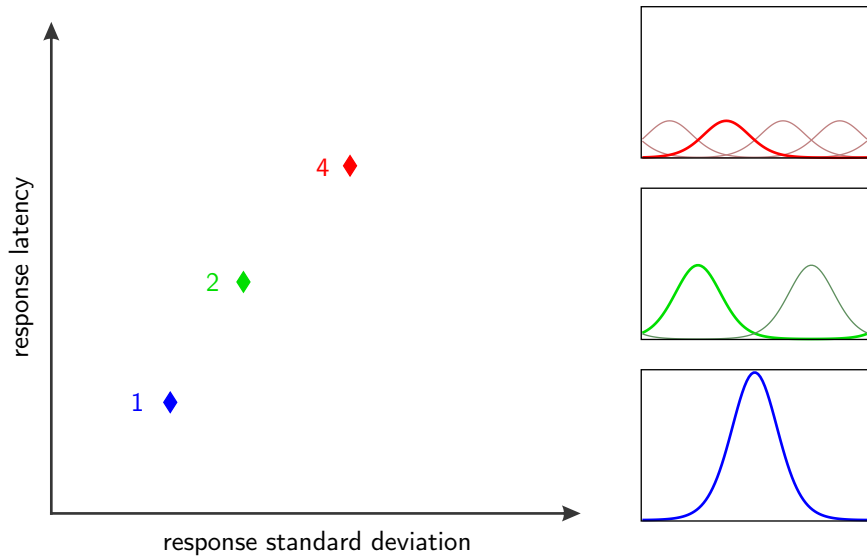
## Predictions: Decay model



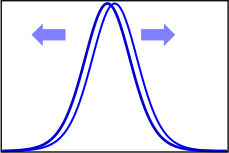
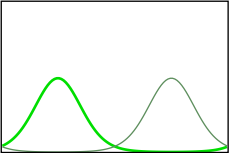
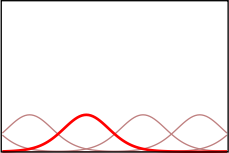
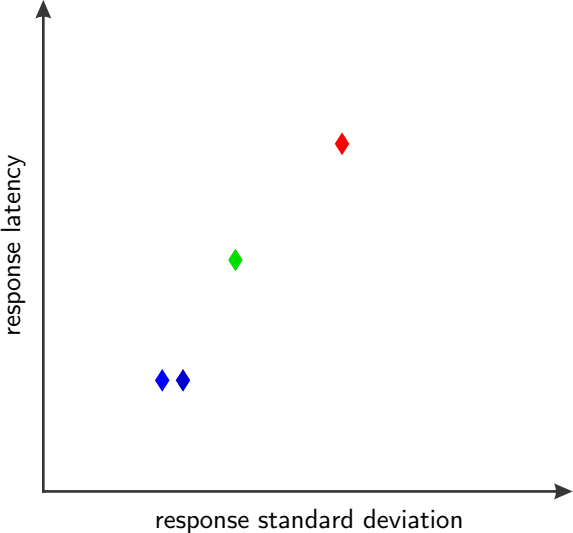
# Predictions: Decay model



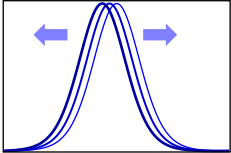
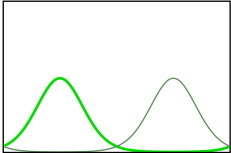
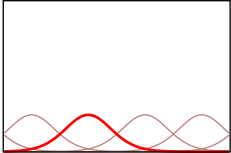
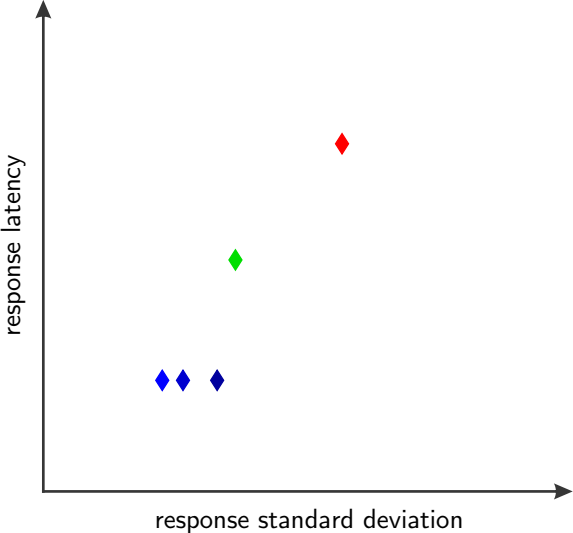
## Predictions: Drift model



