

Problem #7: Modeling Fetal ECG/EEG during labor

5th problem solving
workshop

@ University of Montreal

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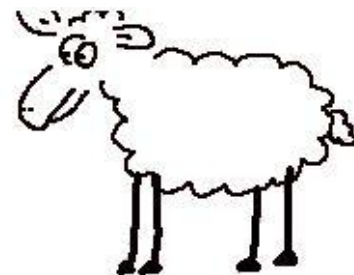
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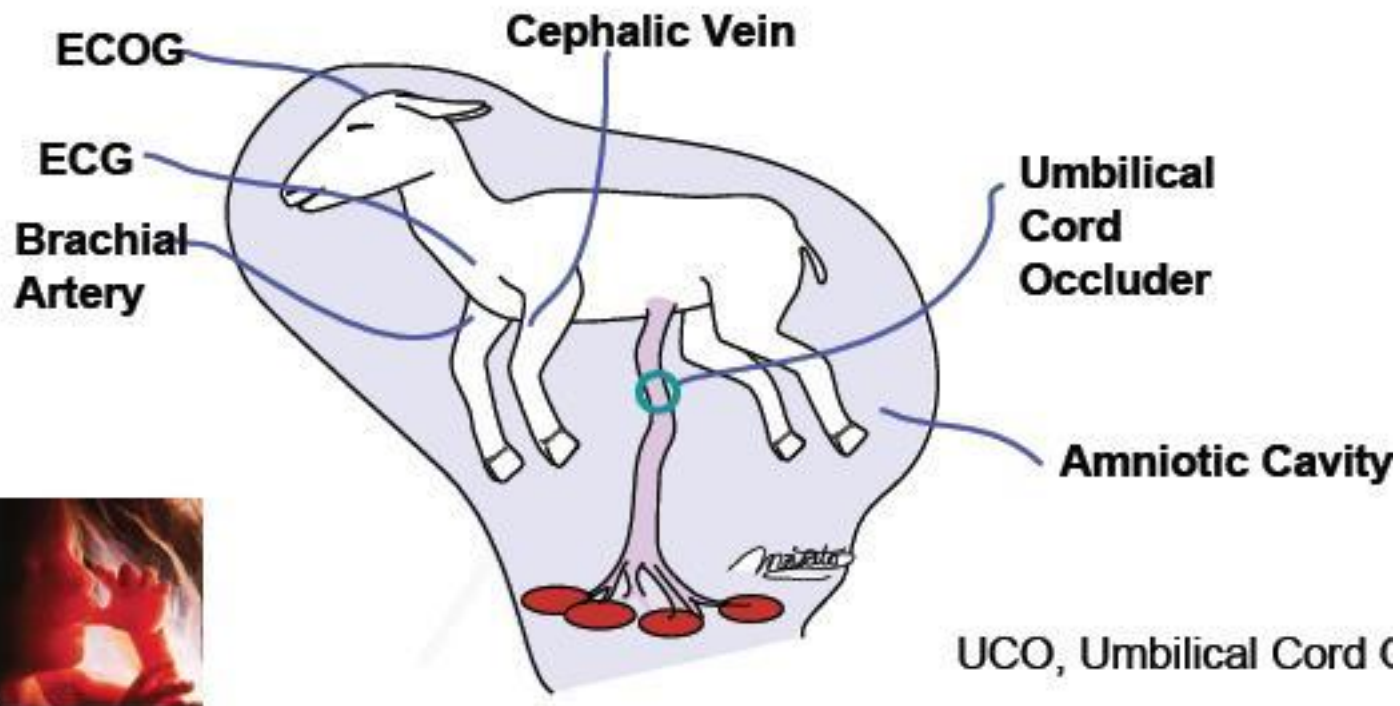
Josh Chang, Mathematical Biosciences Institute

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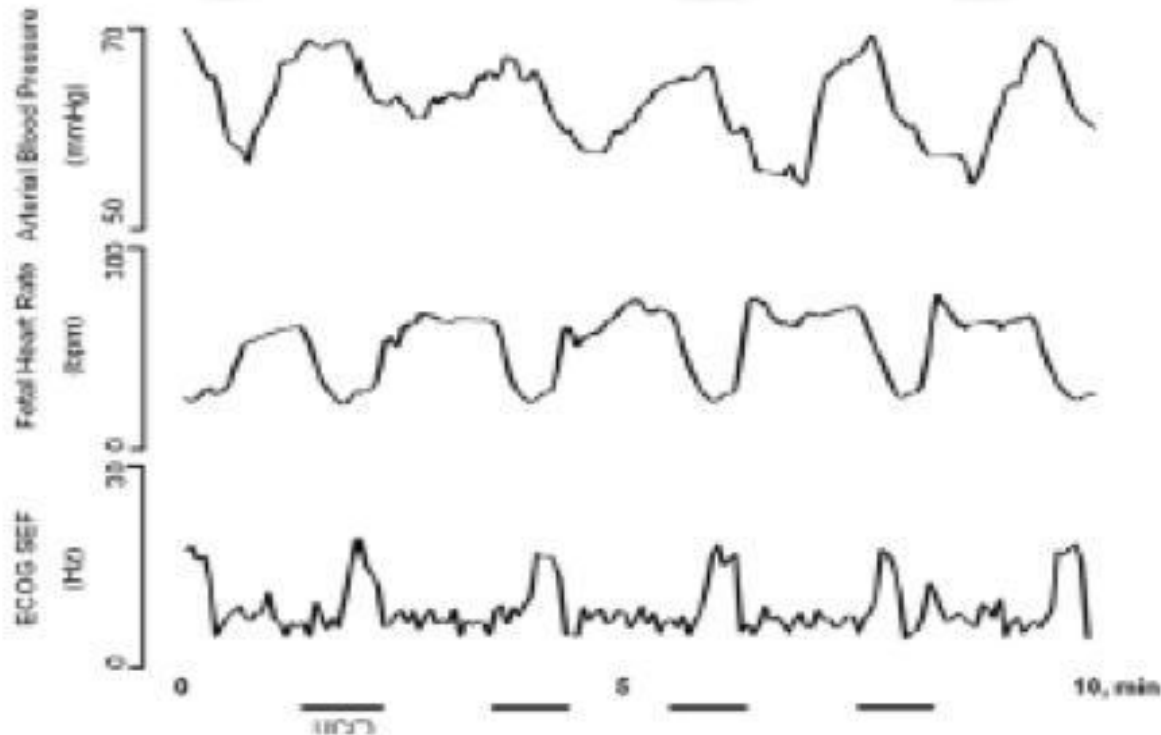


Problem under investigation ...



