

# Inadequacy Representation in Models of Supercapacitor Batteries

Part II: updates on inadequacy formulation

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# Summary of Models and QoI

## High Fidelity (1D) model

$$\frac{\partial \eta}{\partial \tau} = \frac{\partial^2 \eta}{\partial \xi^2}$$

$$\begin{cases} \frac{\partial \eta}{\partial \xi} \big|_{\xi=0} &= -\frac{\gamma}{1+\gamma} I(\tau) \\ \frac{\partial \eta}{\partial \xi} \big|_{\xi=1} &= \frac{1}{1+\gamma} I(\tau) \\ \eta \big|_{\tau=0} &= \eta_0(\xi) \end{cases}$$

- $\eta(\xi, \tau)$  = overpotential in electrode
- $\gamma = \frac{\kappa}{\sigma}$  : conductivity ratio
- $\xi, \tau$  : dimensionless distance/time
- $I(\tau)$  : dimensionless current

## Low Fidelity (0D) model

$$\eta_{LF} = \frac{1}{2} I(\tau) \xi^2 - I(\tau) \frac{\gamma}{1+\gamma} \xi + \eta^{avg}(\tau) - \frac{I(\tau)}{6} + \frac{I(\tau)}{2} \frac{\gamma}{1+\gamma}$$

$$\eta^{avg} = \int_0^1 \eta d\xi \Rightarrow \frac{\partial \eta^{avg}}{\partial \tau} = I(\tau)$$

## Quantity of Interest

Potential drop across the system (electrode)

$$V^{elect.}(\tau) = \frac{1+\gamma}{1+\gamma} \eta \big|_{\xi=1} - \frac{\gamma}{1+\gamma} \eta \big|_{\xi=0} - \frac{\gamma}{(1+\gamma)^2} I$$

# Model Inadequacy - Version I

## Inadequacy representation

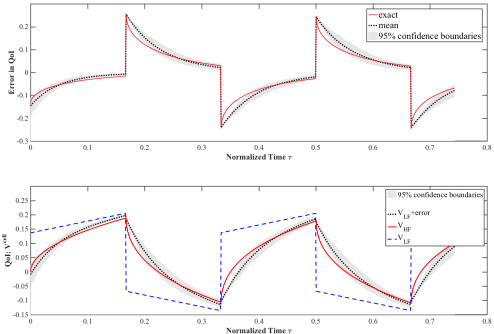
### Auxiliary Stochastic ODE:

$$\frac{\partial \epsilon}{\partial \tau} = -\lambda \epsilon + \alpha \frac{\partial I}{\partial \tau}$$

where  $\lambda$  is a stochastic process with following time evolution:

$$\frac{\partial \lambda}{\partial \tau} = -c(\lambda - \lambda_{mean}) + \beta \frac{\partial W}{\partial \tau}$$

where  $W(\tau)$  is a Wiener process.



- The ODE accounts for some of hidden features of HF i.e. the term  $\lambda \epsilon$  takes care of the Kernel  $\mathcal{K}$  and the term  $\alpha \frac{\partial I}{\partial \tau}$  accounts for discontinuity of  $I$ .
- It needs to be trained by HF data i.e. calibrating parameters of inadequacy representation  $(\alpha, \beta, c, \lambda_{mean})$ .

# Model Inadequacy - Version I

## Problems with deterministic part of the current ODE

- It does not capture the short time behavior after sudden change in current.
- It does not account for a wide range of current frequency.

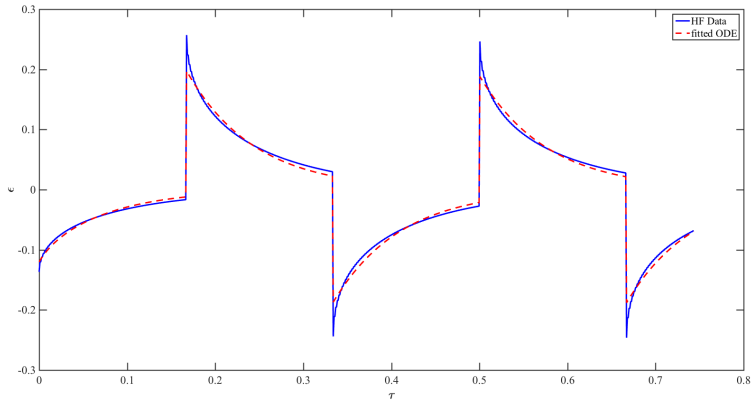
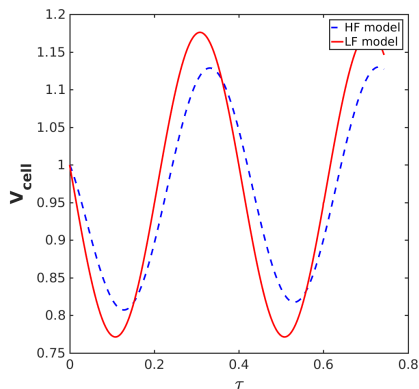
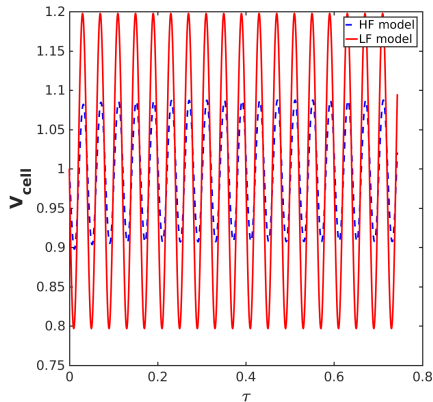


