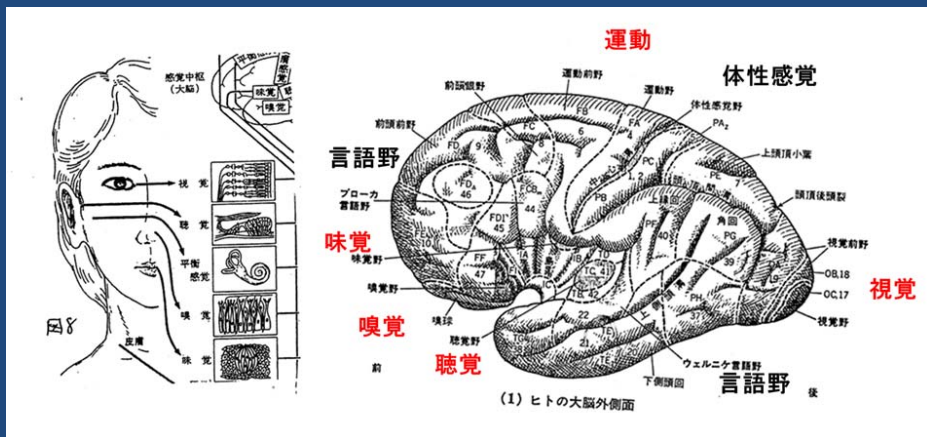


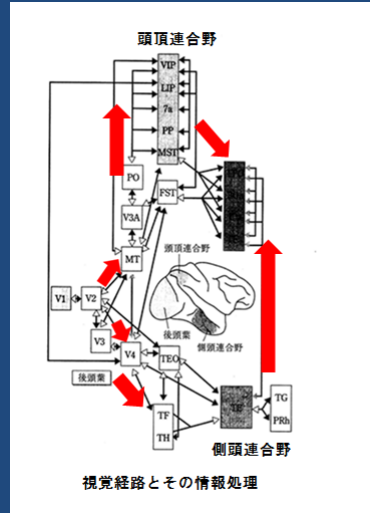
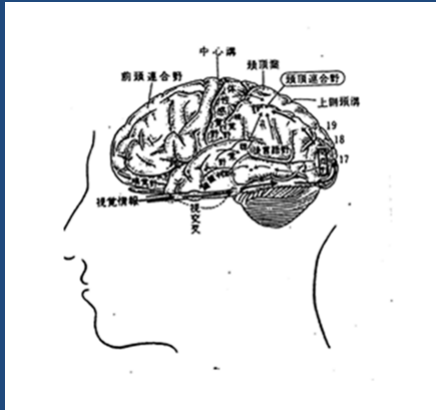
感覚情報の階層的処理機構

先進理工学専攻
檜森 与志喜

感覚受容と脳内の機能的地図



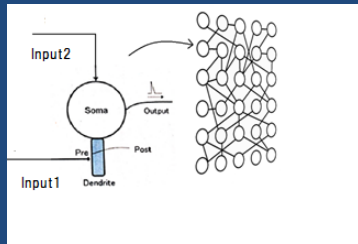
視覚経路



大脳皮質の神経細胞



大脳皮質は6層構造を取り、さまざまな形態の神経細胞で構成されている。



Models of a single neuron
Network models

➔ Highly nonlinear system

Hodgkin-Huxley model

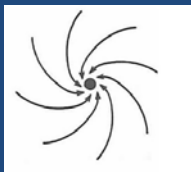
$$dV_M / dt = (1/C_M)[I - \{\bar{g}_K n^4 (V_M - V_K) + \bar{g}_{Na} m^3 h (V_M - V_{Na}) + \bar{g}_{Cl} (V_M - V_{Cl})\}]$$

$$dn / dt = \alpha_n - (\alpha_n + \beta_n)n \quad dh / dt = \alpha_h - (\alpha_h + \beta_h)h$$

$$dm / dt = \alpha_m - (\alpha_m + \beta_m)m$$

力学系の解の振る舞い

Point attractor

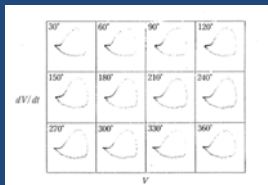


Limit cycle

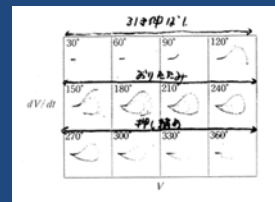
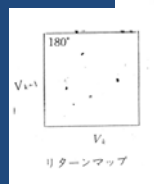


Hodgkin-Huxley Equation

$$\frac{d\vec{x}}{dt} = f(\vec{x}, t)$$



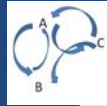
Quasi-periodic



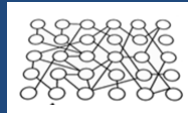
Chaotic attractor



注目すべきこと



全体の秩序(巨視的)



局所的な相互作用

- 異なるスケールの階層構造
- 空間的スケール
- 時間的スケール
- 動的秩序の創発
- システムとしての機能

研究に関するキーワード

- 自己組織化・自己組織臨界現象・動的秩序創発、相転移
- シンクロナイゼーション・アトラクタ・カオス・非線形効果・引き込み

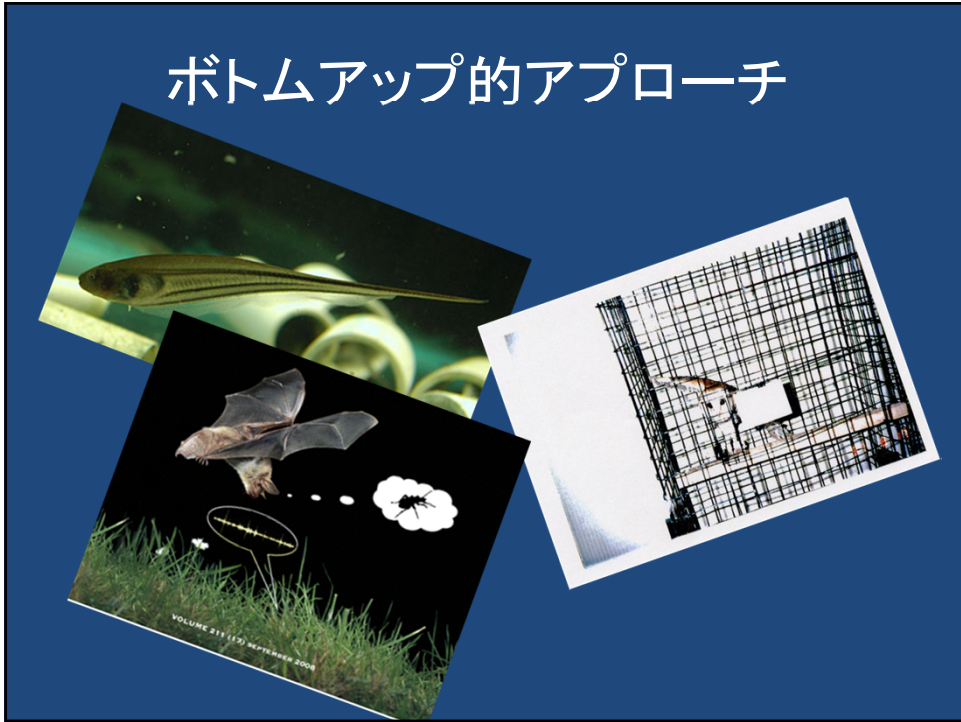
研究テーマ

- 脳における情報処理機構の解明
- 生物システムの動的秩序創発のメカニズム
細胞集団(免疫系の自己・非自己)、魚群の行動、
人間社会の付き合い行動 など

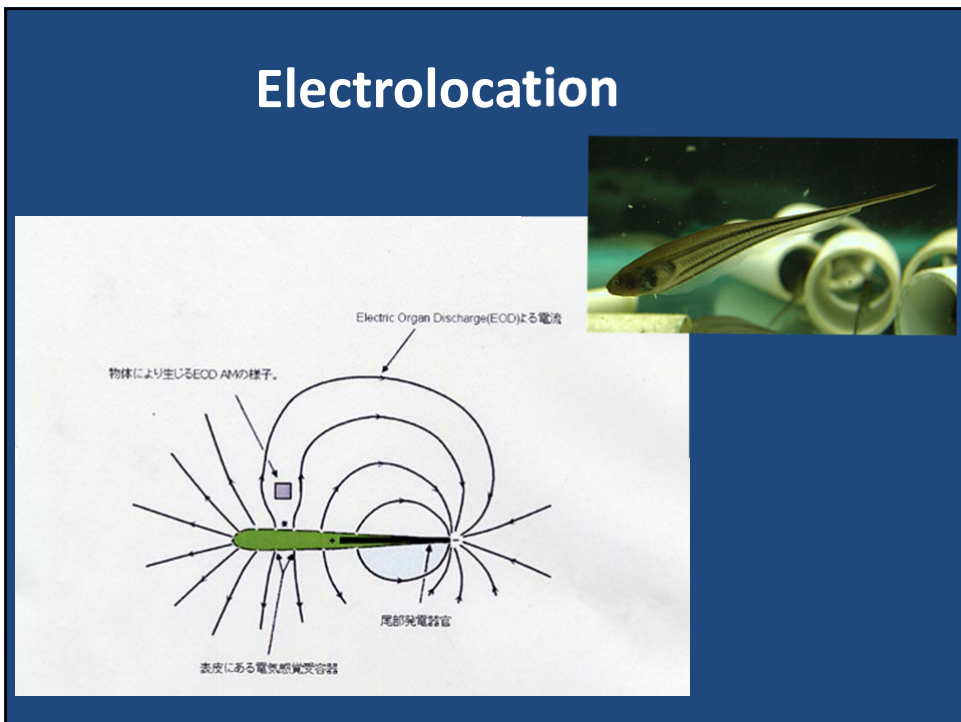
脳の情報処理機構

- **ボトムアップ的アプローチ**
たんぱく質や遺伝子、細胞などの構成要素について**現実的でミクロスコピックなモデル**を作り、それを用いて、簡単なシステムを構築し、そのシステムモデルを用いて**さらに上位のシステムを構築していく**という、下からの積み上げ方式である。

ボトムアップ的アプローチ

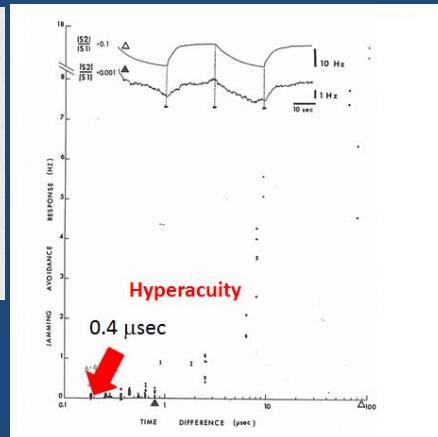
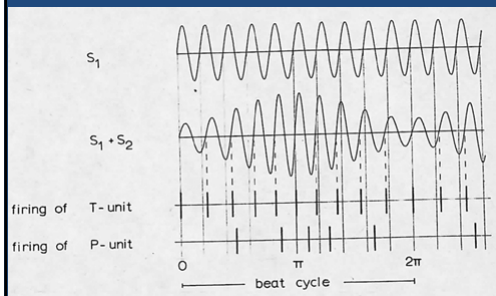