Available data for fetal EEG monitoring

Frasch et al 2011 PloS One



| | pH | AMP, μ V | SEF, Hz |
|------|-----------------------------|--------------|--------------|
| ECOG | 7.16 (65 min prior pH<7.00) | ↓ (4 fold) | ↑ (1.6 fold) |
| EEG | 7.14 (58 min prior pH<7.00) | ↓ (4 fold) | unchanged |

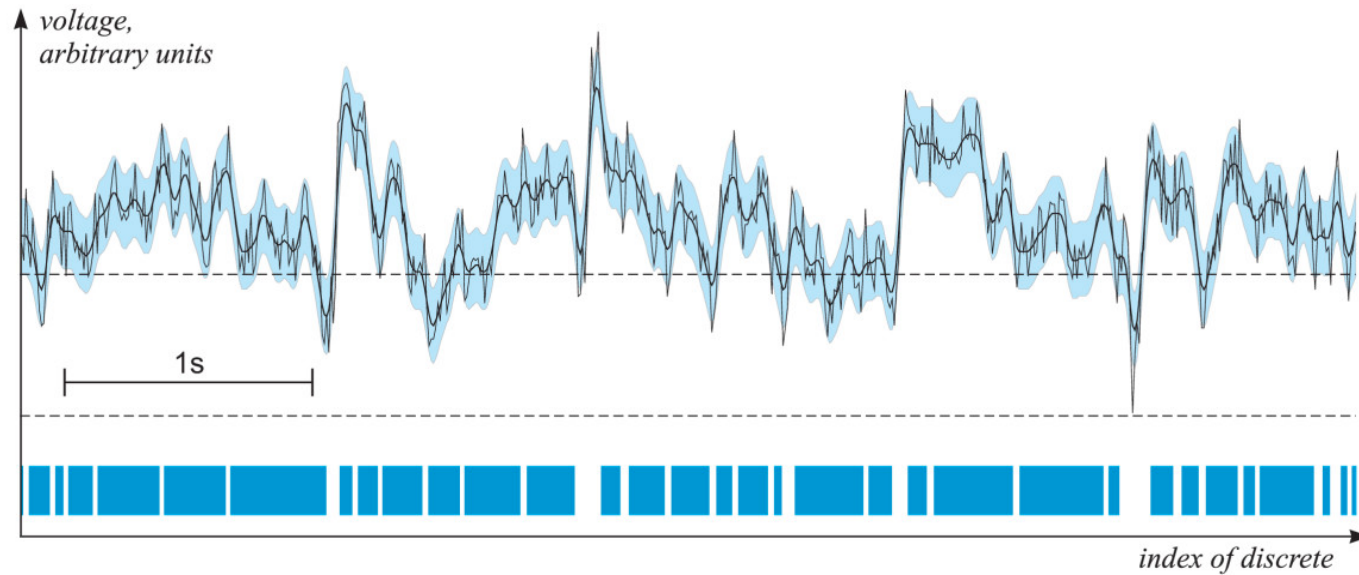
Objective

Prevent this:



source: <http://cerebralpalsy.org>

By recognizing patterns in this



Insights from signal processing on the raw data

Mathematical modeling of the EEG signal?

When UCO occurs, dominant frequency shifts to lower region!

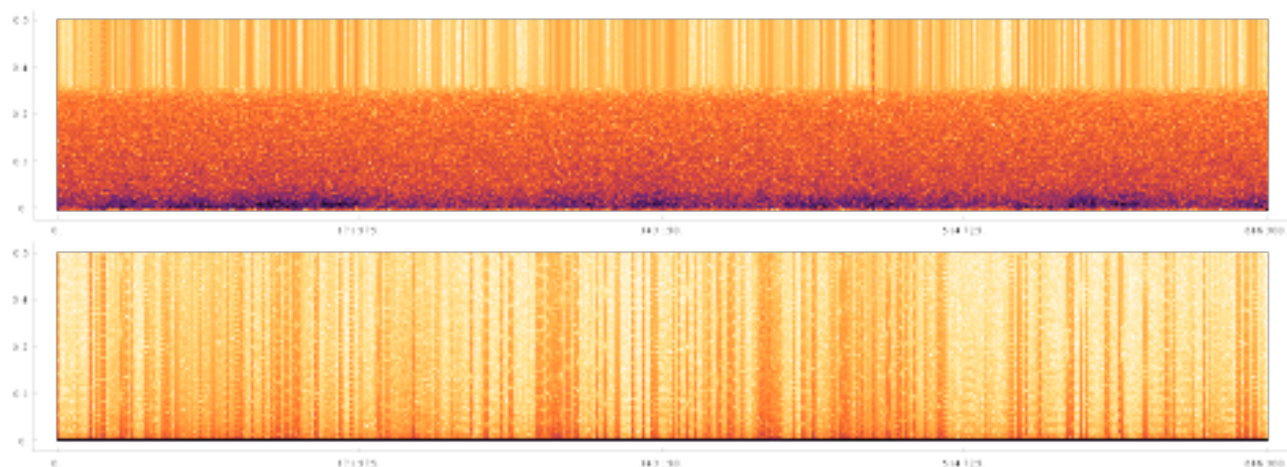


FIGURE 1 – Before the umbilical cord occlusions.

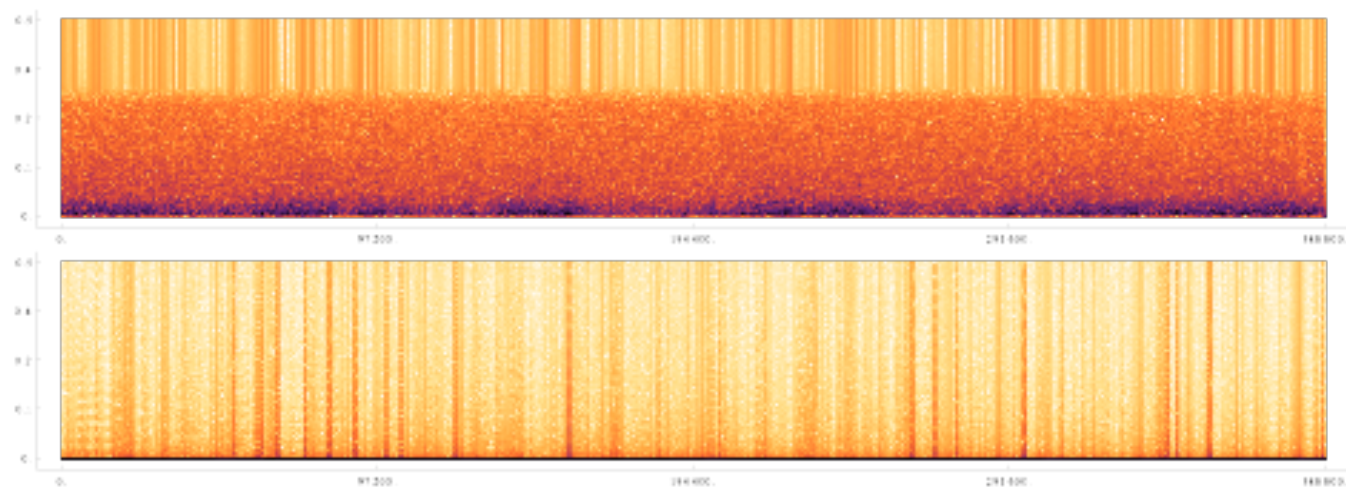


FIGURE 2 – Mild umbilical cord occlusions.

