# **Estimation of Conductances**

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## Introduction to the problem of the conductances' estimation

- Estimating the synaptic conductances impinging on a single neuron directly from its membrane potential is one of the open problems to be solved to understand the flow of information in the brain.
- ▶ In the literature, one can find some computational strategies that give circumstantial solutions assuming the absence of spiking regimes and nonlinear subthreshold ionic currents.
- ► The main constraint to provide strategies is related to the nonlinearity of the input-output curve and the difficulty to compute it.
- Anomalies in the subthreshold estimation have been detected when linear techniques are used.

#### In this work,

- 1. We propose a quadratic method to estimate conductances in the subthreshold regime.
- 2. We propose an analytical method to estimate conductances in the spiking regime.

# Estimation in the subthreshold regime with activated ionic currents

[C.Vich, R.W.Berg, S.Ditlevsen, A.Guillamon; under review]

#### **Subthreshold Estimation Procedure**

Model: We consider the stochastic version of the Quadratic Integrate and Fire (QIF) model

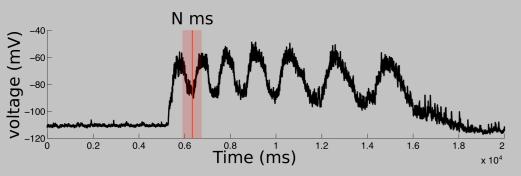
$$C\frac{dV}{dt} = \alpha (V(t) - V_T)^2 - I_E(t) - I_I(t) - I_T + I_{app} + \eta(t)$$

$$I_E(t) = g_E(t) (V(t) - V_E),$$

$$I_I(t) = g_I(t) (V(t) - V_I)$$

**Estimation Procedure:** Write the system as the quadratic SDE  $dV = (aV^2 + bV + c)dt + \sigma dW_t$  where a, b and c linearly depend on  $\alpha$ ,  $g_E$  and  $g_I$ . Then,

- 1. Using the Euler method, we discretize the diffusion process as  $V_{n+1} = V_n + (aV_n^2 + bV_n + c)\Delta + \sigma\sqrt{\Delta}\xi_{n+1}$ , where  $\xi_{n+1} \sim \mathcal{N}(0,1)$  and  $\Delta = t_{n+1} - t_n$ .
- 2. In a sample window W of length N ms, we use the MLE to



- i) Compute  $\hat{a}$ ,  $\hat{b}$ ,  $\hat{c}$  in W
- ii) And so,  $\hat{\alpha}$ ,  $\hat{g}_{E}$ ,  $\hat{g}_{I}$  in W
- 3. Since  $\alpha$  should be constant, let  $\alpha = mean_t \hat{\alpha}(t)$  and use again the MLE to estimate  $g_E$  and  $g_I$ , suposing  $\alpha$  known.

# Estimation in the oscillatory regime

[A.Guillamon, R.Prohens, A.E.Teruel, C.Vich; under review]

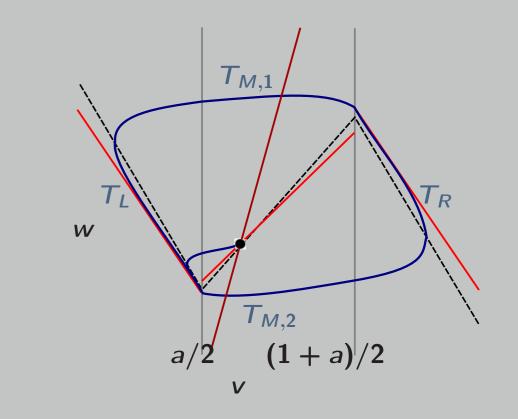
### Oscillatory Estimation Procedure

Model: We consider the McKean model given by

$$\begin{cases} C\dot{v} = f(v) - w - w_0 + I - I_{syn}, \\ \dot{w} = v - \gamma w - v_0, \end{cases}$$
where