Electrolocation



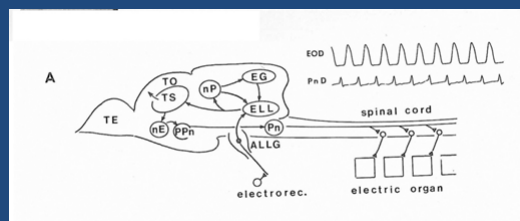
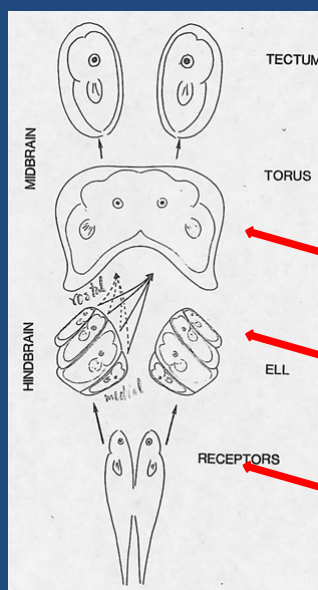
Amplitude and phase coding

Detection ability of phase difference



(Hyperacuity; Y. Kashimori et al., Biol Cybern, 2001)

The neural pathway of electrosensory processing



Phase coding (~ submillisecond)

Neural coding of object features (distance, size, shape)

Encoding of EOD AM and PM

Electric image

Calculation of electric image by finite-element method

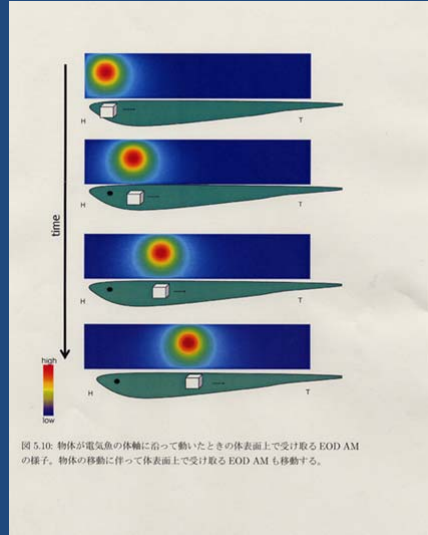
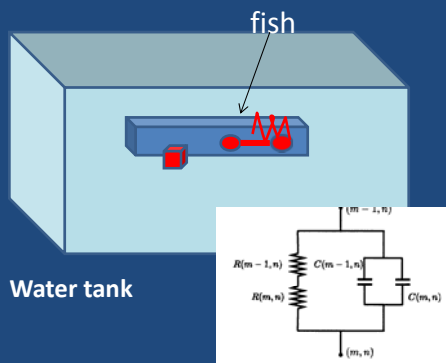
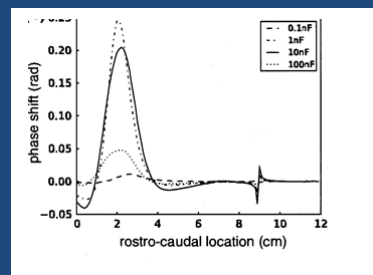
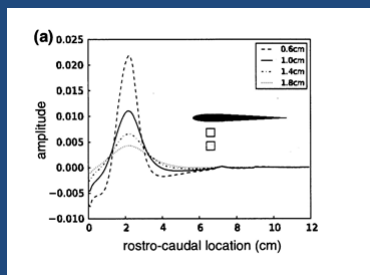
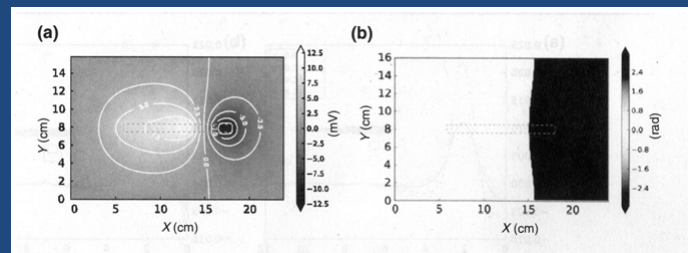


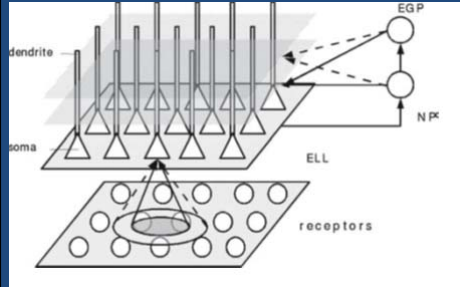
図 5.10. 物体が電気魚の体軸に沿って動いたときの体表面上で受け取る EOD AM の様子。物体の移動によって体表面上で受け取る EOD AM も移動する。

(Fujita and Kashimori, Biol Cybern ,2010)

Electric image



Burst coding of object features



Neuron model

$$\frac{dV_y^S}{dt} = I_{Na,S} + I_{Dr,S} + I_{leak}^S + \frac{g_c}{K}(V_y^D - V_y^S) + I_{FF,E}^y + I_{FB,I}^y \quad \text{Soma}$$

$$\frac{dV_y^D}{dt} = I_{Na,D} + I_{Dr,D} + I_{leak}^D + \frac{g_c}{1-K}(V_y^S - V_y^D) + I_{FB,E}^y + I_{FB,I}^y \quad \text{Dendrite}$$

Where

Object ■

$$I_{Na,S} = g_{Na,S} \cdot m_{\infty,S}^2(V_y^S) \cdot (1 - n_S)(V_{Na} - V_y^S), \quad I_{Dr,S} = g_{Dr,S} \cdot n_S^2 \cdot (V_K - V_y^S),$$

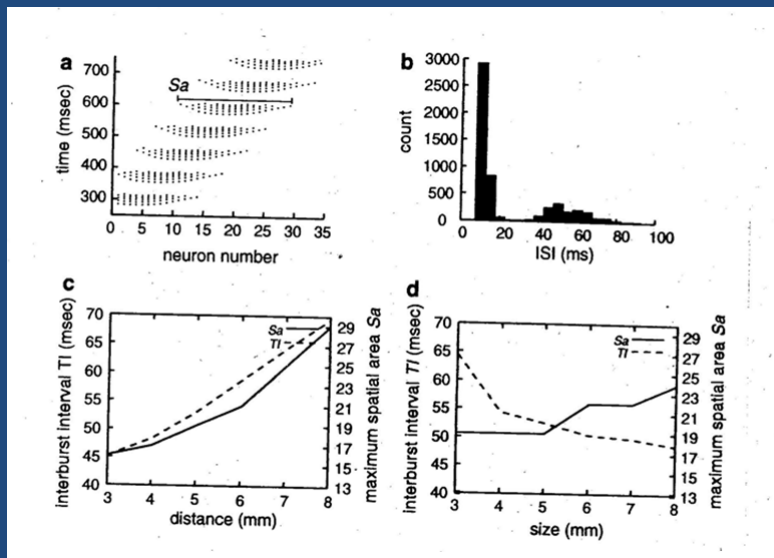
$$I_{leak}^S = g_{leak}(V_l - V_y^S),$$

$$I_{Na,D} = g_{Na,D} \cdot m_{\infty,D}^2(V_y^D) \cdot h_D(V_{Na} - V_y^D), \quad I_{Dr,D} = g_{Dr,D} \cdot n_D^2 \cdot p_D(V_K - V_y^D),$$

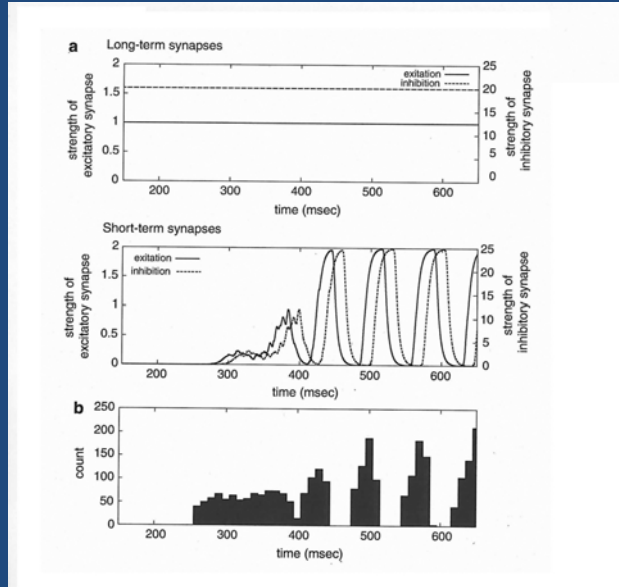
$$I_{leak}^D = g_{leak}(V_l - V_y^D), \quad \frac{dn_S}{dt} = \frac{n_{\infty,S}(V_y^S) - n_S}{\tau_{n,S}}, \quad \frac{dX_D}{dt} = \frac{X_{\infty,D}(V_y^D) - X_D}{\tau_{X,D}} \quad (X = h, n, p).$$

(Fujita et al., Biol Cybern, 2007)

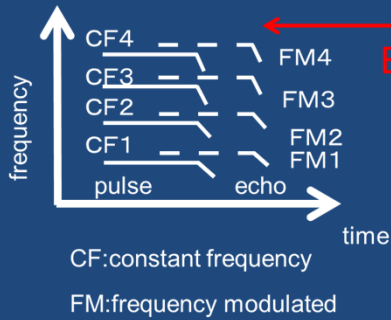
Distance and size



The role of feedback in burst coding



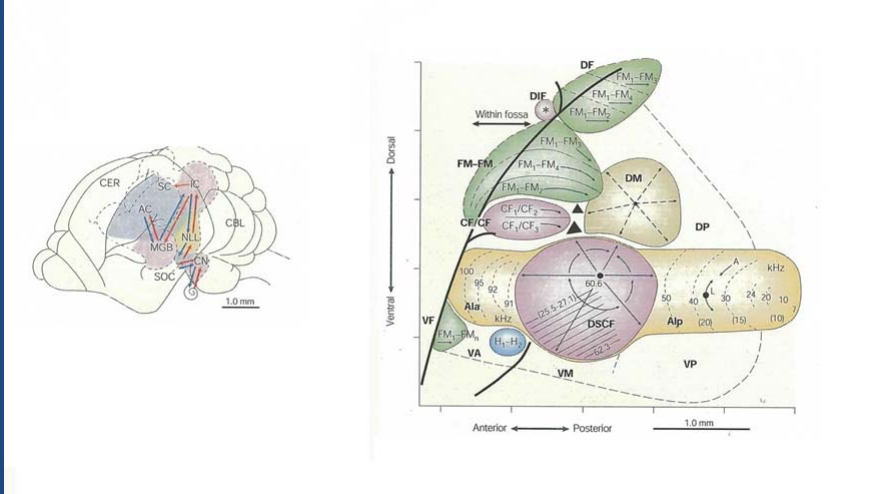
Echolocation



Echo reflecting from a target

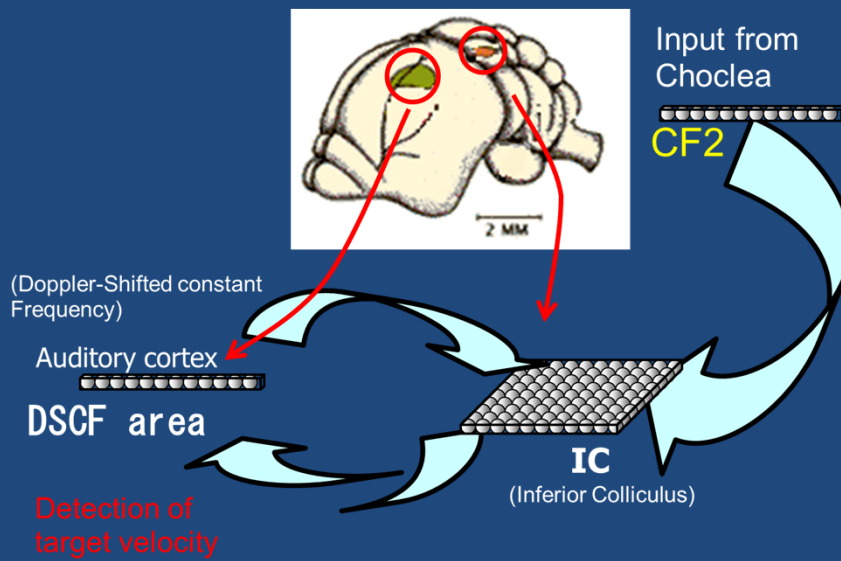
- Distance
- Size
- Relative velocity
- Texture