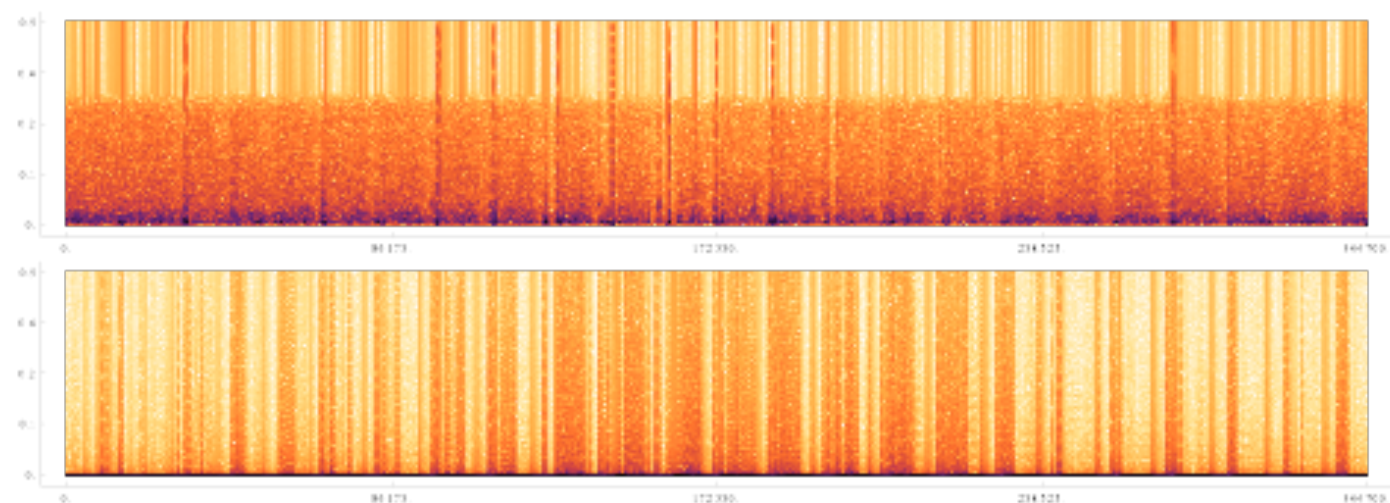


FIGURE 3 – Moderate umbilical cord occlusions.

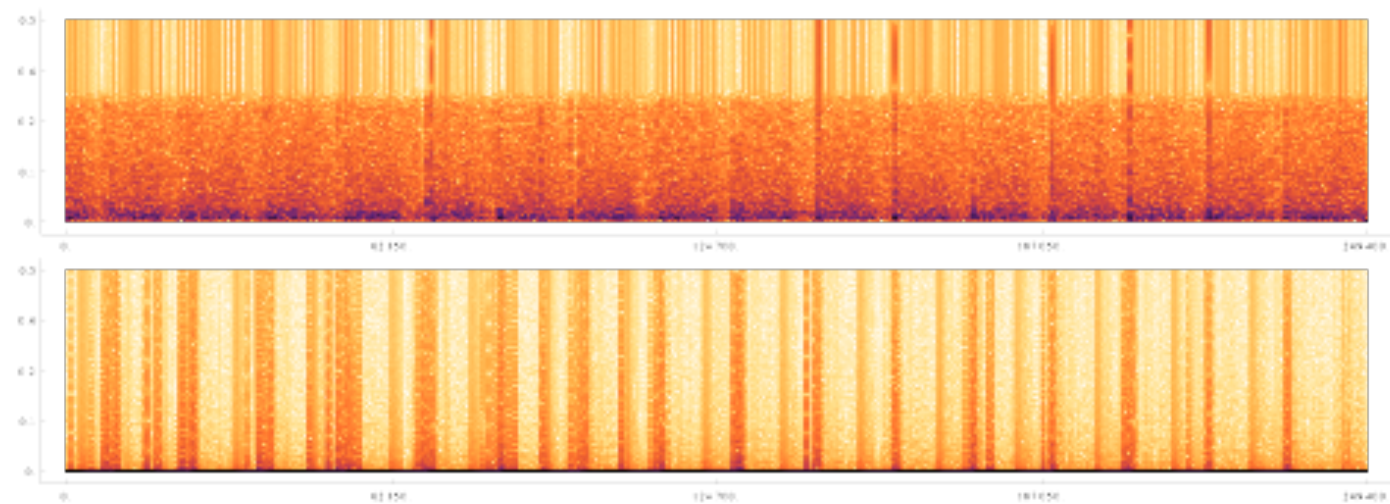


FIGURE 4 – Severe umbilical cord occlusions.

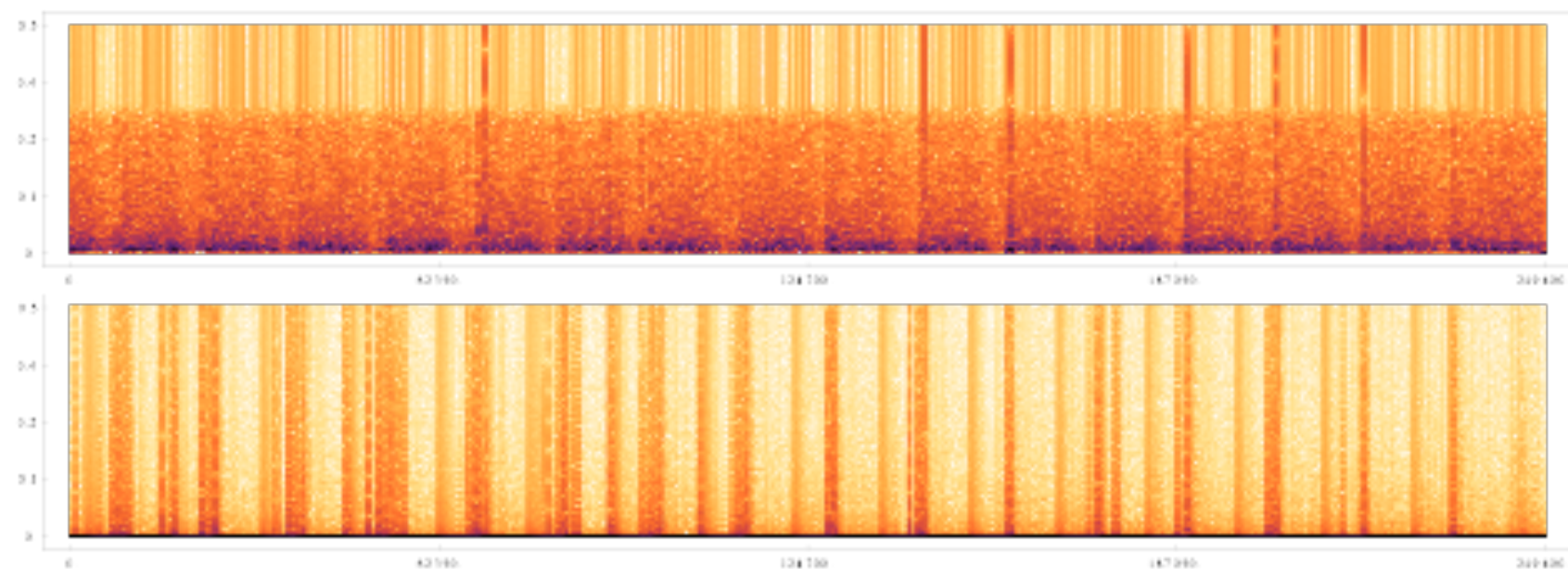
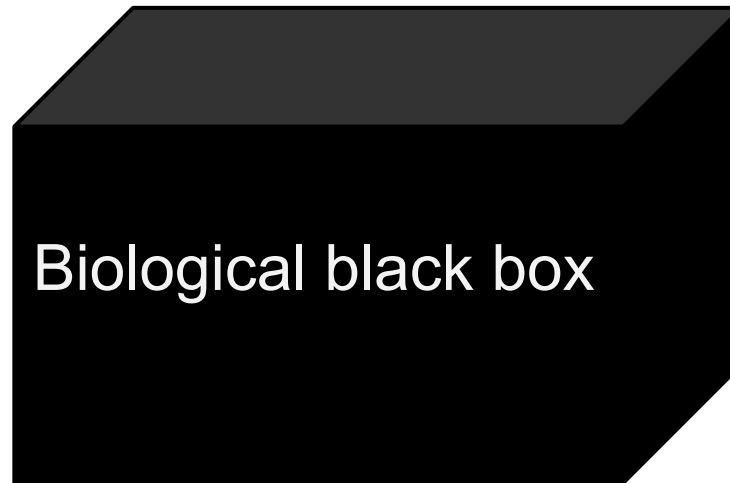