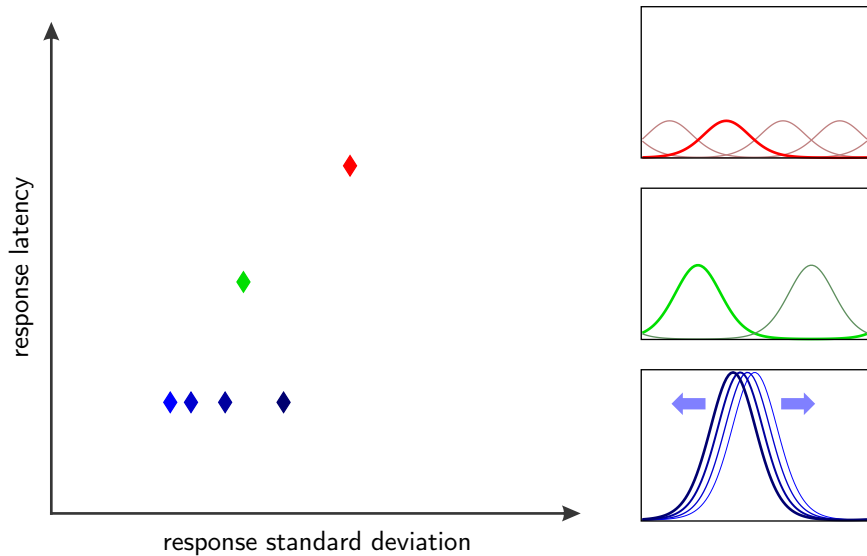
# Predictions: Drift model



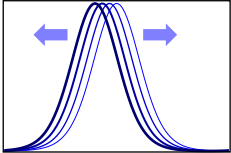
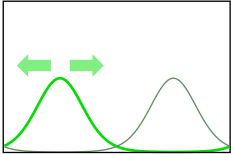
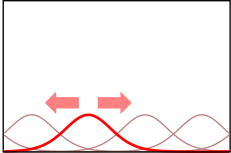
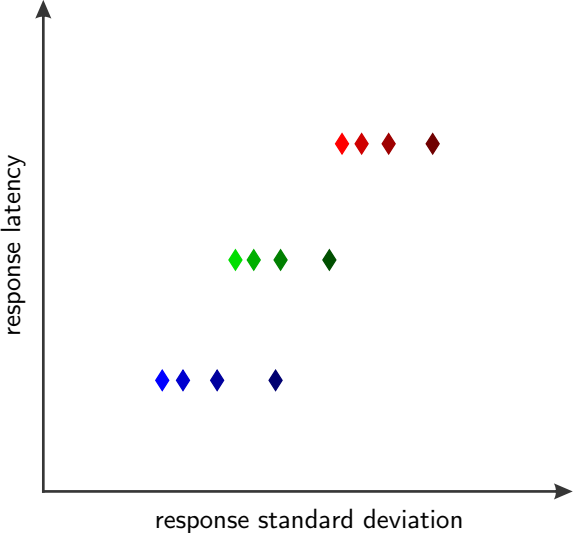
# Predictions: Drift model



## Predictions: Drift model

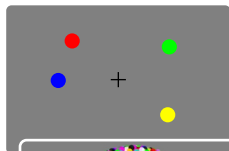


# Predictions: Drift model

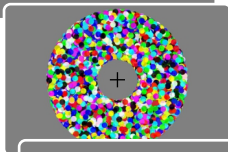




# Behavioral task



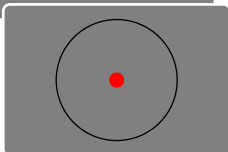
stimuli (2s)



mask (0.1s)