The brain and the auditory cortex of the mustached bat



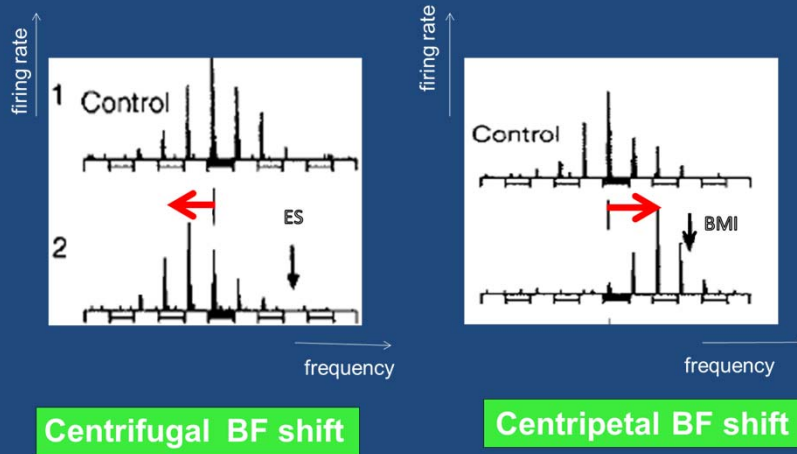
(Suga and Xiao 2001)

Neural pathway for detecting sound features of a flying insect



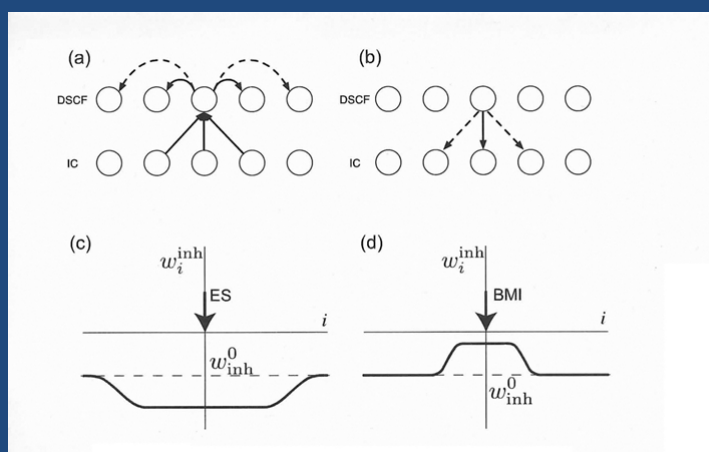
Egocentric selection

Two types of BF shifts in IC



(Xiao and Suga, 2002)

Network model



(Fujita and Kashimori, Neural Proc Lett, 2015)

Equations of the network model

$$\frac{dV_i^{IC}}{dt} = 0.04(V_i^{IC})^2 + 5V_i^{IC} + 140 - u_i^{IC} + \sum_{j=1}^N X_{ij}^{IC-DC} + \xi_i^{IC}, \quad (1)$$

$$\frac{du_i^{IC}}{dt} = \lambda a(bV_i^{IC} - u_i^{IC}), \quad (2)$$

where

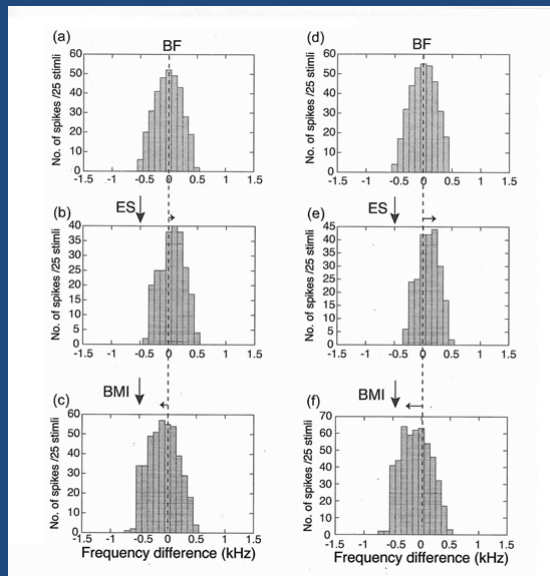
$$I_i^{IC} = I_0^{IC} \exp\left(-\frac{(i - i_0)^2}{\sigma_{Ch}^2}\right). \quad (3)$$

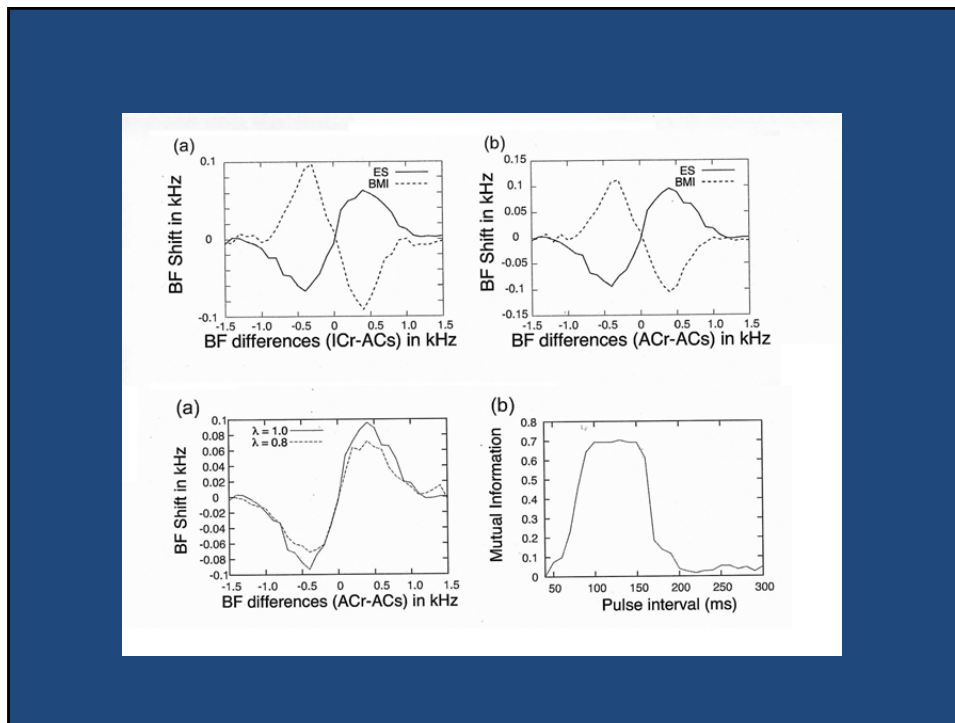
$$\tau_{PSP} \frac{dX_{ij}^{IC-DS}}{dt} = -X_{ij}^{IC-DS}, \quad (4)$$

$$w_{ij}^{IC-DS} = w_{exc}^{FB} H(x_{exc}^{IC} - |i - j|) - w_{inh}^{FB} H(x_{inh}^{IC} - |i - j|). \quad (5)$$

$$H(x) = \begin{cases} 1 & x \geq 0, \\ 0 & x < 0, \end{cases}$$

Centrifugal and centripetal BF shifts





Future works

- Electrolocatin: electric image, neural coding of target distance and its size, hyperacuity of phase information,
→ **shape ?**
- Echolocation: neural coding of target distance, neural mechanism of corticofugal modulation of tuning property
→ **detection of a flying insect ?**
- Sound localization: information processing of IID and ITD, binding mechanism
→ **head direction, attention ?**

脳の情報処理機構

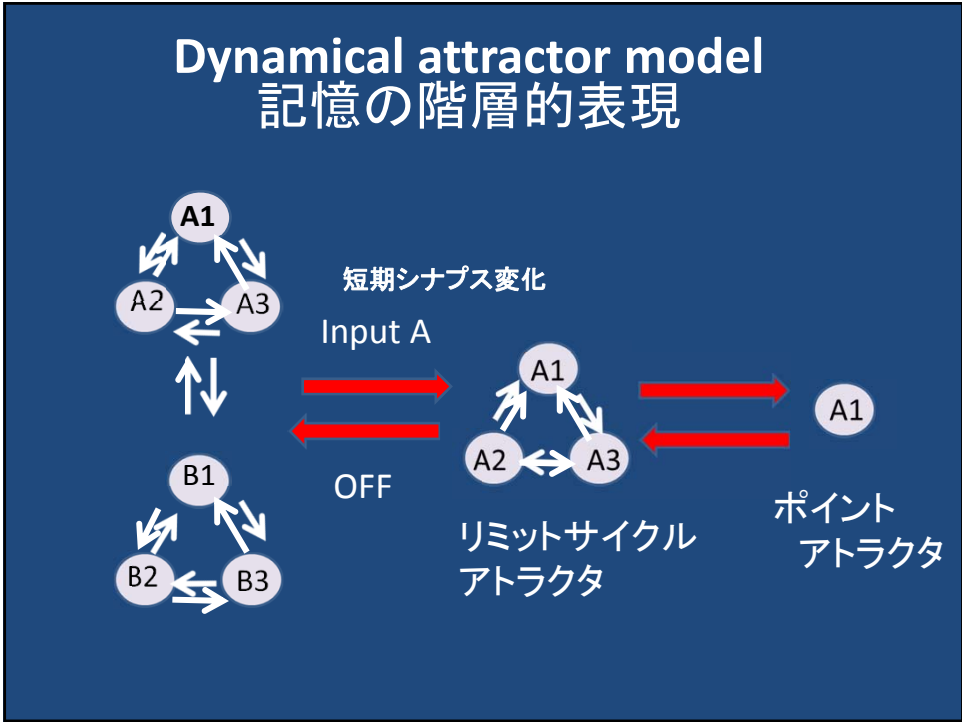
- **トップダウン的アプローチ**

構成要素のモデルはできる簡単にして、システム全体の状態や機能についてどのようなものが生じてくるのかを調べる。システム全体の働きをある程度理解してから、サブシステムさらには構成要素をより現実的なものに近づけていく方式である。

トップダウン的アプローチ

Dynamic processing of sensory information (Attractor models)

- Olfactory system
odor information processing in olfactory bulb and piriform cortex
- Visual system
categorization, face perception, top-down influence
- Auditory system
word perception, information processing in A1
- Gustatory system
Interaction between taste and odor information
- Somatosensory system (tactile, haptic)



Network model

$$\tau_{mj} \frac{du_{mj}(t)}{dt} = -u_{mj}(t) + \sum_{j=1}^N \sum_{d_{ij}=0}^{d_{max}} w_{mj,ij}(t, d_{ij}) \cdot V_{mj}(t - d_{ij})$$

$$+ w_{mq} U_{qi}(t) + w_{mr} U_{ri}(t) + I_i(t),$$

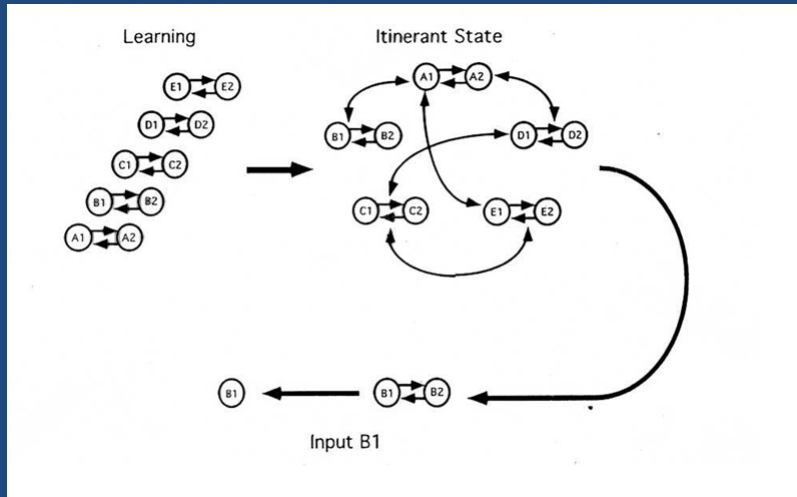
$$\tau_{qi} \frac{du_{qi}(t)}{dt} = -u_{qi}(t) + w_{qm} V_{mi}(t),$$

$$\tau_{ri} \frac{du_{ri}(t)}{dt} = -u_{ri}(t) + w_{rm} V_{mi}(t).$$

学習則

$$\tau_{wmm} \frac{dw_{mn,ij}(t, d_{ij})}{dt} = -w_{mn,ij}(t, d_{ij}) + \varepsilon V_{mi}(t) \cdot V_{mj}(t - d_{ij}).$$

Hierarchical processing in memory storage and recollection



Working memory in pair association task

Which is the pair of the pattern 1?