FIGURE 5 – Synchronisation of the FHR with the brain.

What's going on?

Clamp the umbilical cord



Biological black box



ECoG signal changes

Peering into the box

Occlusion and nutrient exchange

Fetal heart rate changes

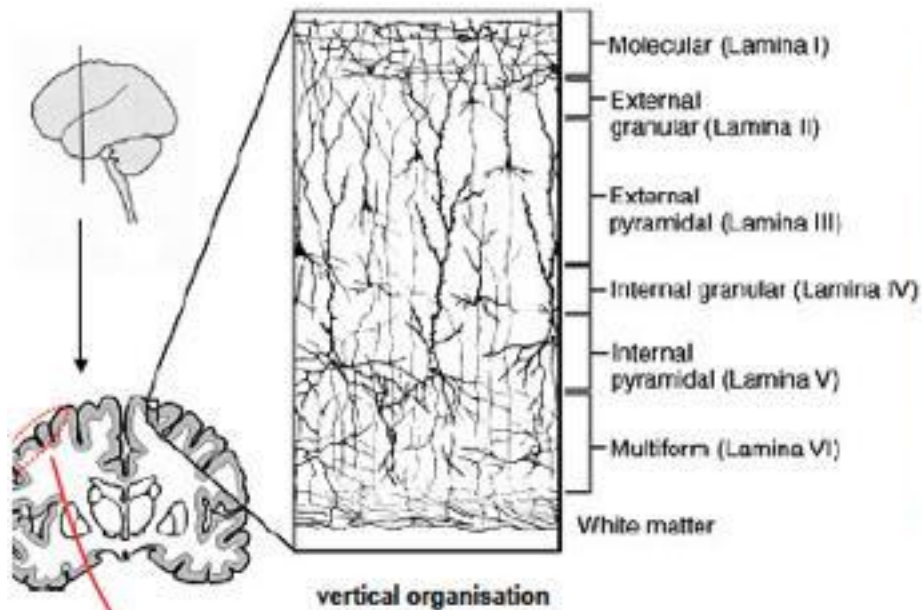
Blood flow and brain oxygenation

Oxygenation and ATP production

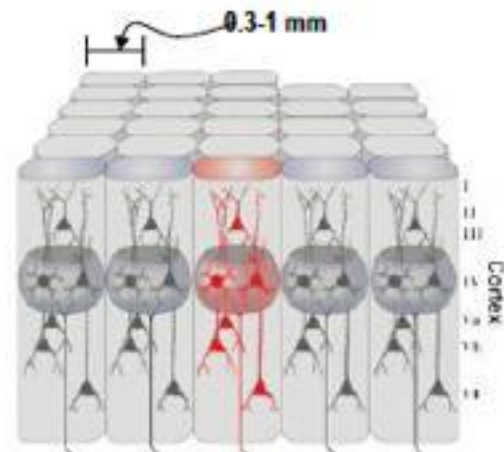
ATP and brain activity

Brain activity

EEG model



horizontal "parcellation" & organisation



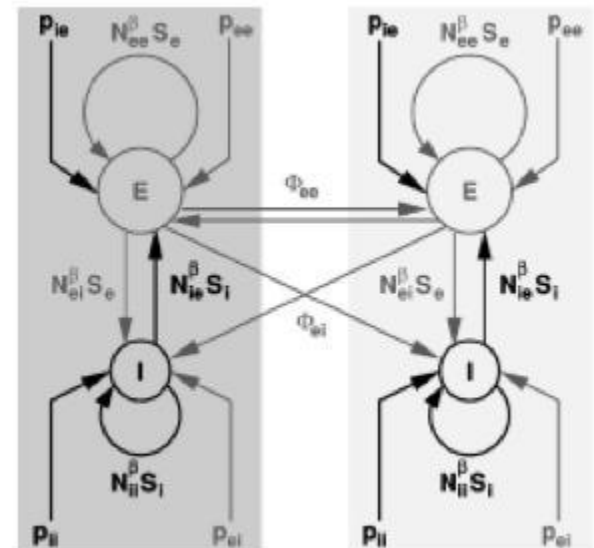
EEG model

(mean field method, critical damped oscillator):

$$\tau_k \frac{\partial h_k}{\partial t} = h_k^r - h_k + \sum_l \frac{h_{lk}^{eq} - h_k}{|h_{lk}^{eq} - h_k^r|} I_{lk}$$

$$\left(\frac{\partial}{\partial t} + \gamma_{lk} \right)^2 I_{lk} = e \Gamma_{lk} \gamma_{lk} \left(N_{lk}^\beta S_l(h_l) + p_{lk} \right)$$

