

# High order methods for the monodomain model

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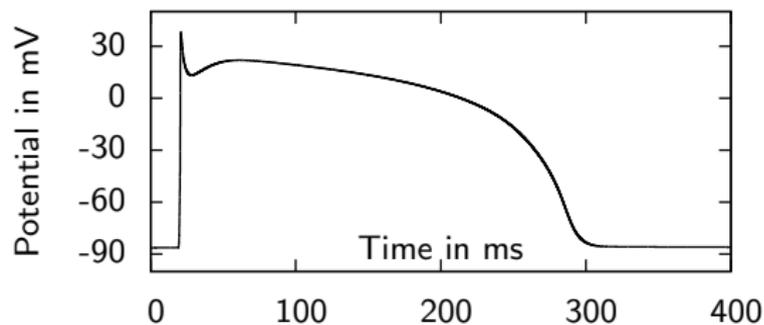
<sup>2</sup> Laboratoire de Mathématiques et de leurs Applications,  
Université de Pau.

Roma, April 2018

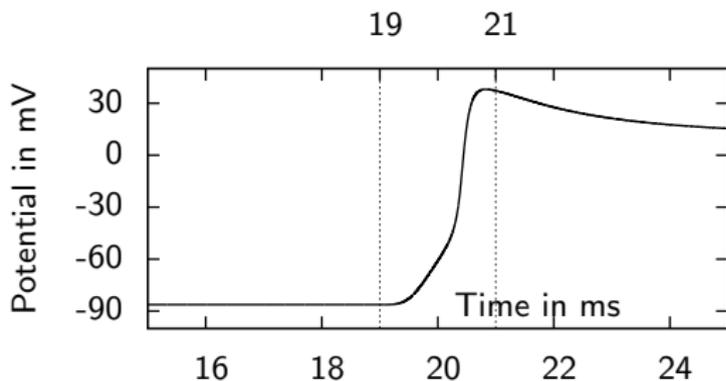


# Discretization errors, why ?

## Sharp depolarization



# Discretization errors, why ?

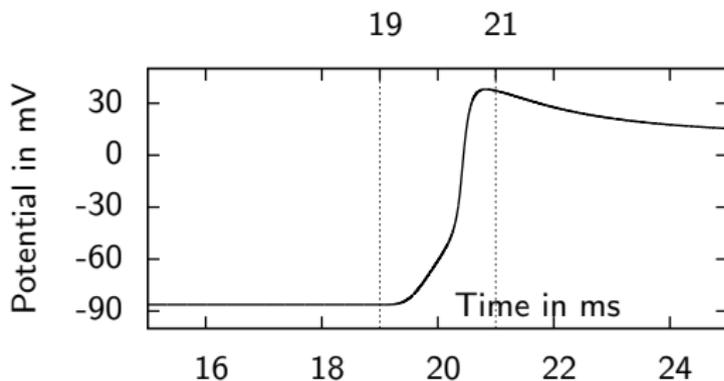


## Sharp depolarization

- TNNP model:

Depolarization duration  
 $\simeq 1/500$  s

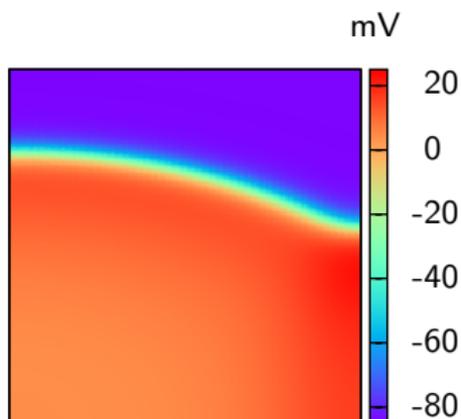
# Discretization errors, why ?