This block shows a sequence of images illustrating a pair association task. It starts with a pattern labeled '1' (a four-lobed shape). Below it are two options, '1'' and '2'', with '1'' being the correct match. An arrow labeled 'time' points upwards, indicating the sequence of images. At the bottom left, there is a small image of a monkey's face.

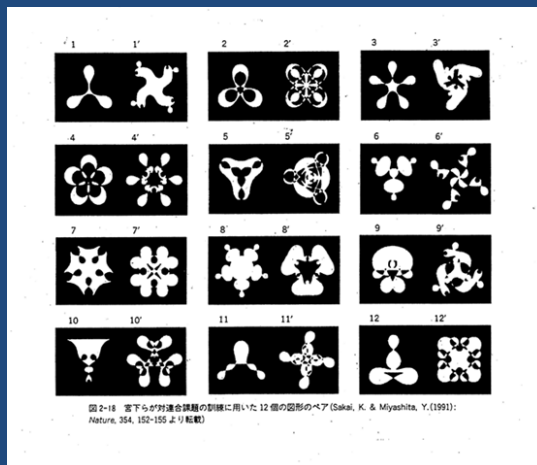
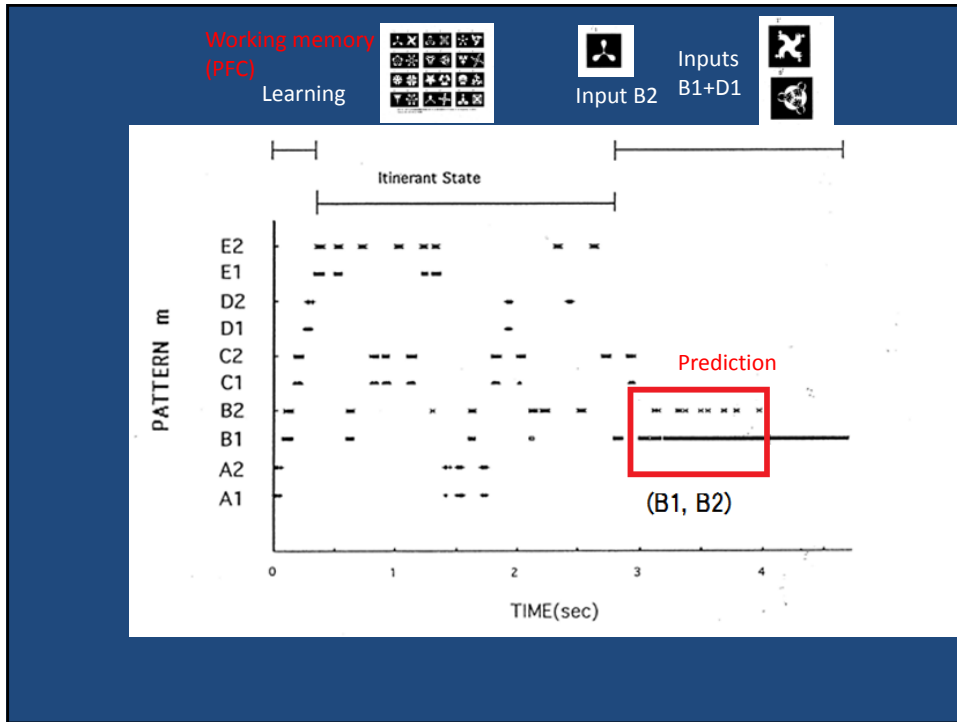


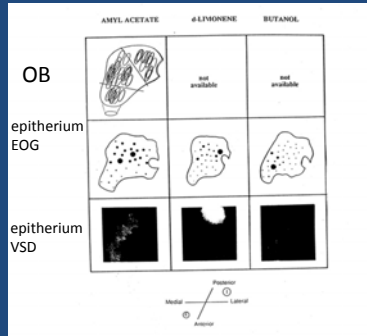
図 2-18 右下から対連合課題の訓練に用いた 12 個の図形のペア (Sakai, K. & Miyashita, Y., 1991): Nature, 354, 152-155 より転載)

(Sakai and Miyashita, 1991)



Dynamic coding of odor information

Dynamic coding of odor information



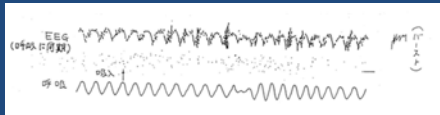
Neural model of olfactory system

W. Freeman (1987)

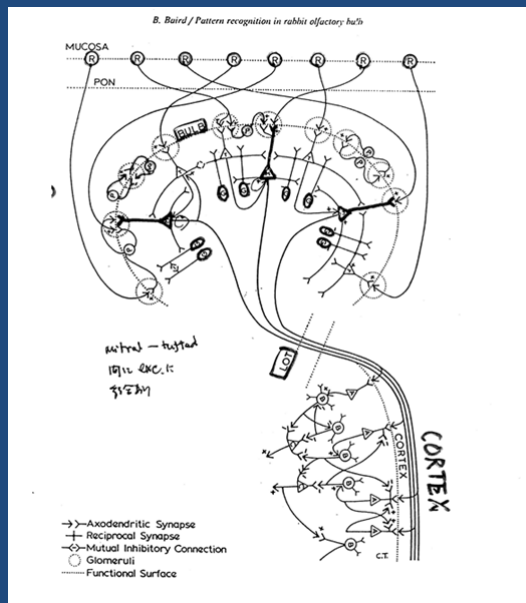
Spike coding of stimulus intensity

J.J. Hopfield (1995)

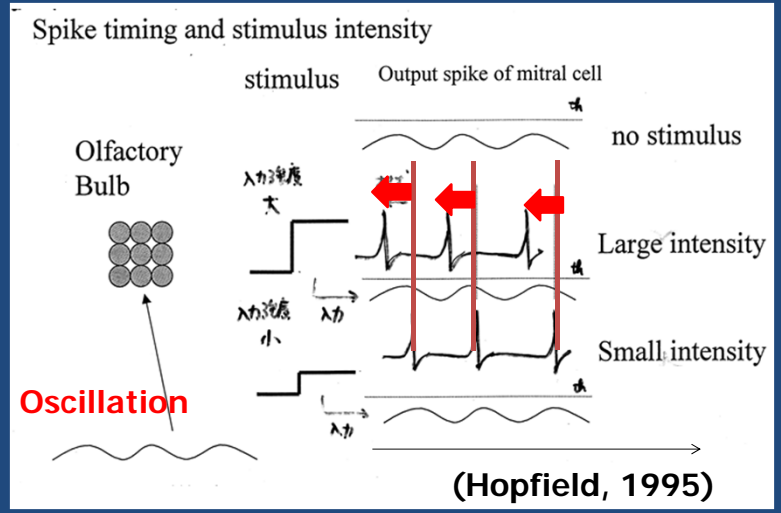
EEG



Neural pathway of olfactory processing



Spike coding of stimulus intensity



Neural network model of olfactory bulb

ON ON olfactory nerves

glomerular layer

PG M mitral cell layer

granule cell layer

G

LOT

feedback input olfactory cortex

● excitatory synapse

○ inhibitory synapse

Equations

Mitral cell

$$\tau_{mj} \frac{du_{mj}(t)}{dt} = -u_{mj}(t) + \sum_{j=1}^N \sum_{d_j=0}^{d_{max}} w_{nmij}(t, d_j) V_{mj}(t - d_j) + \sum_{k=1(k \neq i)}^N w_{mpjk} V_{pk}(t) + w_{mq} U_{qj}(t) + I_{mj}(t)$$

Granule cell

$$\tau_{gj} \frac{du_{gj}(t)}{dt} = -u_{gj}(t) + w_{gm} U_{mj}(t) + I_{gm}(t)$$

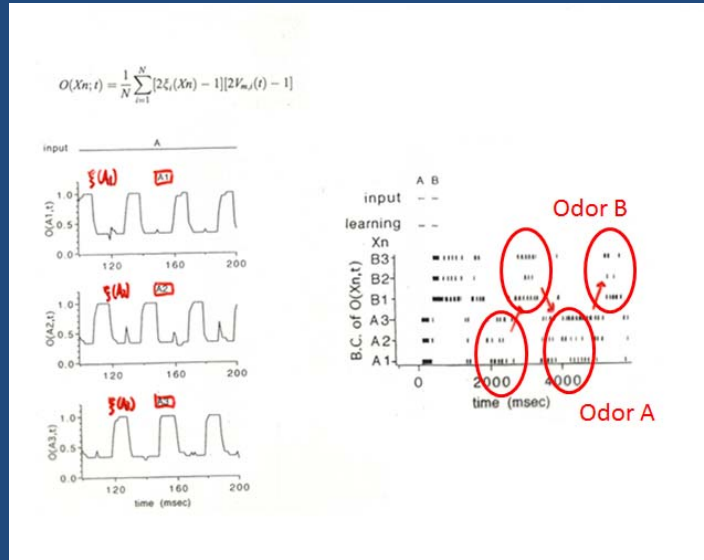
Prob[$V_{mj}(t) = 1$] = $f_m[u_{mj}(t)]$

Prob[$V_{gj}(t) = 1$] = $f_g[u_{gj}(t)]$

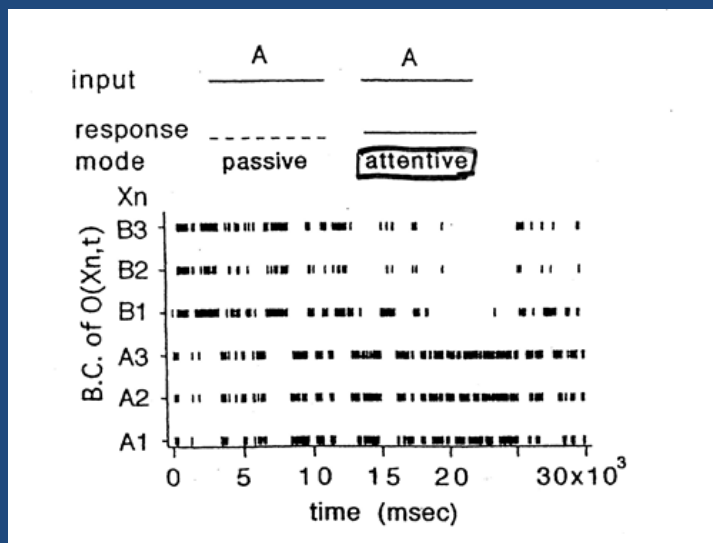
学習

$$\tau_{w_{nmij}} \frac{dw_{nmij}(t, d_j)}{dt} = -w_{nmij}(t, d_j) + \eta V_{mi}(t) V_{mj}(t - d_j)$$