Figure : Step change current.

# Model Inadequacy - Version I

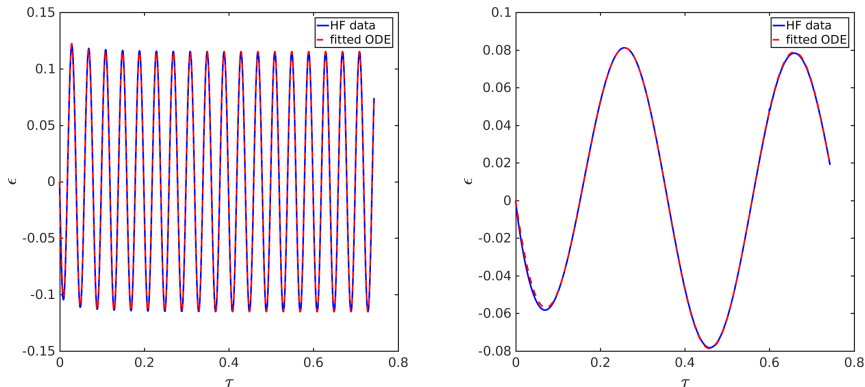
## Sinusoidal current:



**Figure :** (a)  $I = \sin(50\pi\tau)$ . (b)  $I = \sin(5\pi\tau)$

# Model Inadequacy - Version I

## Sinusoidal current:



**Figure :** (a)  $I = \sin(50\pi\tau)$ . Calibrated parameters:  $c = 56.9962$ ,  $\lambda_{mean} = 28.0998$ ,  $\alpha = 0.2822$ ; (b)  $I = \sin(5\pi\tau)$  Calibrated parameters:  $c = 1834.5$ ,  $\lambda_{mean} = 11.8$ ,  $\alpha = 0.2395$

# Closer look at behavior of over potential:

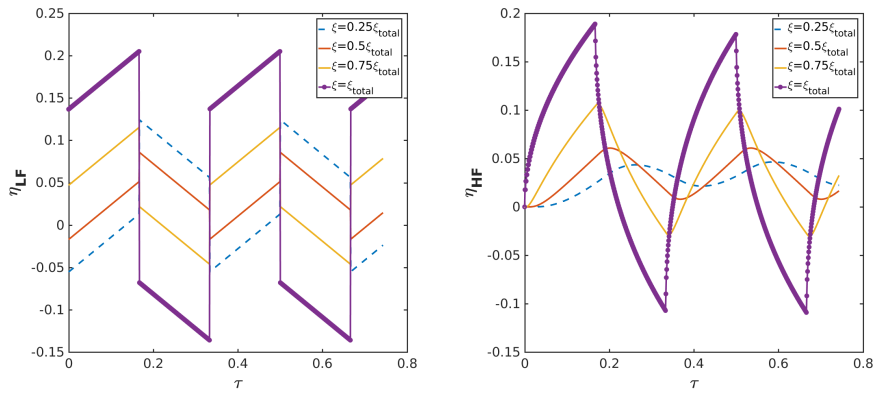


Figure : Step change current.

# Closer look at behavior of over potential:

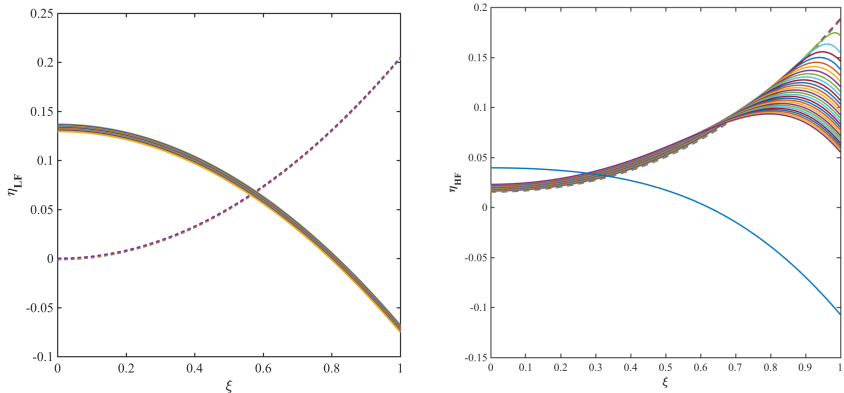


Figure : Step change current when sign of current changes.