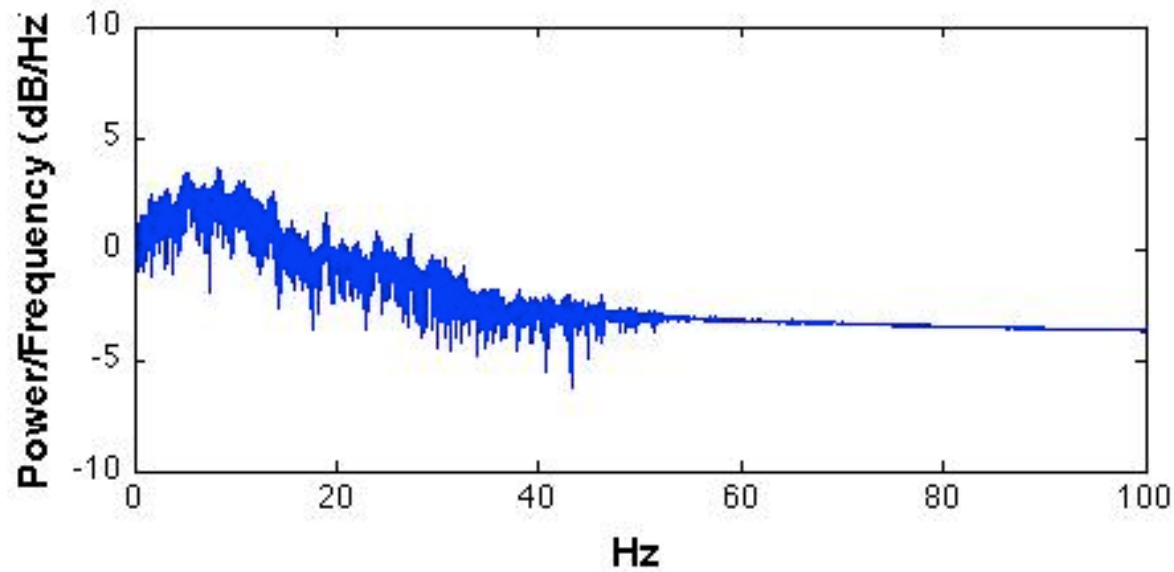
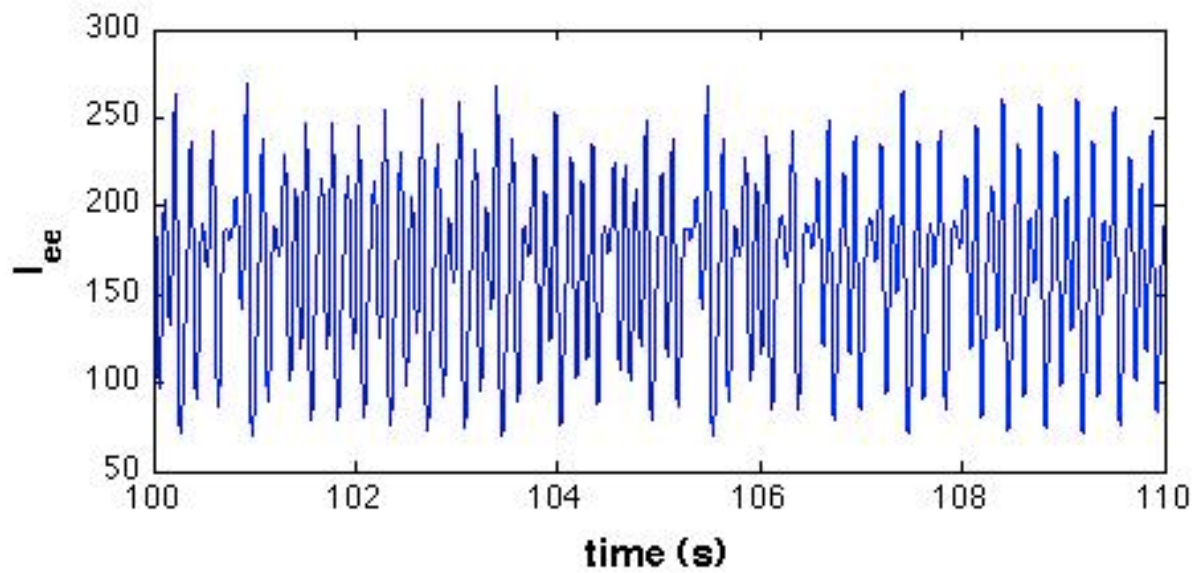
$$S_k(h_k) = S_k^{max} \left(1 + e^{-\sqrt{2}(h_k - \mu_k)/\sigma_k} \right)^{-1}$$



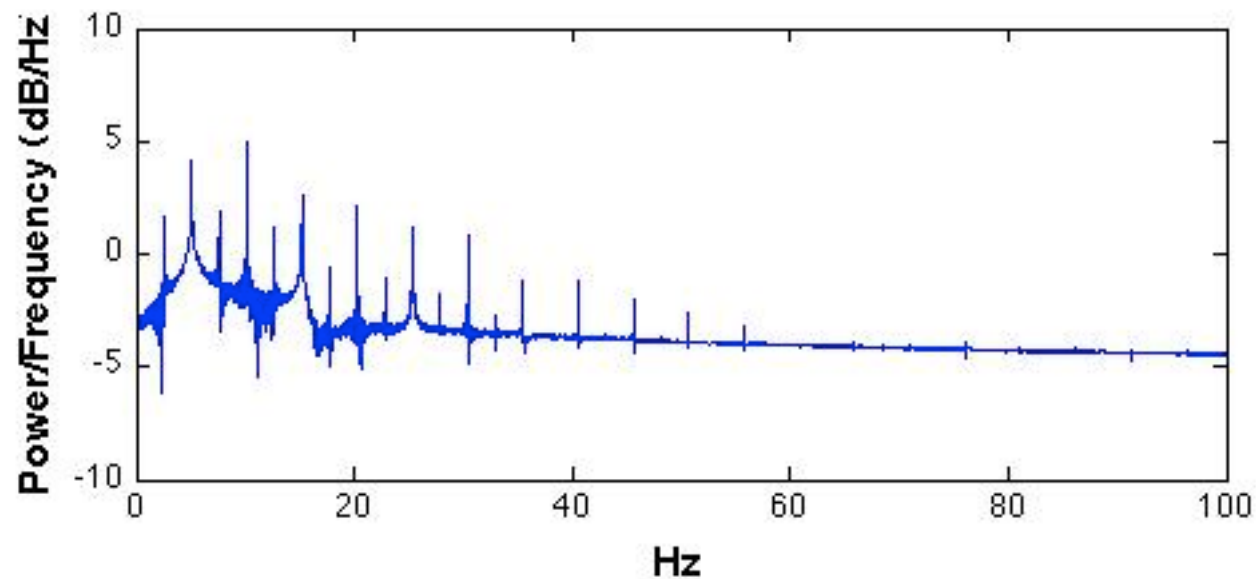
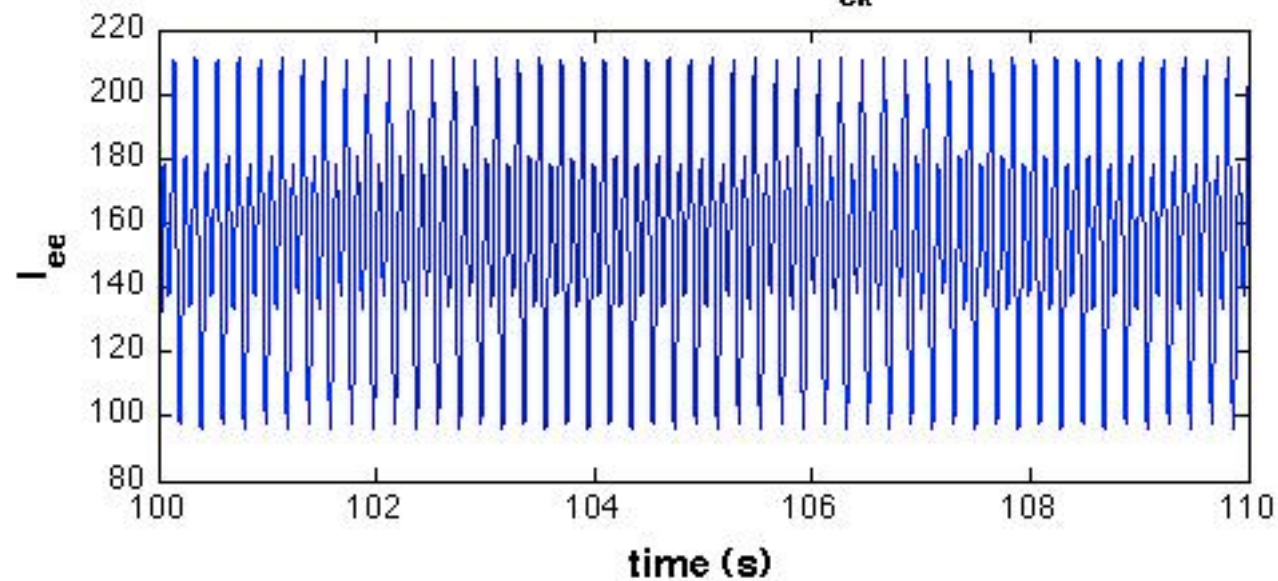
Physiological measurable parameter sets