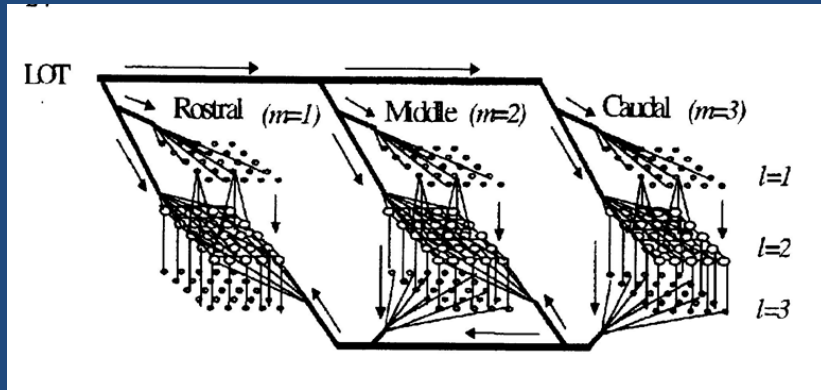
Coding of odor information in olfactory bulb



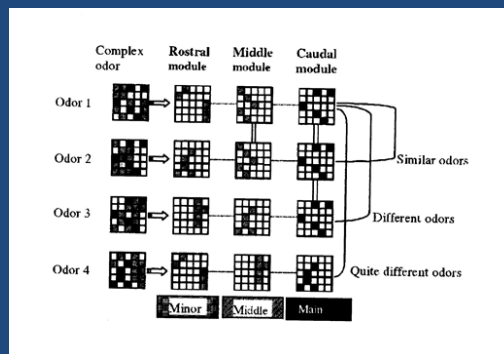
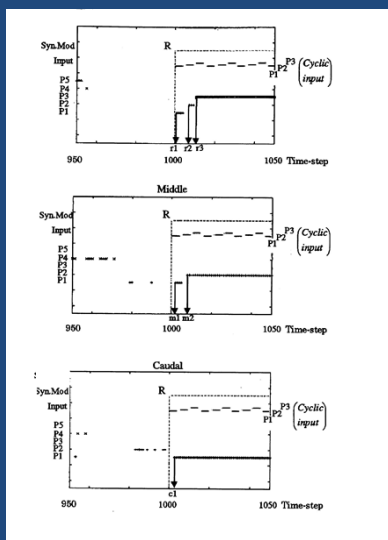
Representation of odor information by dynamical attractors



Neural network model of olfactory cortex

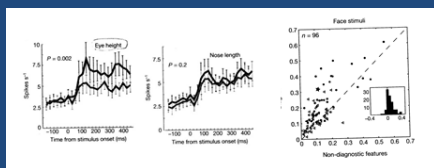
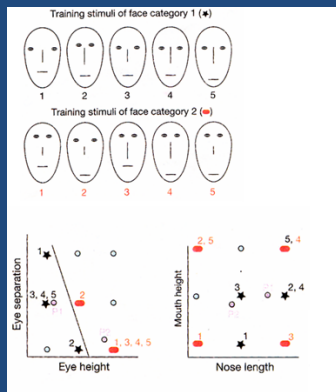


Hierarchical discrimination of odor components

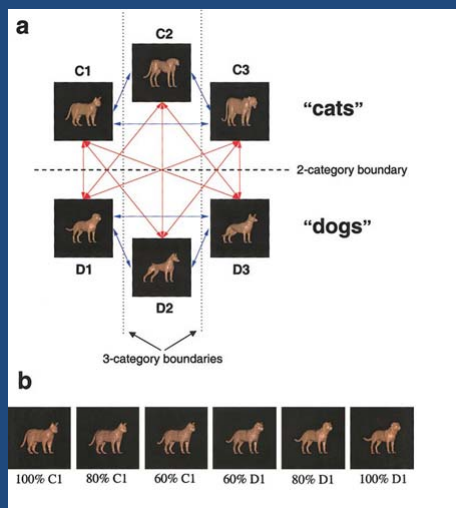


Neural mechanism of visual categorization

Visual categorization

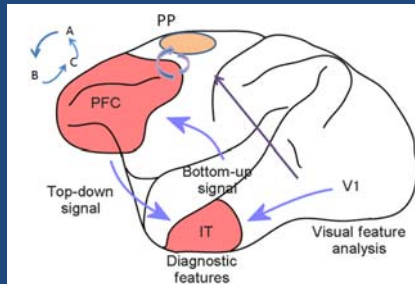


(Sigala & Logothetis, 2000)

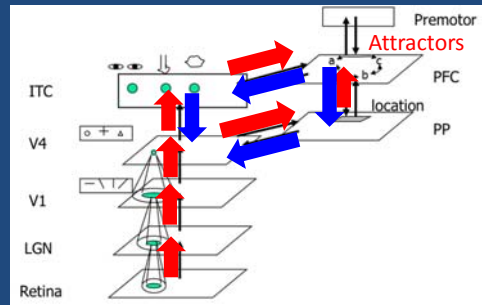


(Freedman et al., 2001)

Neural mechanism for visual categorization



Model



(Soga and Kashmiri, Vision Res, 2008)

Equations of PP neurons

$$\tau_{PP} \frac{dV_{PP}^{ij}}{dt} = -V_{PP}^{ij} + \sum_{k,l,m} w_{V4-PP}^{FF}(ij; kl, m) X_{V4}(kl, m) + I_{PFC-PP}^{FB},$$

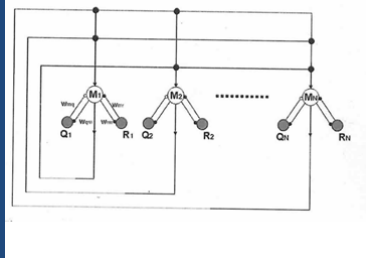
$$X_{PP}^{ij} = \frac{1}{1 + \exp\left(-\left(V_{PP}^{ij} - V_{PP}^{th}\right)/\varepsilon_{PP}\right)},$$

Equations of ITC neurons

$$\tau_{ITC} \frac{dV_{ITC}^l}{dt} = -V_{ITC}^l + \sum_{ij,k} w_{ITC}(k, ij; l) X_{V4}(ij, k) + I_{PFC-ITC}^{FB},$$

$$X_{ITC}^l = \frac{1}{1 + \exp\left(-\left(V_{ITC}^l - V_{ITC}^{th}\right)/\varepsilon_{ITC}\right)},$$

Network model of PFC

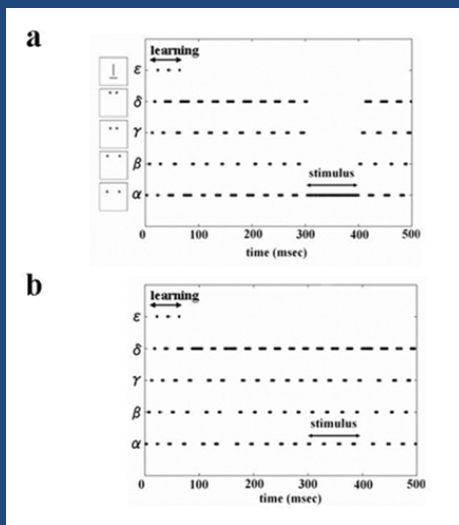
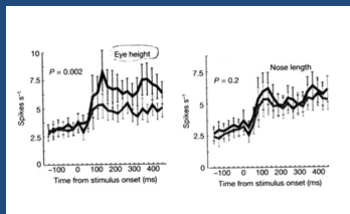
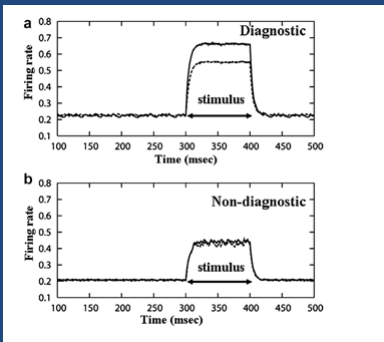


$$\tau_m \frac{du_m(ij; t)}{dt} = -u_m(ij; t) + \sum_{kl} \sum_{\tau_{ij,kl}^d=0}^{\tau_m} w_{mn}(ij; kl; t; \tau_{ij,kl}^d) X_m(kl; t - \tau_{ij,kl}^d) + w_{mq} U_q(ij; t) + w_{mr} U_r(ij; t) + \sum_k w_{ITC-PFC}^{FF}(ij; k; t) X_{ITC}^k + \sum_{m,n} w_{PP-PFC}^{FF}(ij; mn; t) X_{PP}^{mn} + I_{PFC-PM}^{FB}$$

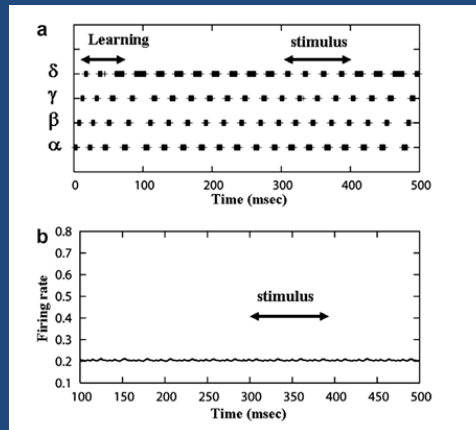
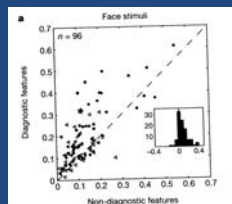
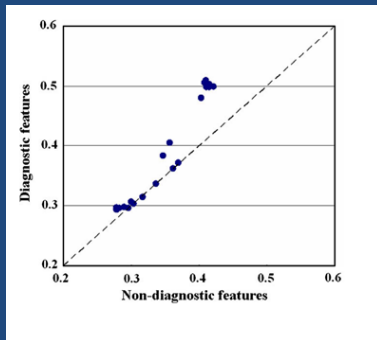
$$\tau_q \frac{du_q(ij; t)}{dt} = -u_q(ij; t) + w_{qm} X_m(ij, t),$$

$$\tau_r \frac{du_r(ij; t)}{dt} = -u_r(ij; t) + w_{rm} X_m(ij, t),$$

Responses of ITC and PFC neurons



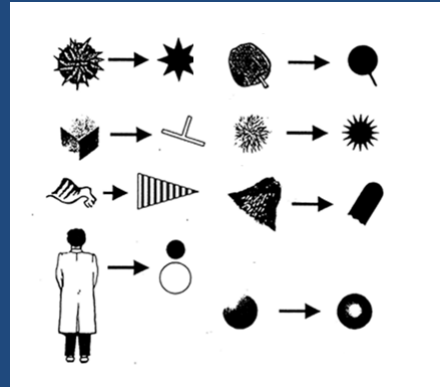
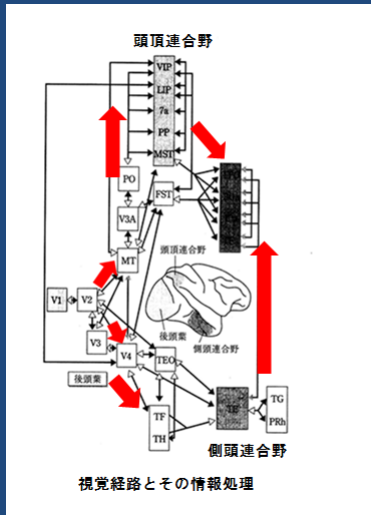
Response preference of ITC neurons for face features