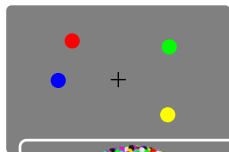


variable delay

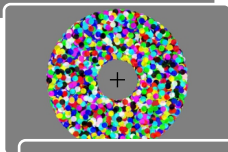


cue

# Behavioral task



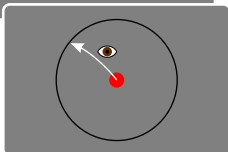
stimuli (2s)



mask (0.1s)

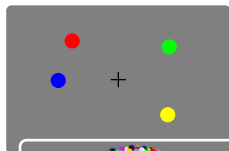


variable delay



cue & response

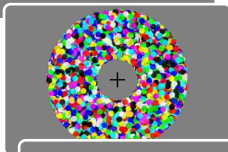
# Behavioral task



stimuli (2s)

**set sizes:**

1, 2, 4



mask (0.1s)

**total delay duration:**

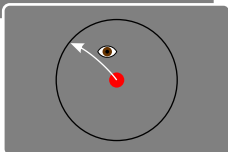
0.5s, 1s, 2s, 4s



variable delay

**response latency:**

saccade onset

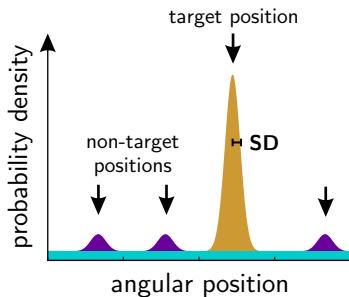


cue & response

**response location:**

first stable fixation  
after saccade

# Mixture model



mixture model with three components:

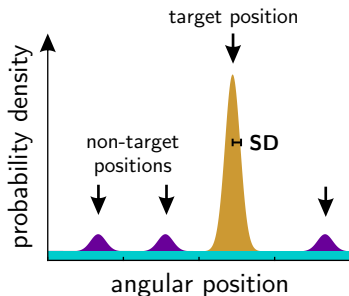
**target response**

**non-target response**

**random guess**

(Zhang & Luck 2008, Bays, Catalao, Husain 2008)

# Mixture model



mixture model with three components:

**target response**

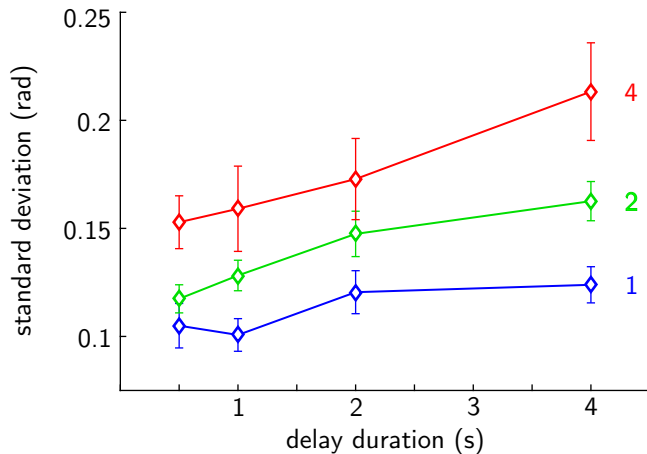
**non-target response**

**random guess**

(Zhang & Luck 2008, Bays, Catalao, Husain 2008)

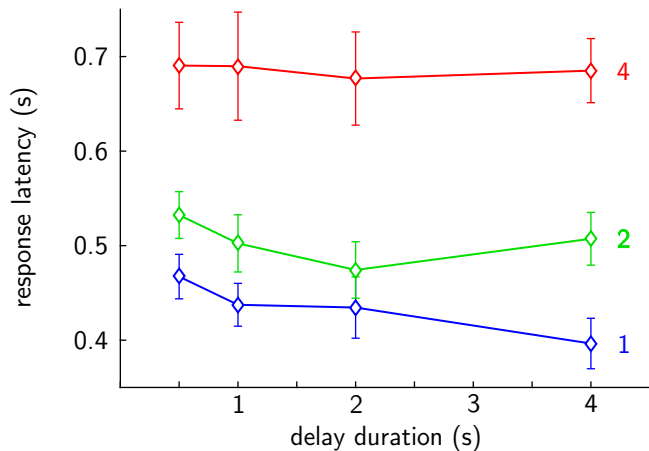
- 97% of responses to target (93% at set size 4)
- no significant effect of delay on mixture proportions