## Sharp depolarization

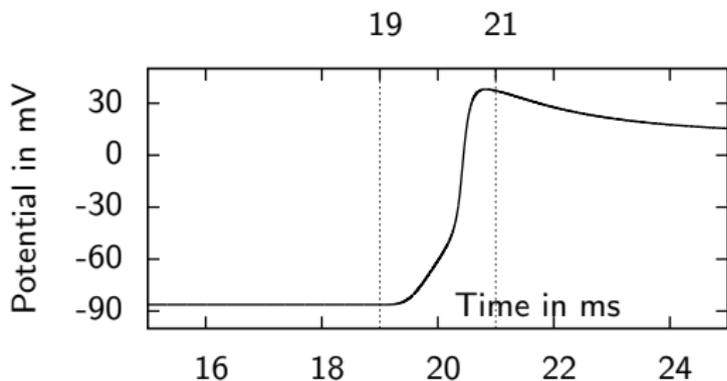
- TNNP model:

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## Sharp wavefronts

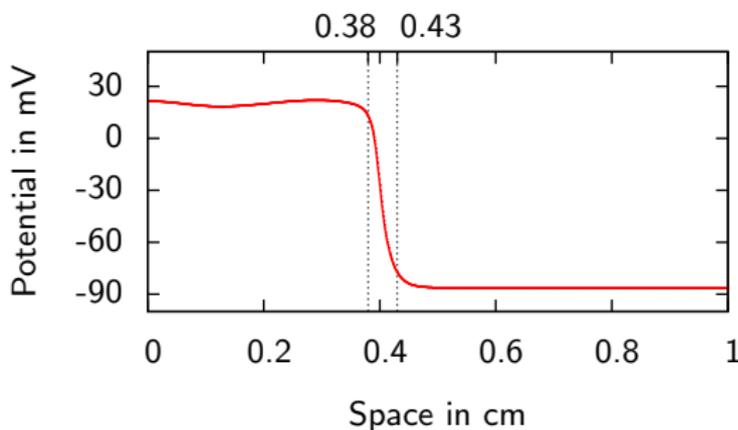
## Discretization errors, why ?



### Sharp depolarization

- TNNP model:

Depolarization duration  
 $\approx 1/500$  s

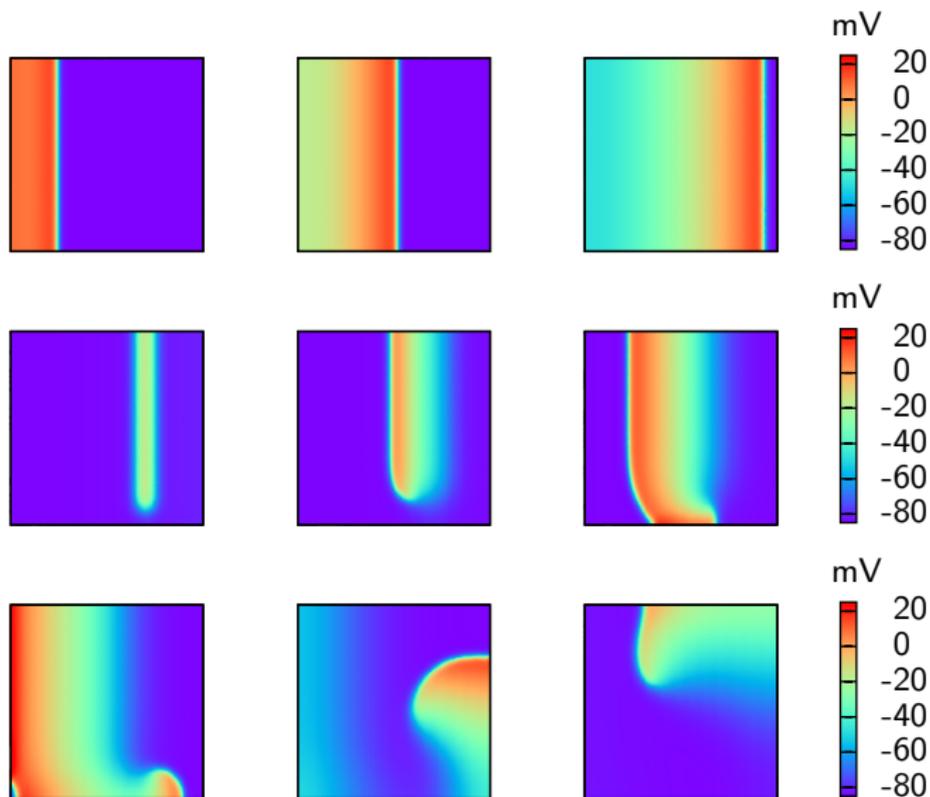


### Sharp wavefronts

- TNNP model
- $A_m = 1000 \text{ cm}^{-1}$

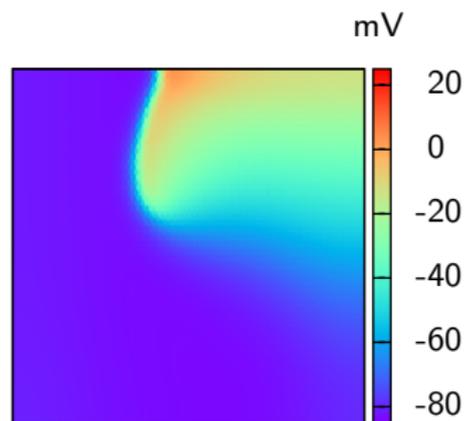
Wavefront thickness:  
 $\approx 1/20$  cm