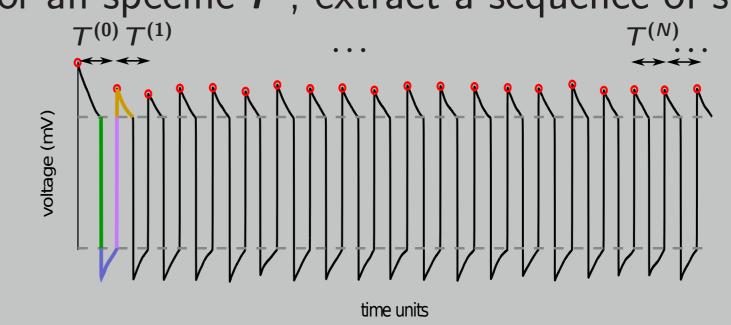
$$f(v) = \begin{cases} -v, & v < a/2, \\ v - a, & a/2 \le v \le (1+a)/2, \\ 1 - v, & v > (1+a)/2. \end{cases}$$

$$I_{syn} = g_{syn}(v - v_{syn})$$



**Estimation Procedure:** Using approximated expressions for  $T_L$ ,  $T_{M,1}$ ,  $T_{M_2}$ , and  $T_R$ , which have a nonlinear dependence on  $g_{syn}$ ,

1. Given v(t) for an specific  $I^*$ , extract a sequence of subperiods such that



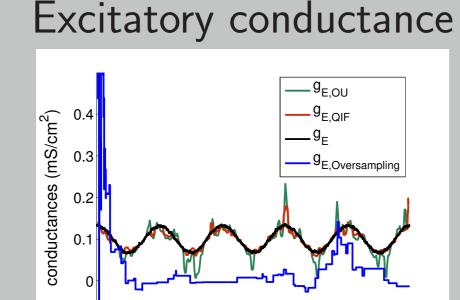
- 2.  $\{T_L^{(k)}, T_{M,1}^{(k)}, T_R^{(k)}, T_{M,2}^{(k)}; \}_{k=1}^N$
- 3. Interpolate  $\{(t^{(m)}, g_{syn}^{(m)})\}_{m=1}^{4N}$  to obtain  $g_{syn}(t)$ .

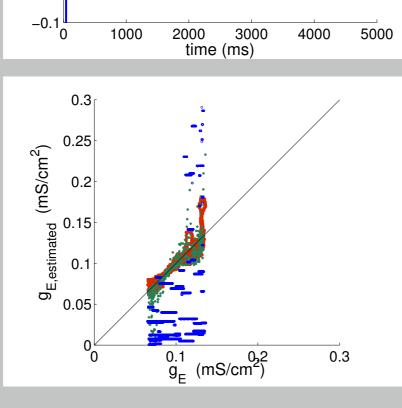
Results of the Estimation using in silico data

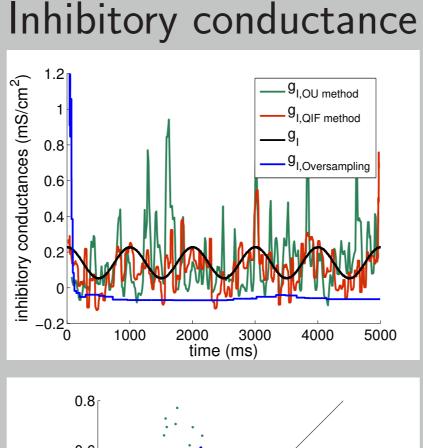
In silico data from a pyramidal cell model with  $I_T$ ,  $I_{AHP}$ ,  $I_{Na}$  and **I**<sub>K</sub> currents

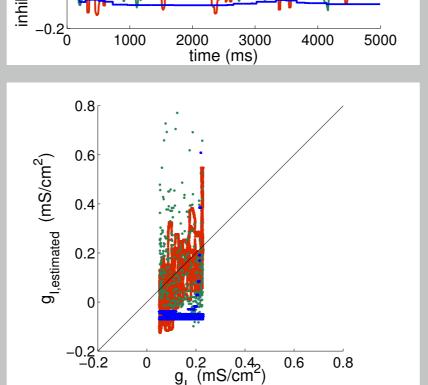
[Vich and Guillamon (2015)]

Results show an improvement when they are compared with different linear procedures.