## Recall precision



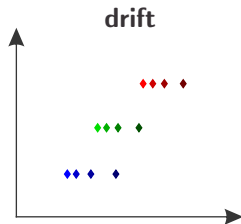
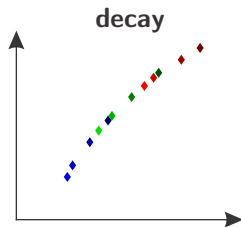
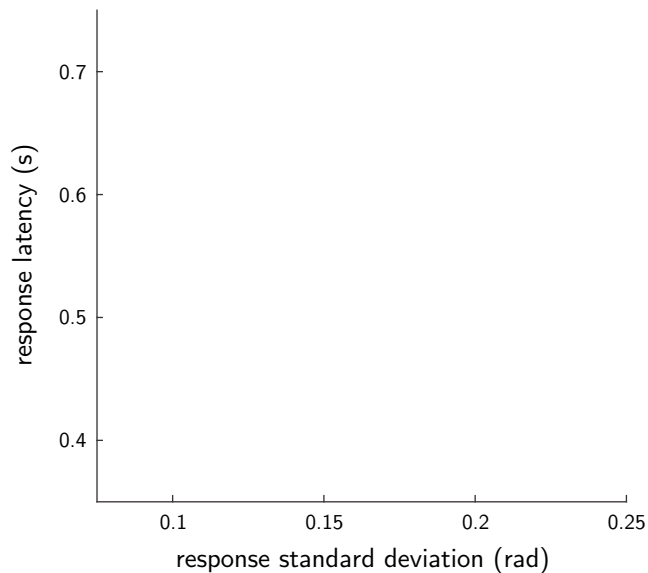
- significant effect of both set size and delay ( $p < 0.01$ )

## Response latencies



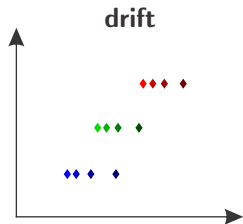
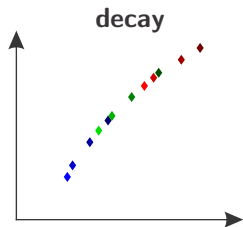
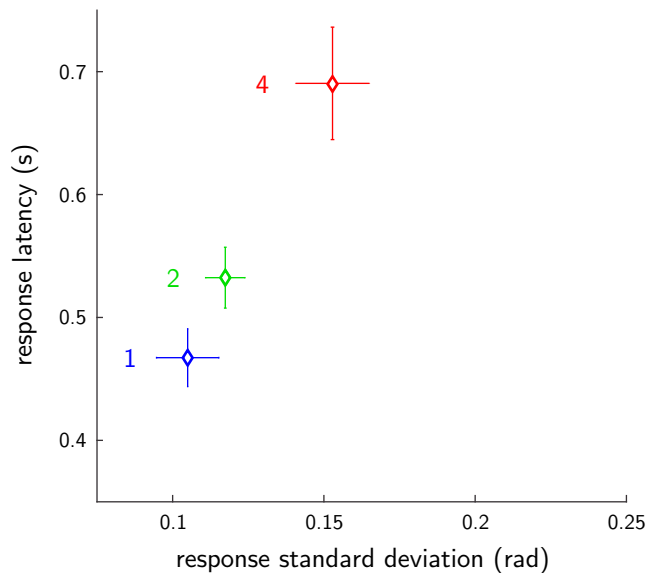
- significant effect of set size ( $p < 0.01$ ), but not delay ( $p = 0.60$ )