| Parameter | | Min. | Max. | Parameter | | Min. | Max. |
|---|------------------|--------------------|---------------------|--|--|---------------------------|--|
| Mean resting membrane potential | H_e | -80 mV | -60 mV | Mean Nernst membrane potential | H_{ee}^{eq} | -20 mV | 10 mV |
| | H_i | -80 mV | -60 mV | | H_{ei}^{eq} | -20 mV | 10 mV |
| Passive membrane decay time const. | τ_e | 5 ms | 150 ms | | H_{ie}^{eq} | -90 mV | $H_i - 5$ mV |
| | τ_i | 5 ms | 150 ms | | H_{ii}^{eq} | -90 mV | $H_i - 5$ mV |
| Postsynaptic potential amplitude | Γ_{ee} | 0.1 mV | 2.0 mV | Postsynaptic potential rate constant | γ_{ee} | 100 s ⁻¹ | 1000 s ⁻¹ |
| | Γ_{ei} | 0.1 mV | 2.0 mV | | γ_{ei} | 100 s ⁻¹ | 1000 s ⁻¹ |
| | Γ_{ie} | 0.1 mV | 2.0 mV | | γ_{ie} | 10 s ⁻¹ | 500 s ⁻¹ |
| | Γ_{ii} | 0.1 mV | 2.0 mV | | γ_{ii} | 10 s ⁻¹ | 500 s ⁻¹ |
| Total number of intracortical connections | N_{ee}^{β} | 2000 | 5000 | Total number of cortico-cortical connections | N_{ee}^{α} | 2000 | 5000 |
| | N_{ei}^{β} | 2000 | 5000 | | N_{ei}^{α} | 1000 | 3000 |
| | N_{ie}^{β} | 100 | 1000 | Cortico-cortical decay scale and conduction velocity | $\Lambda_{(ee=ei)}$ | 0.1 cm ⁻¹ | 1 cm ⁻¹ |
| | N_{ii}^{β} | 100 | 1000 | | v | 100 cm/s | 1000 cm/s |
| Maximum mean firing rate | S_e^{max} | 50 s ⁻¹ | 500 s ⁻¹ | Rate of extracortical (noise) input | $\bar{p}_{ee}(\delta p_{ee}/\bar{p}_{ee})$ | 0 s ⁻¹ (0.1) | 10 ⁴ s ⁻¹ (0.25) |
| | S_i^{max} | 50 s ⁻¹ | 500 s ⁻¹ | | p_{ei} | 0 s ⁻¹ | 10000 s ⁻¹ |
| Firing thresholds | $\bar{\mu}_e$ | -55 mV | -40 mV | | p_{ie} | 0 s ⁻¹ (fixed) | |
| | $\bar{\mu}_i$ | -55 mV | -40 mV | | p_{ii} | 0 s ⁻¹ (fixed) | |
| Std. deviation of firing thresholds | $\hat{\sigma}_e$ | 2 mV | 7 mV | Mean synaptic delay | ξ | 0 ms (fixed) | |
| | $\hat{\sigma}_i$ | 2 mV | 7 mV | Absolute refractory period | τ_{abs} | 0 ms (fixed) | |