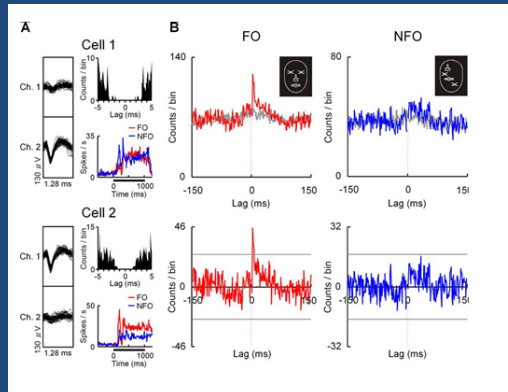
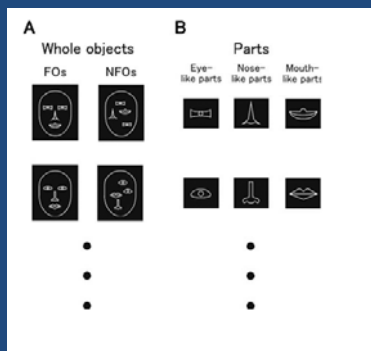
Response of the PFC network and of an ITC neuron induced by lesion of PP

Neural mechanism of dynamic responses of neurons in inferior temporal cortex in face perception

Hierarchical processing of face information in inferior temporal cortex

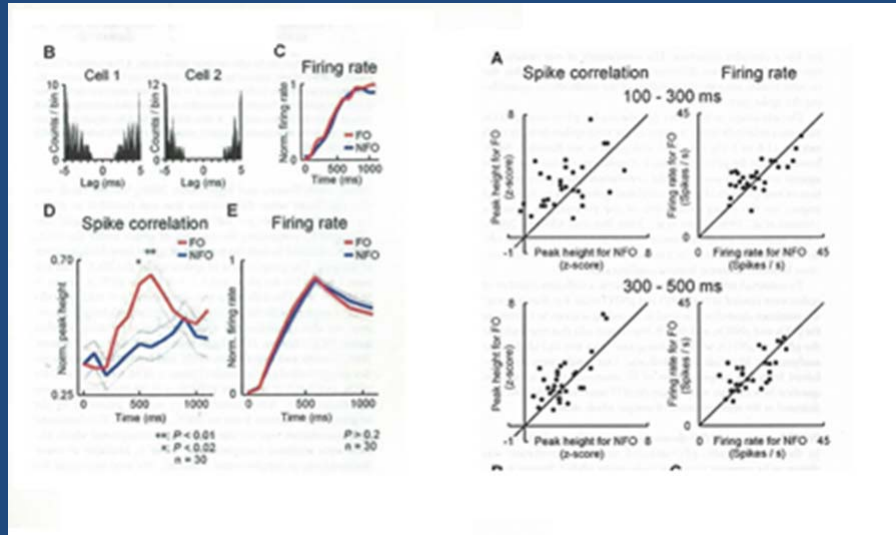


Highly correlated responses of IT neurons to face object



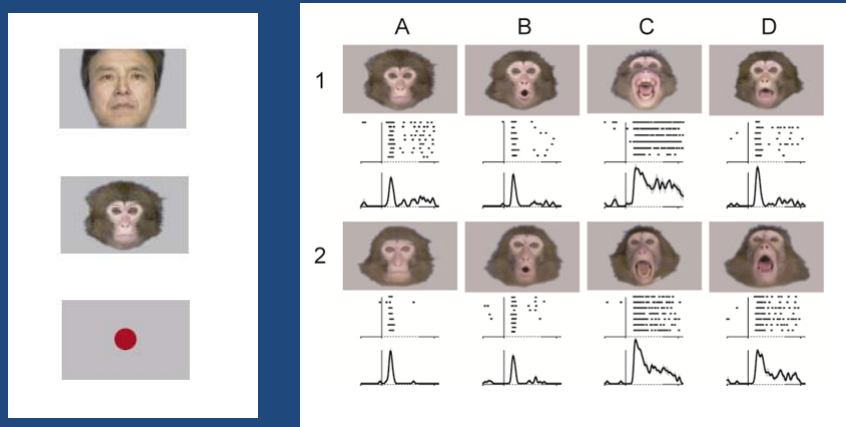
(Hiyabayashi and Miyashita, 2006)

Temporal properties of spike correlations and firing rates



(Hiyabayashi and Miyashita, 2006)

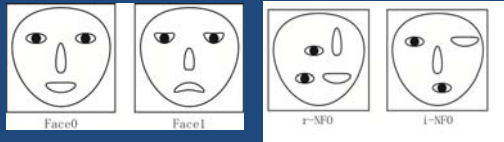
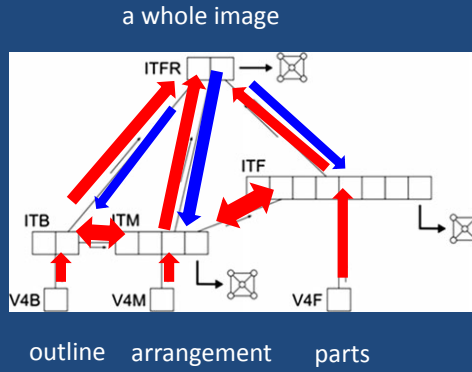
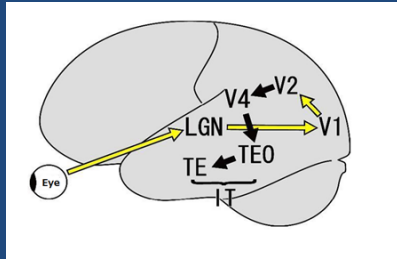
Spike coding of global and fine features of face images



(Sugase et al., 1999)

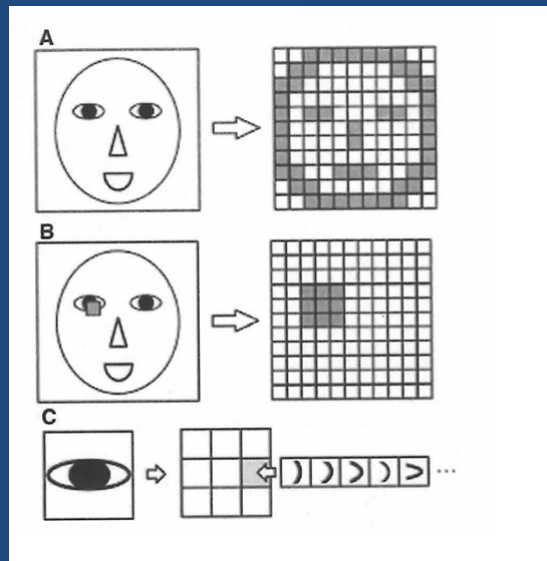
Network model of hierarchical processing of face information

Ventral visual pathway



(Yamada, and Kashimori, Cogn Neurodyn, 2013)

Coding of object features in V4 network



Equation of ITC neurons

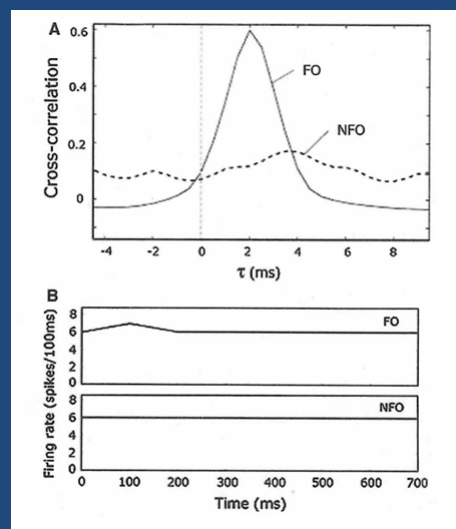
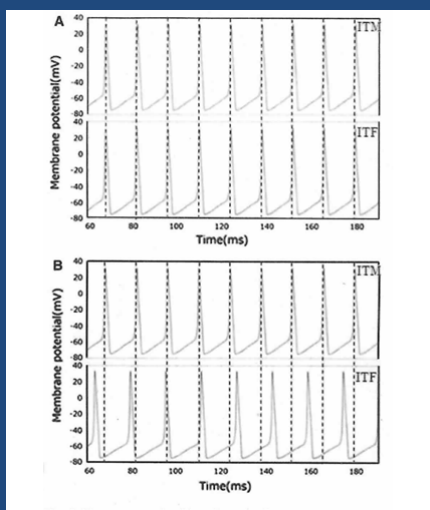
Membrane potentials of i th neuron in ITX layer
($X=B,M,F$)

$$C_m \frac{dV_{i,ITX}}{dt} = -g_{Na} m^3 h (V_{i,ITX} - V_{Na}) - g_K n^4 (V_{i,ITX} - V_K) - g_L (V_{i,ITX} - V_L) + I_{FF} + I_{FB}$$

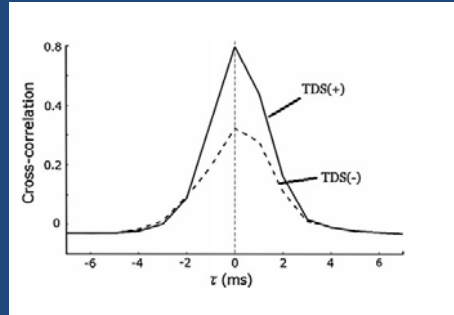
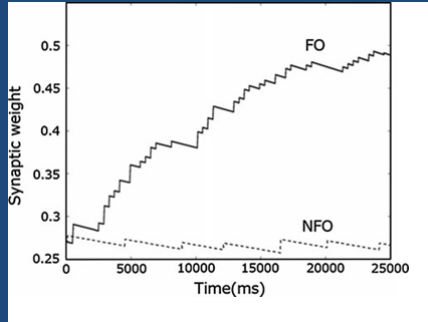
Synaptic weights between i th neuron in X layer and
 j th neuron in Y layer ($X,Y=ITB,ITM,ITF$, and FRL)

$$\tau_w \frac{dw_{ij,XY}^Z}{dt} = -w_{ij,XY}^Z + \eta S_{iX} S_{jY}$$

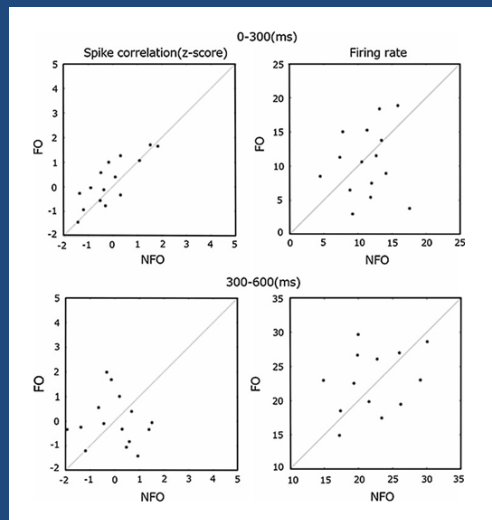
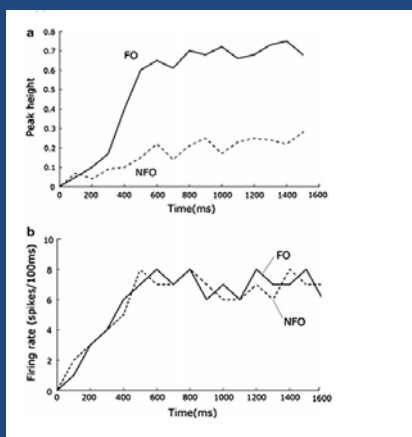
Response properties for a pair of ITF neurons encoding the features of eye and nose