# Spiral wave: description



## Spiral wave: discretisation error

At a fixed time instant:  $t = 160$  ms



Order 3 finite elements

- $\Delta x = 0.6$  mm

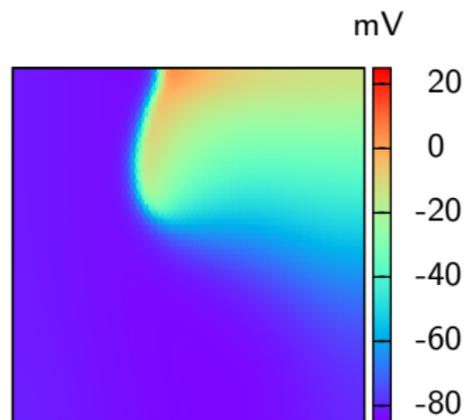
Order 3 time stepping-method

- $\Delta t = 0.1$  ms

Discretization error: **0.7 %**

# Spiral wave: discretisation error

At a fixed time instant:  $t = 160$  ms



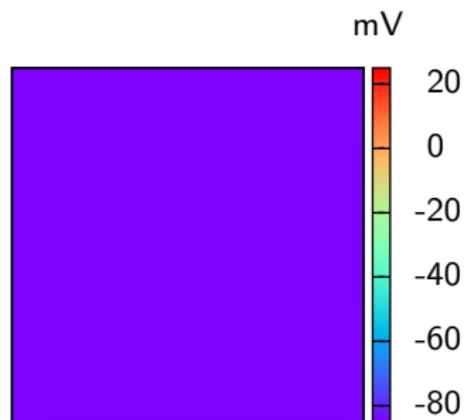
Order 3 finite elements

- $\Delta x = 0.6$  mm

Order 3 time stepping-method

- $\Delta t = 0.1$  ms

Discretization error: **0.7 %**



Order 1 finite elements

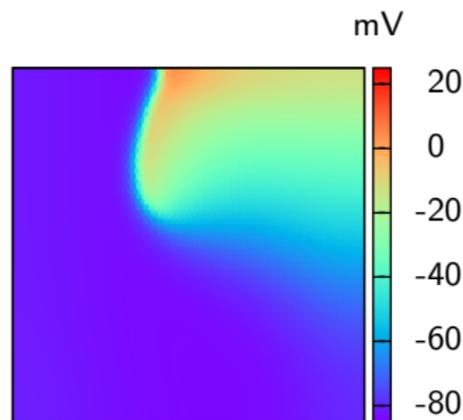
- $\Delta x = 0.6$  mm

Order 1 time stepping-method

- $\Delta t = 0.1$  ms

# Spiral wave: discretisation error

At a fixed time instant:  $t = 160$  ms



Order 3 finite elements

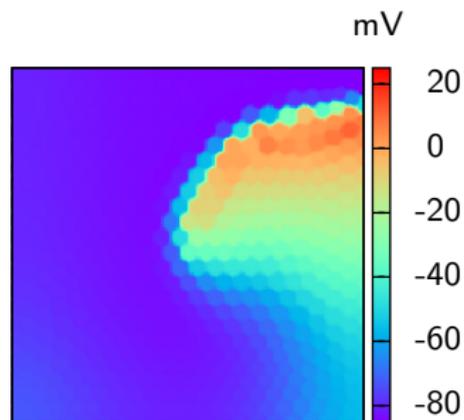
- $\Delta x = 0.6$  mm

Order 3 time stepping-method

- $\Delta t = 0.1$  ms

Discretization error: **0.7 %**

- CPU  $\simeq 2.5$  s



Order 1 finite elements

- $\Delta x = 0.6$  mm

Order 1 time stepping-method

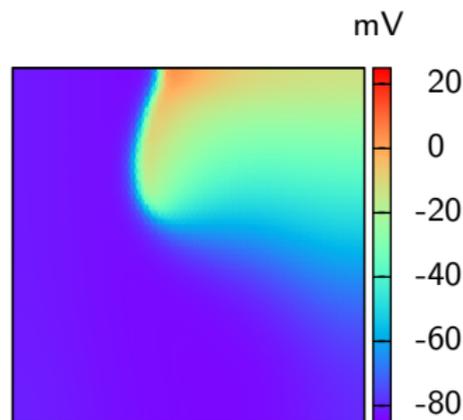