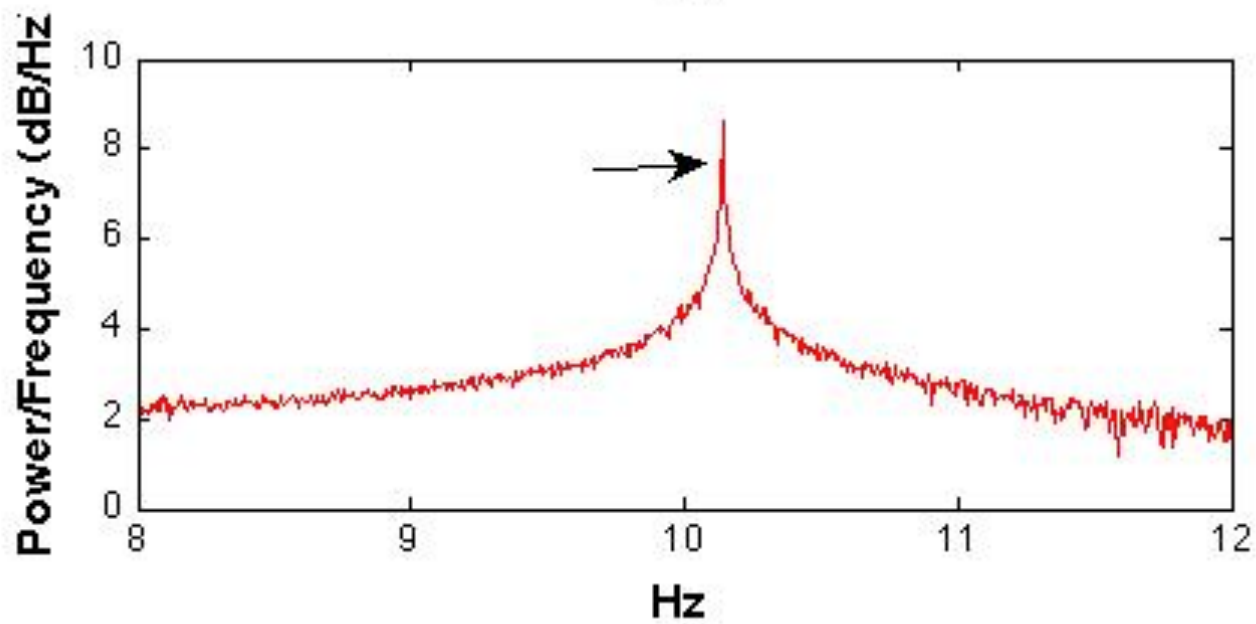
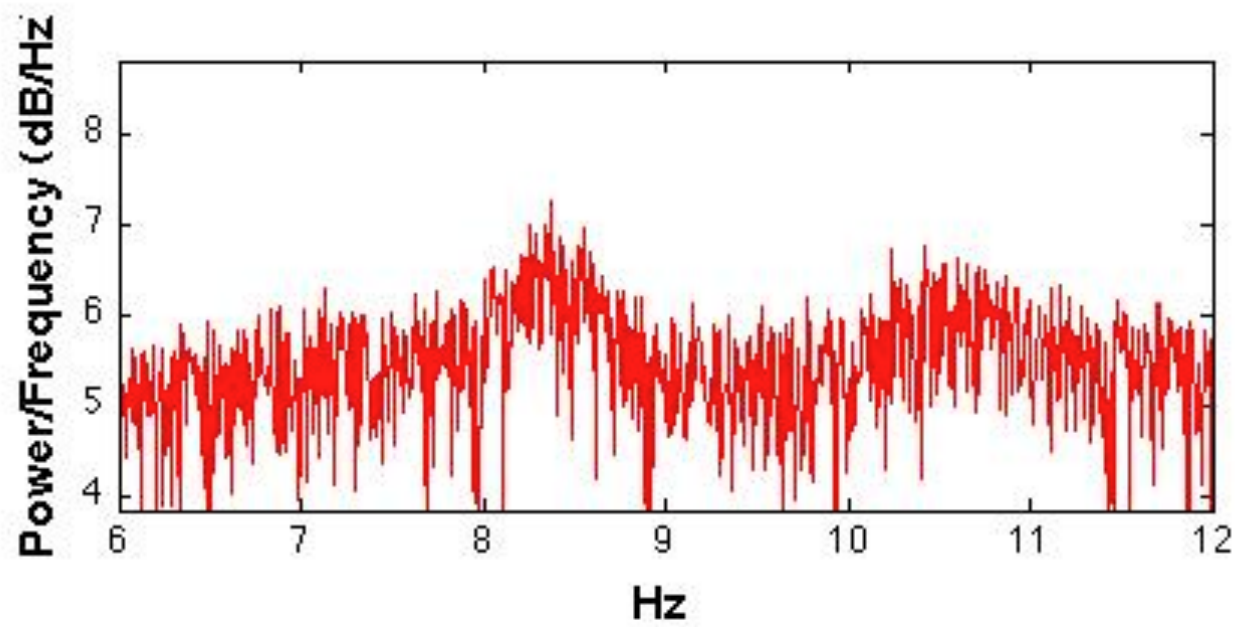
Baseline