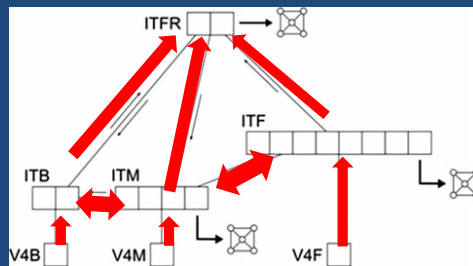
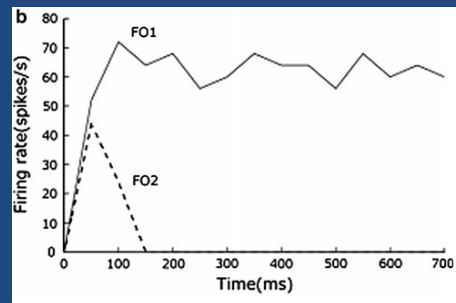
Effect of top-down signal on spike correlation of a pair of IT neurons



Calculated results

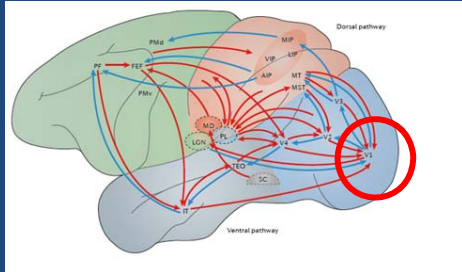


Coarse-to-fine process



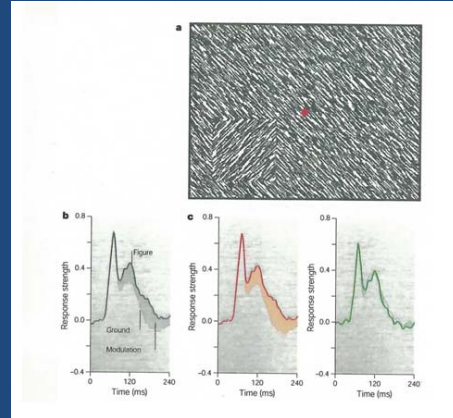
Top-down influence on V1 responses in perceptual learning

Top-down influence on V1 responses in perceptual learning



(Gilbert and Li, 2013)

- Li et al. 2004
- Ramalingam et al. 2013
- Li et al. 2006
- Gilbert and Sigman ,2007
- Tong, 2003

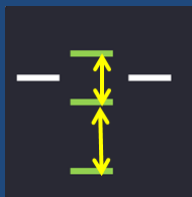


(Super et al., 2001)

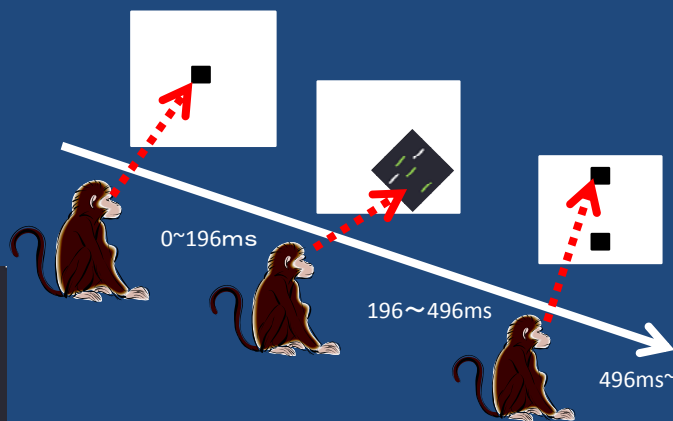
Five-bar discrimination task

66

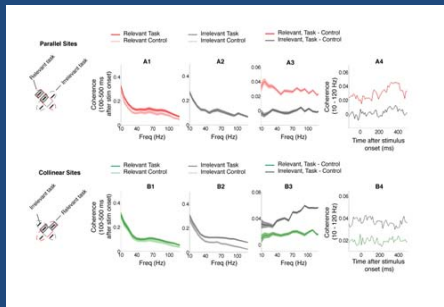
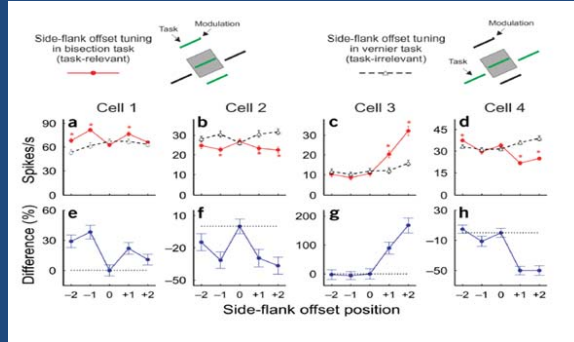
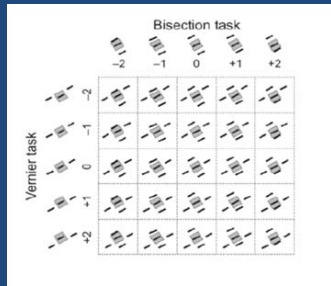
Bisection task



Vernier task

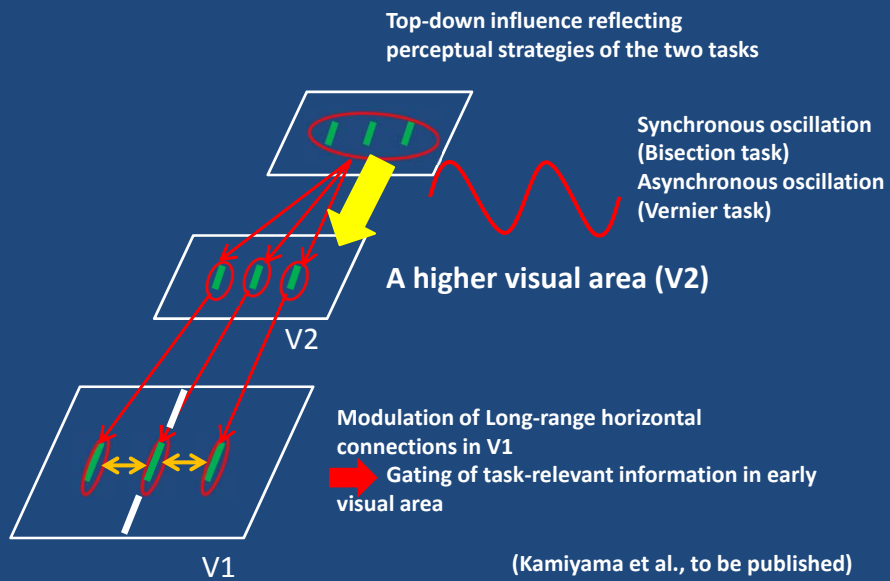


(Li et al. 2004)

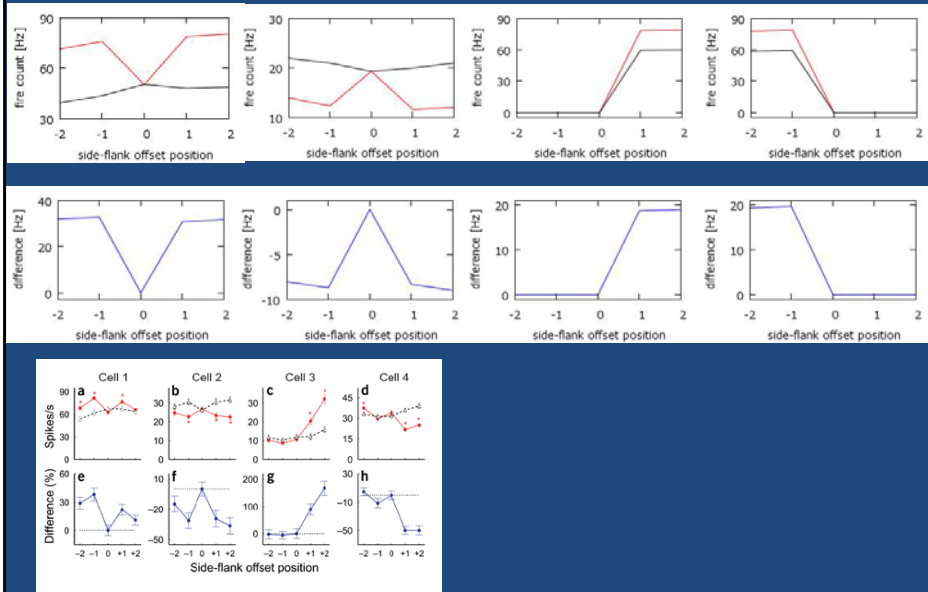


(Li et al. 2004)