# Combined results

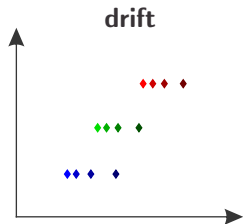
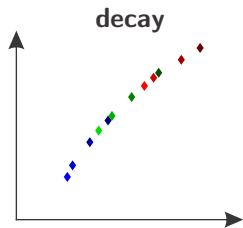
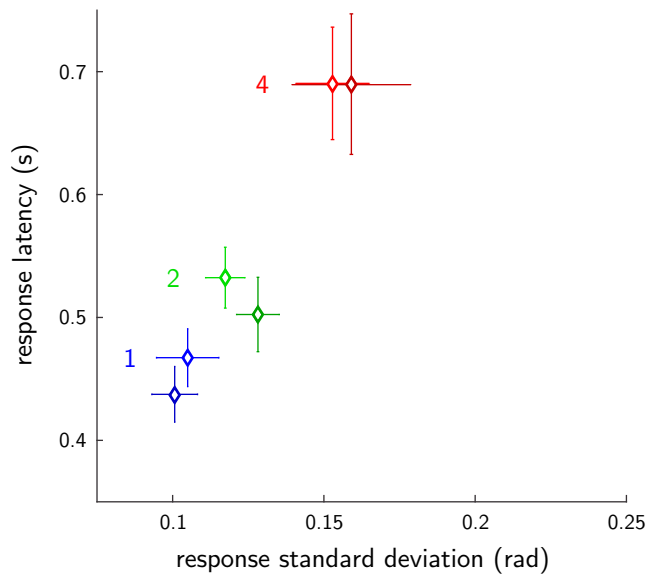




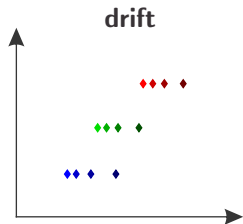
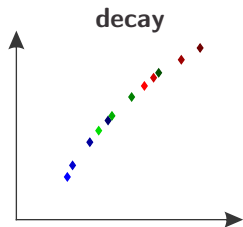
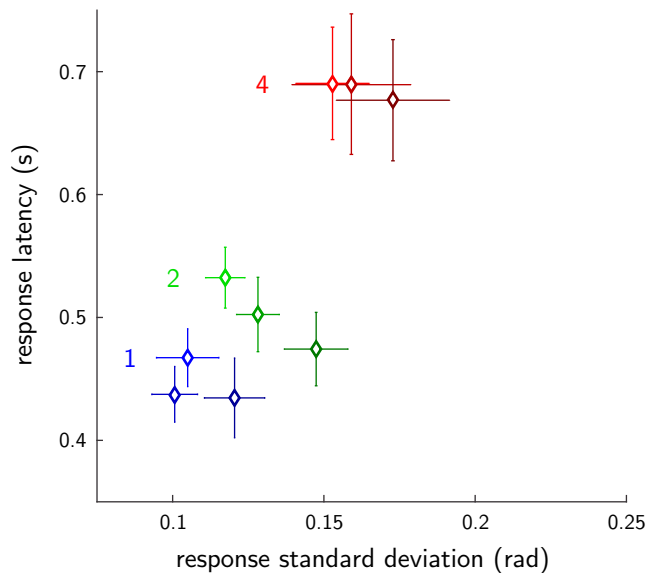
# Combined results



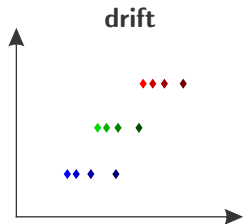
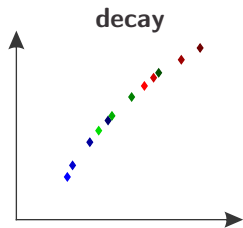
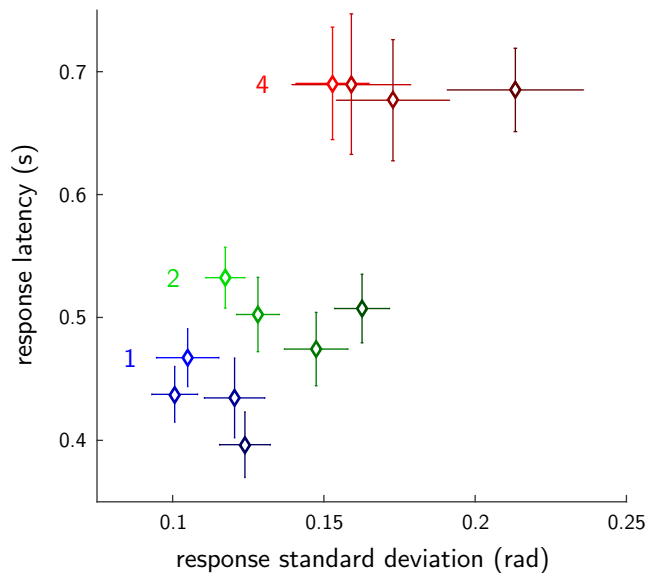
# Combined results