## Closer look at behavior of over potential:

**Stokes's first problem with Neumann boundary condition**  
on the board ...

## Model Inadequacy - Version II

- when current step changes, at the boundary and short time  $\eta_{HF} \propto \sqrt{\tau}$ .
- since  $\eta_{LF}$  changes rapidly at the boundary, one can conclude  $\epsilon \propto \sqrt{\tau}$
- from  $\epsilon \propto \sqrt{\tau}$  one can infer  $\frac{d\epsilon}{d\tau} \propto \frac{1}{\sqrt{\tau}}$

From above consideration, we postulated a possible inadequacy representation for short time after step change as:

$$\frac{\partial \epsilon}{\partial \tau} = -\frac{\lambda}{\sqrt{\tau - T(\tau)}} + \alpha \frac{\partial I}{\partial \tau},$$

where  $T(\tau) = \tau_{jump}$  in case of step change current. **plot on the board**

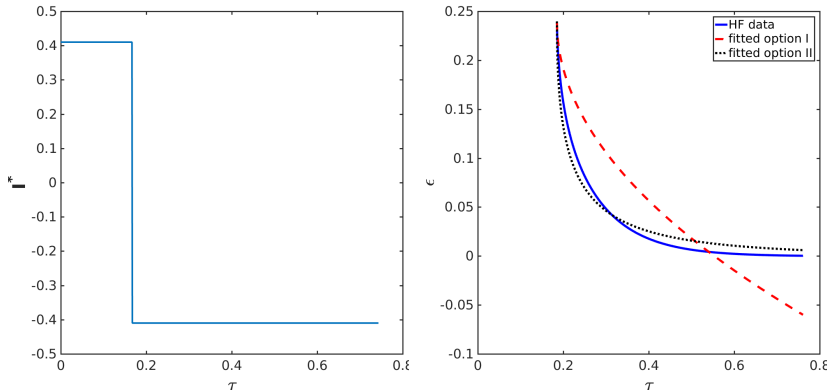
Does this form works for long time also?

# Model Inadequacy - Version II

**Test Problem:**

$$\text{option1 : } \frac{\partial \epsilon}{\partial \tau} = -\frac{\lambda}{\sqrt{\tau - T(\tau)}} + \alpha \frac{\partial I}{\partial \tau}$$

$$\text{option2 : } \frac{\partial \epsilon}{\partial \tau} = -\frac{\lambda \epsilon}{\sqrt{\tau - T(\tau)}} + \alpha \frac{\partial I}{\partial \tau}$$



**Figure :** (a) change in current with time; (b) two inadequacy options calibrated with HF data.

# Model Inadequacy - Version II

## Inadequacy representation (v.2)

### Auxiliary Stochastic ODE:

$$\frac{\partial \epsilon}{\partial \tau} = -\frac{\lambda \epsilon}{\sqrt{\tau - T(\tau)}} + \alpha \frac{\partial I}{\partial \tau}$$

where  $\lambda$  and  $\alpha$  are parameters of inadequacy representation.

### What is a general form for $T(\tau) \propto I(\tau)$ ?

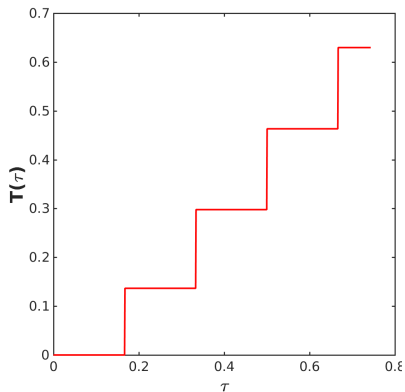
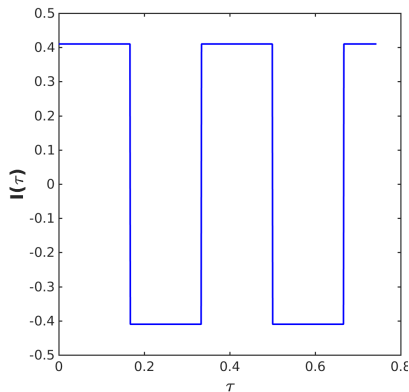
- $T(\tau)$  should be consistent with what we expect in step changes current.
- In sinusoidal current it seems  $T(\tau)$  should take care of lagging time between HF and LF model.

From above consideration, we postulated a possible evolution equation for  $T(\tau)$  as:

$$\frac{\partial T}{\partial \tau} = (\tau - T(\tau)) \left| \frac{\partial I}{\partial \tau} \right|$$

# Model Inadequacy - Version II

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