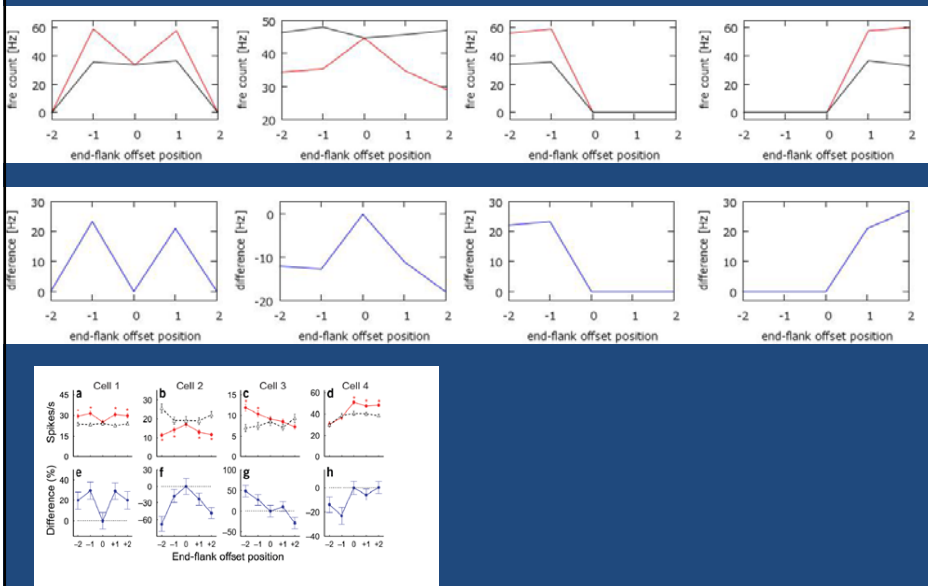
Our approach

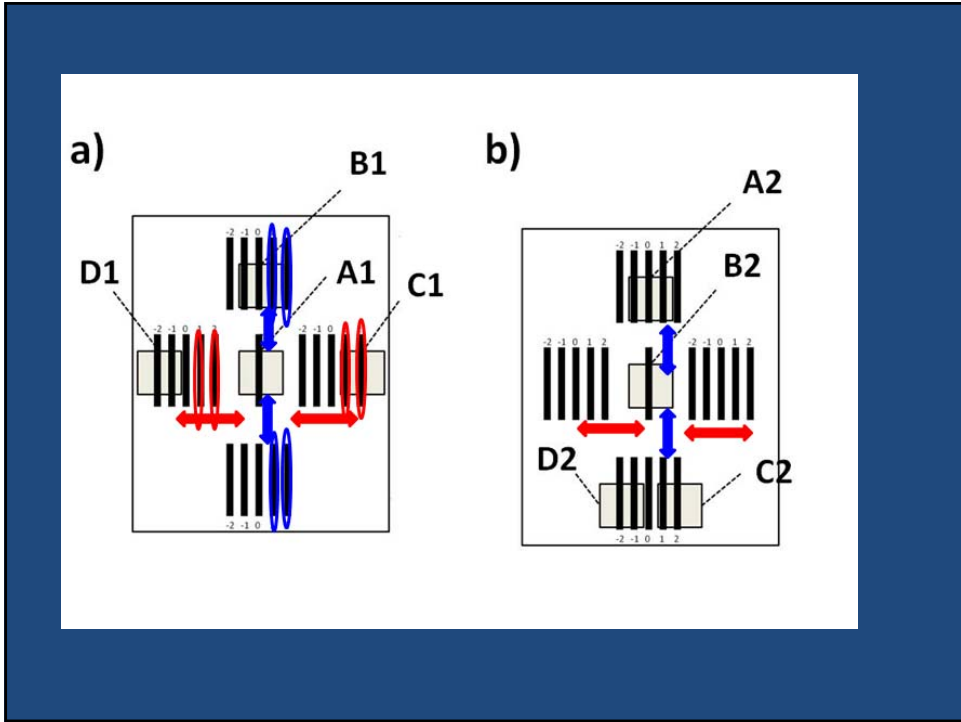


Bisection task

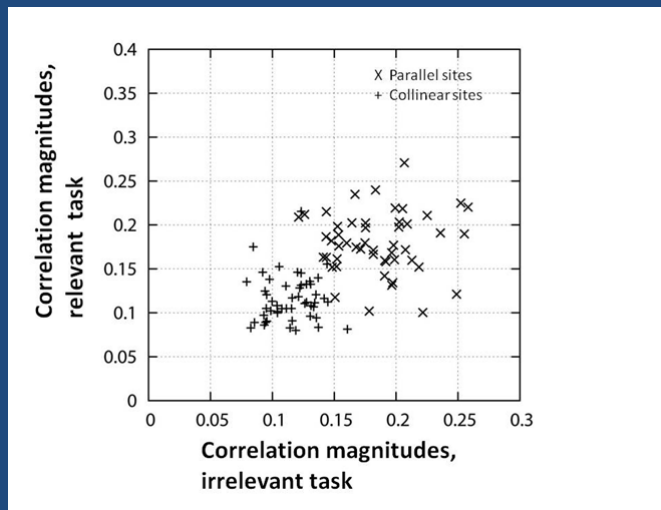


vernier task





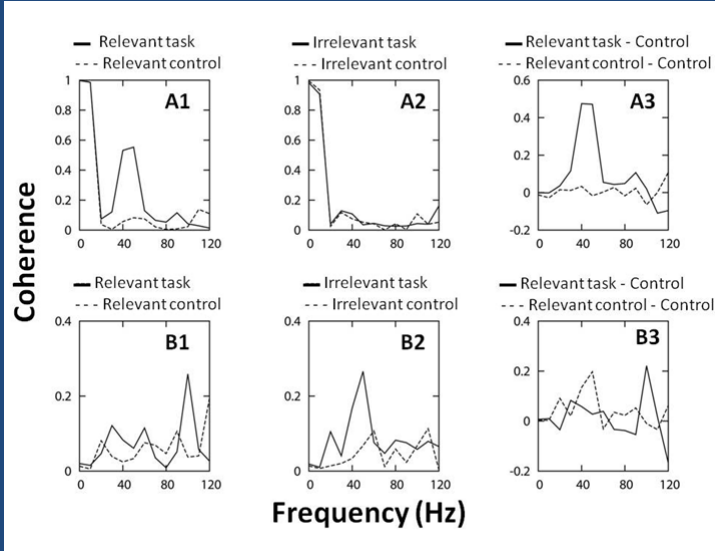
Spike correlations



LFP coherence

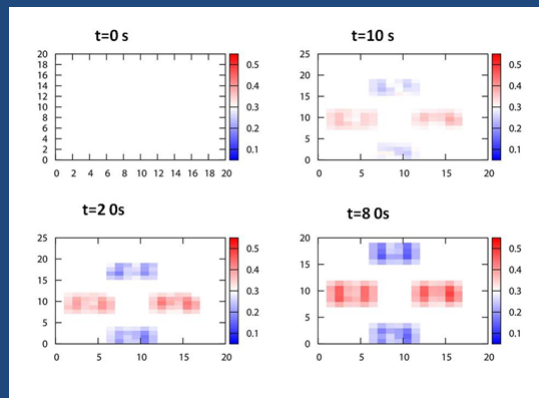
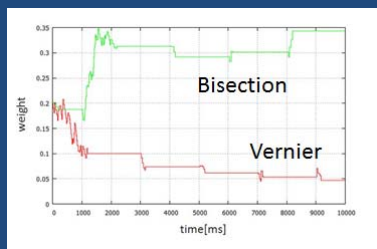
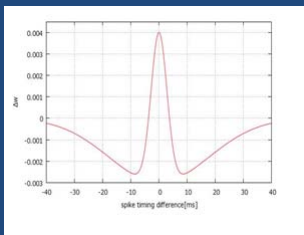
Bisection task

Vernier task



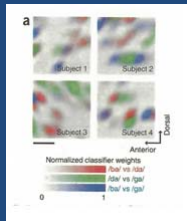
Formation of functional connectivity in the V1 network

Spike-timing dependent plasticity

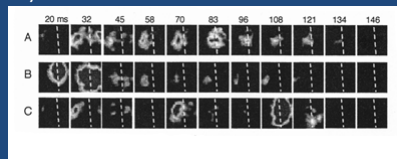


Decoding Word Information from Spatiotemporal Activity of Sensory Neurons

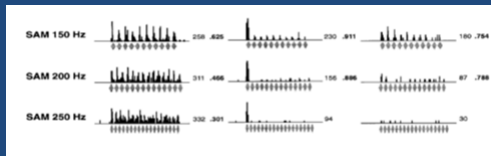
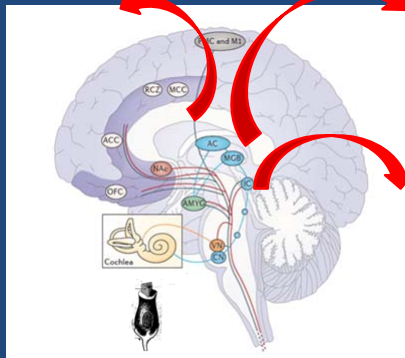
Hierarchical processing of auditory information



pSTG
(Chang et al., 2010)

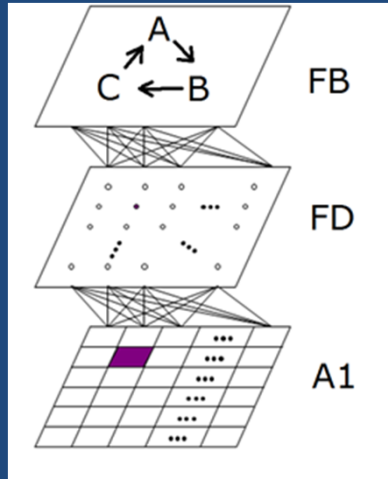
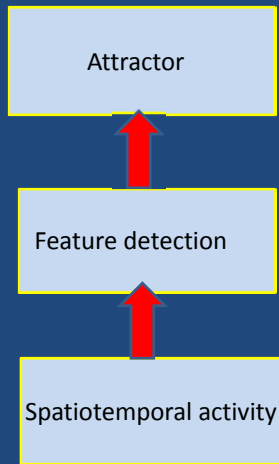


(Horikawa et al. 1996)



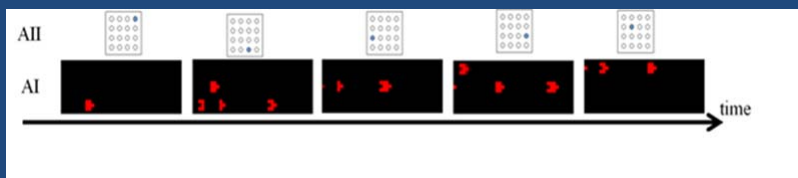
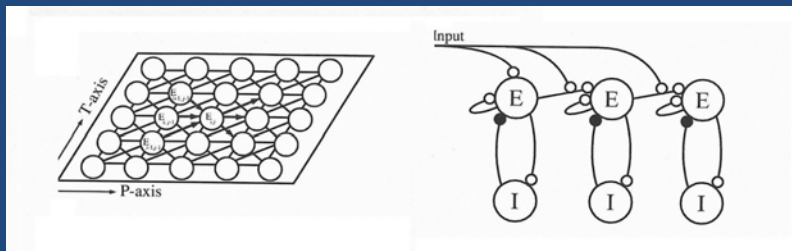
(Burger and Pollak, 1998)

Model

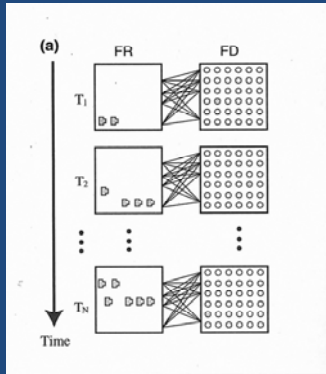


(Hara et al., Cog Comput, 2014)

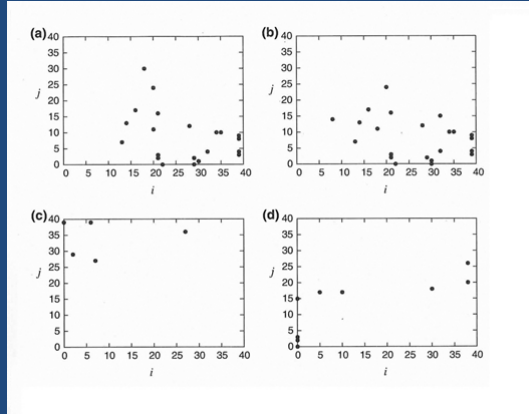
The model of A1



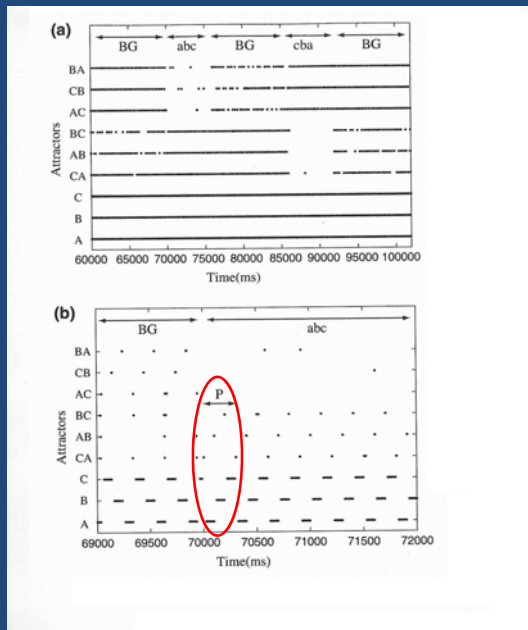
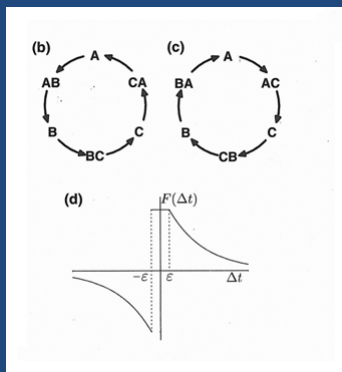
Model of FD layer



Responses of FD neurons



Model of FB layer



Attractor models

- Olfactory system
- Visual system
categorization, face perception, top-down influence
- Auditory system
word perception, information processing in A1
- Gustatory system,
interaction between odor and gustatory information
- Somatosensory system (tactile, haptic)

Future work