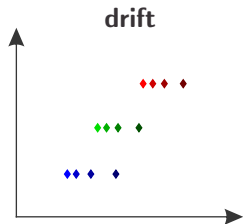
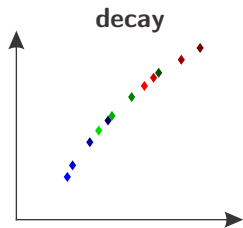
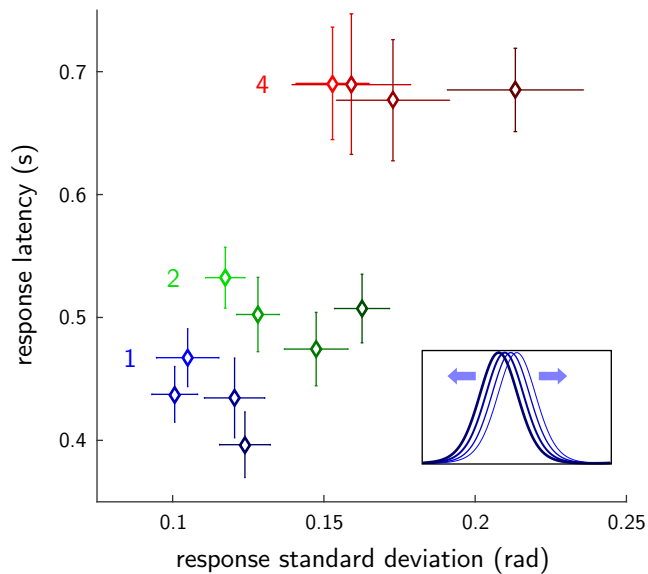
# Combined results