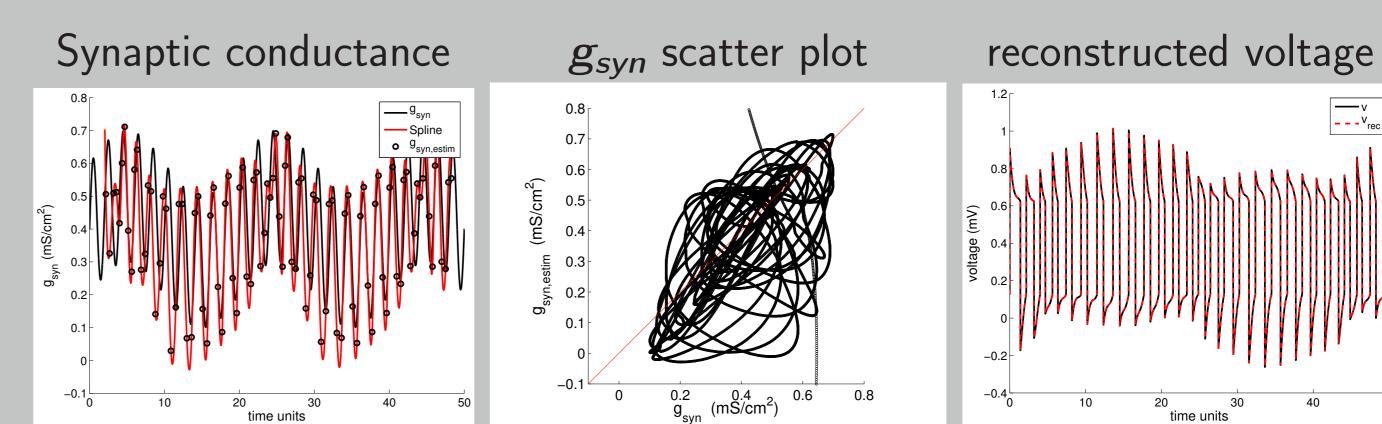




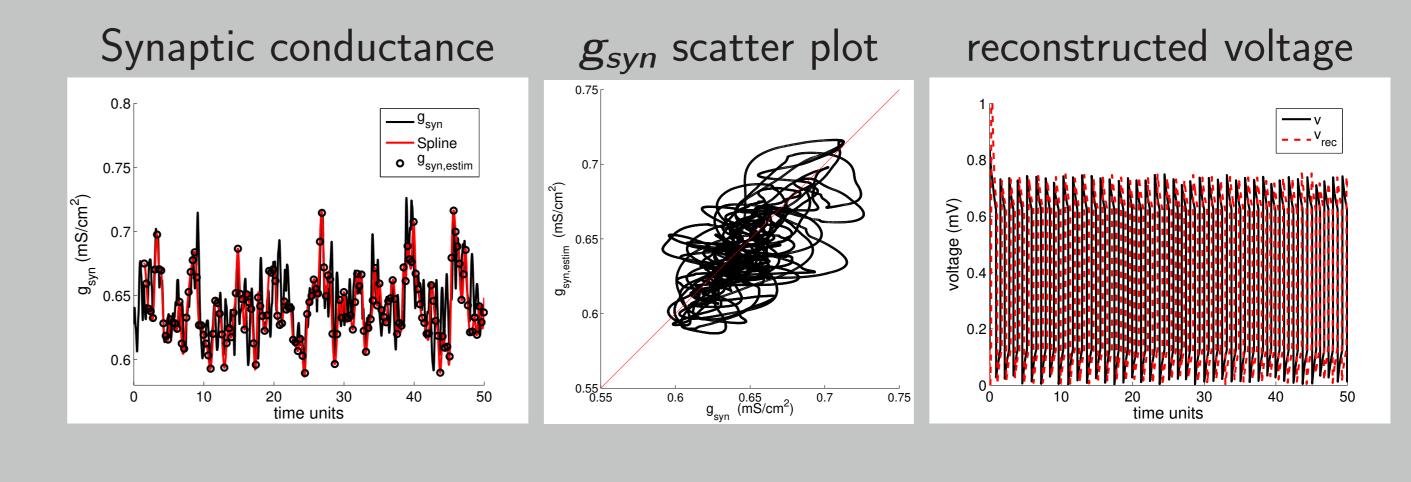
Legend: - Linear deterministic method - Linear stochastic method - Quadratic stochastic method