after 3% drop on Γ_{ek}



after o2 drop



Metabolism in brain

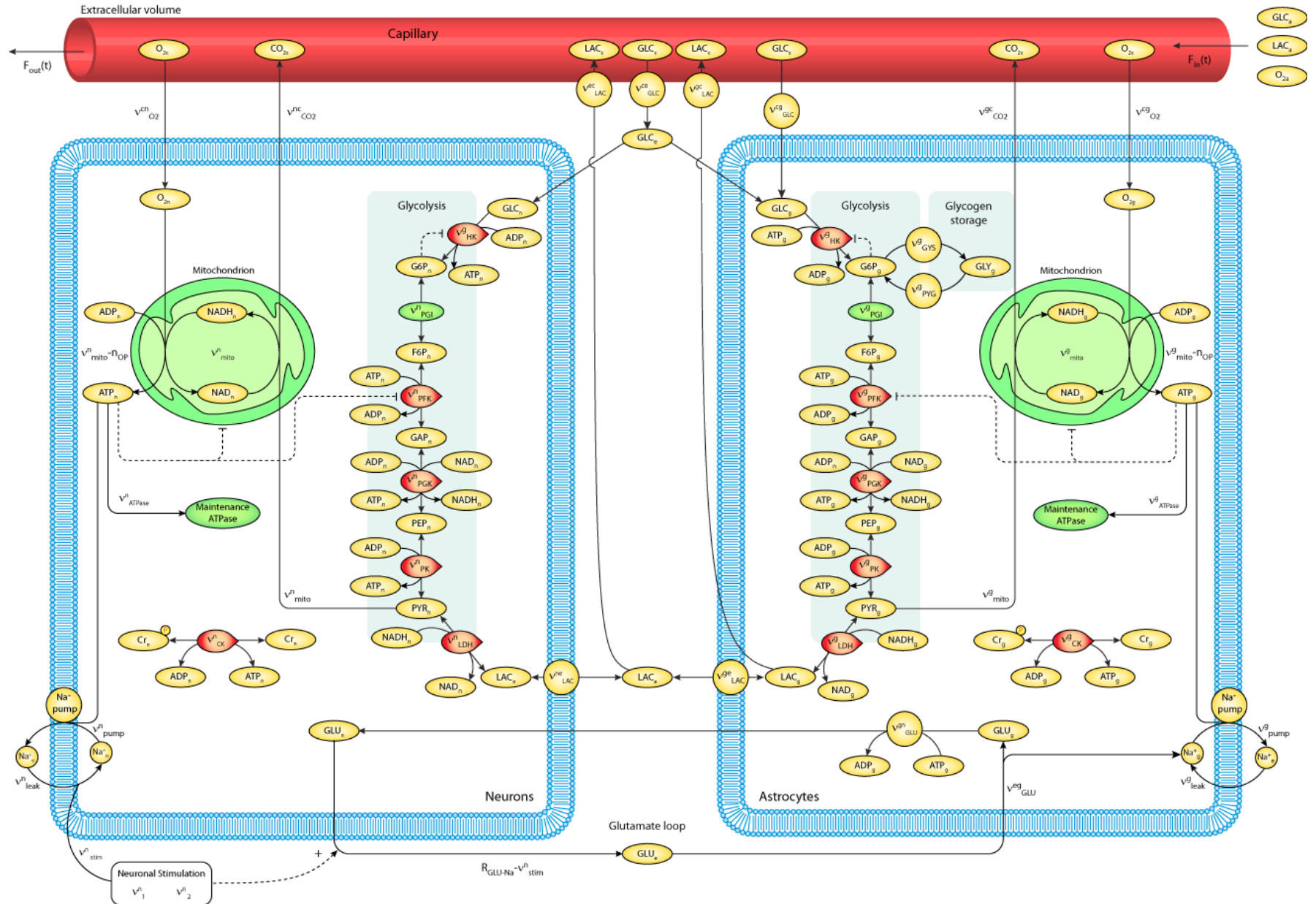
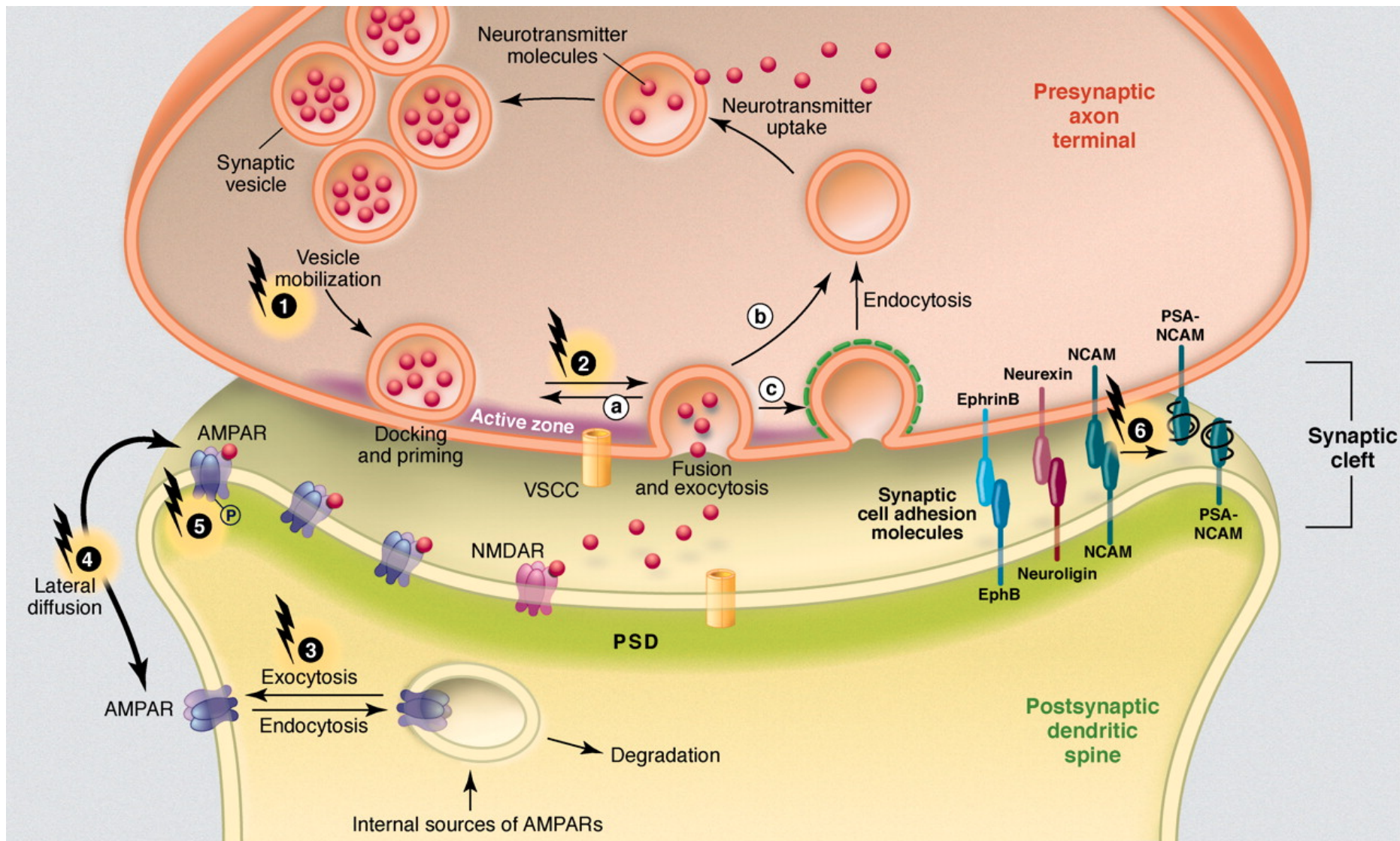


Table 4 Kinetic equations for central energy metabolism

| No. | Reaction | Kinetic equation |
|---------------------|-------------------------------------|--|
| Neuronal metabolism | | |
| 1 | Hexokinase | $v_{HK}^s = k_{HK}^s \cdot ATP_n \cdot \left[\frac{GLC_n}{GLC_n + K_{m,HK}} \right] \cdot [1 - f(G6Pn, 0.6, 20)]$ |
| 2 | Phosphoglucose isomerase | $v_{PGI}^s = v_{max,PGI}^s \cdot \left[\frac{G6P_n}{G6P_n + K_{m,PGI}} \right] = v_{max,PGI}^s \cdot \left[\frac{F6P_n}{F6P_n + K_{m,PGI}} \right]$ |
| 3 | Phosphofructokinase | $v_{PFK}^s = k_{PFK}^s \cdot ATP_n \cdot \left[1 + \left(\frac{ATP_n}{K_{i,ATP}} \right)^{nH} \right]^{-1} \cdot \left[\frac{F6P_n}{F6P_n + K_{m,PFK}} \right]$ |
| 4 | Phosphoglycerate kinase | $v_{PGK}^s = k_{PGK}^s \cdot GAP_n \cdot ADP_n \cdot \left[\frac{NAD_n}{NADH_n} \right]$ |
| 5 | Pyruvate kinase | $v_{PK}^s = k_{PK}^s \cdot PEP_n \cdot ADP_n$ |
| 6 | Mitochondrial oxidation of pyruvate | $v_{mito}^s = v_{max,mito}^s \cdot \left[\frac{PYR_n}{PYR_n + K_{m,mito}} \right] \cdot \left[\frac{ADP_n}{ADP_n + K_{m,ADP}} \right] \cdot \left[\frac{O2_n}{O2_n + K_{m,O2}} \right] \cdot [1 - f(\frac{ATP_n}{ADP_n}, 20, 5)]$ |
| 7 | Lactate dehydrogenase | $v_{LDH}^s = k_{LDH,f}^s \cdot PYR_n \cdot NADH_n - k_{LDH,r}^s \cdot LAC_n \cdot NAD_n$ |
| 8 | Creatine kinase | $v_{CK}^s = k_{CK,f}^s \cdot PCr_n \cdot ADP_n - k_{CK,r}^s \cdot Cr_n \cdot ATP_n$ |
| 9 | ATPase (excluding Na-ATPase) | $v_{ATPase}^s = V_{max,ATPase}^s \cdot \left[\frac{ATP_n}{ATP_n + K_{m,ATP}} \right]$ |



Concluding remarks and future work

- Have tried linked the EEG model with Oxygen/ATP change
- Dominant frequency is shifted to higher region while amplitude decreases
- Probably need circulation model which can predict blood pressure to give a more physical complete understanding on how the circulation system interacts with EEG