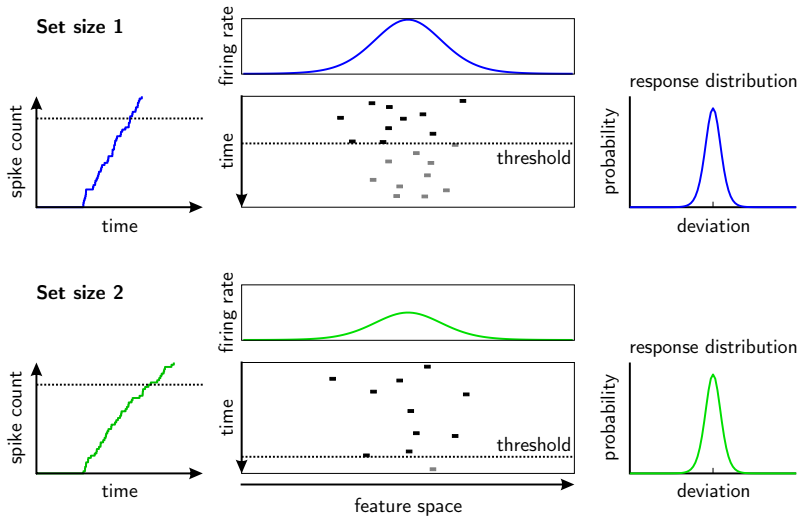
# Combined results



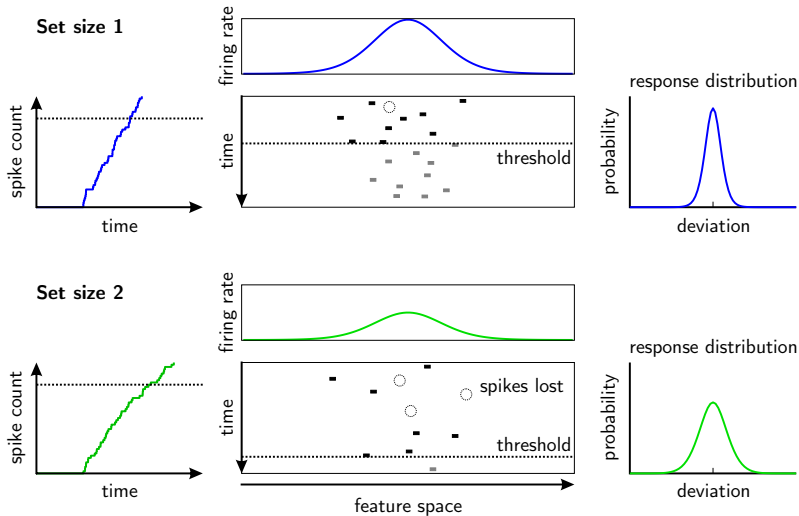
# Combined results



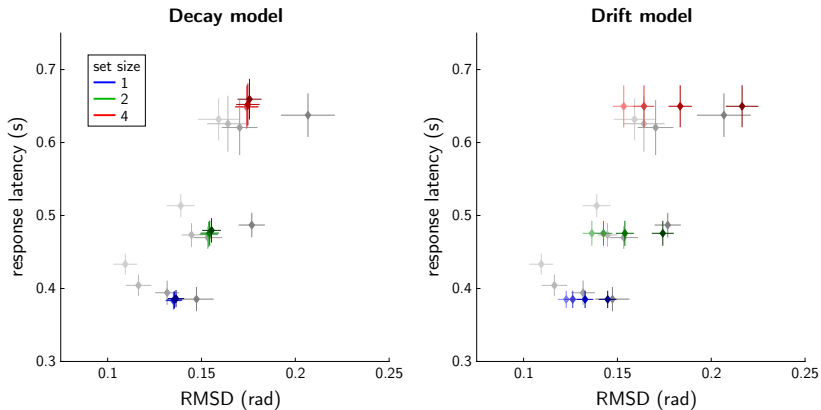
# Modeling reaction time and errors



# Modeling reaction time and errors



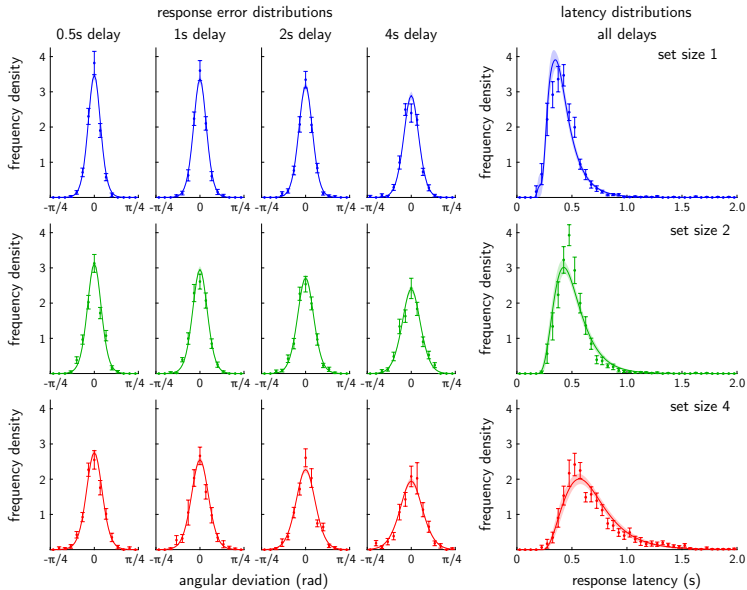
# Model fits



Schneegans & Bays (2018), *Journal of Neuroscience*, 38(21)



# Response distributions



# Conclusions

- two possible mechanisms for delay effects in population model
- predictions tested in spatial recall task with saccadic response
  - ▶ recall precision decreases systematically with delay duration
  - ▶ response latencies show no systematic effect of delay duration
- findings are consistent with drift, but not decay in neural activity

# Conclusions

- two possible mechanisms for delay effects in population model
- predictions tested in spatial recall task with saccadic response
  - ▶ recall precision decreases systematically with delay duration
  - ▶ response latencies show no systematic effect of delay duration
- findings are consistent with drift, but not decay in neural activity
- but drift alone does not explain response errors for earliest delay durations

Thank you!



Paul Bays



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