# Results of the Estimation using in silico data

Using prescribed conductances with doble frequency

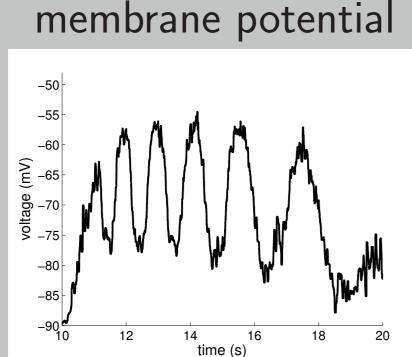


▶ Using prescribed conductances from a V1 computational network [Tao et al. (2004)]

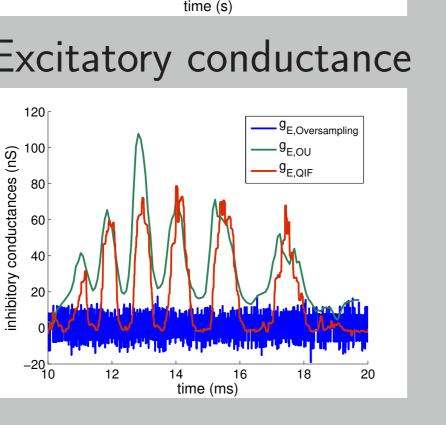


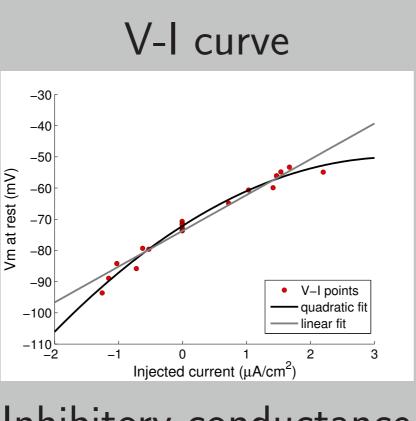
# Results of the Estimation using in vivo data

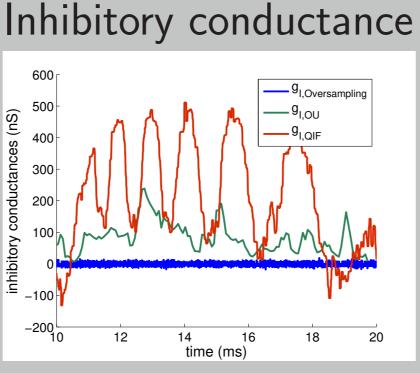
Intracellular recordings in current-clamp mode of spinal motoneurons of red-eared turtles [R.W. Berg].



Excitatory conductance







### Conclusion

- In the subthreshold regime, the Quadratization procedure substantially improves the estimation.
- In the oscillatory regime, we have presented a useful method to estimate conductances when they vary slowly in time. even though they are not perfectly estimated through time for the netwok case, we do capture the accurate mean conductance. This estimation could be improved by using a non-autonomous system.