- $\Delta t = 0.1/16$  ms

Discretization error: **40 %**

- CPU  $\simeq 6.0$  s

# Spiral wave: discretisation error

At a fixed time instant:  $t = 160$  ms



Order 3 finite elements

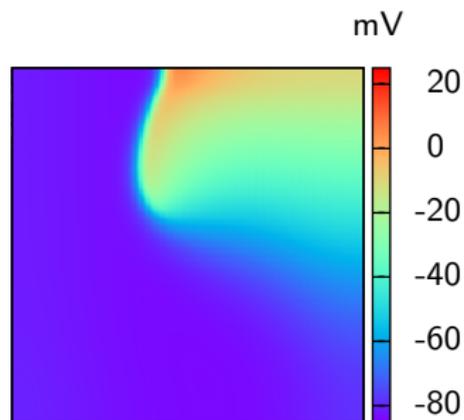
- $\Delta x = 0.6$  mm

Order 3 time stepping-method

- $\Delta t = 0.1$  ms

Discretization error: **0.7 %**

- CPU  $\simeq 2.5$  s



Order 1 finite elements

- $\Delta x = 0.6/8$  mm  $\simeq 75$   $\mu$ m

Order 1 time stepping-method

- $\Delta t = 0.1 / 16$  ms

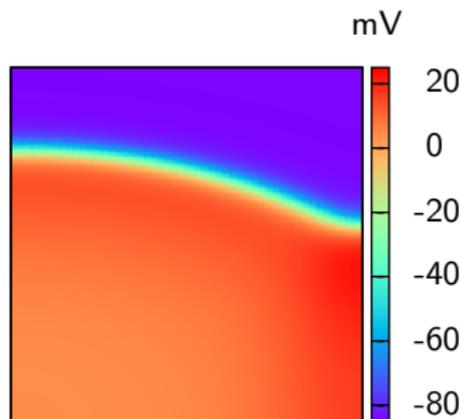
Discretization error: **2.5 %**

- CPU  $\simeq 215$  s

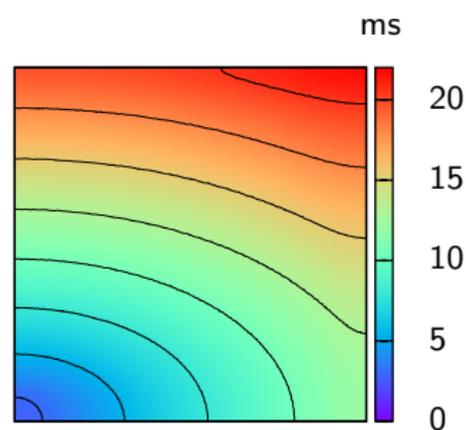
# Outline

## What error ?

- Mathematical errors
- *Physiological* errors : errors on activation times  
errors on the wavefront celerity



Potential at time  $t = 16$  ms



Activation times

# Outline

## What error ?

- Mathematical errors
- *Physiological errors* : errors on activation times  
errors on the wavefront celerity

## Total discretization error:

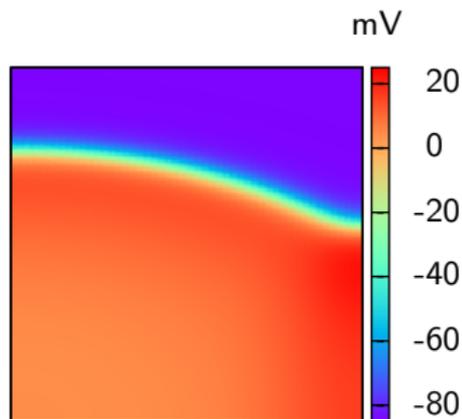
- total error  $\leq$  (error in space) + (error in time)

## Outline:

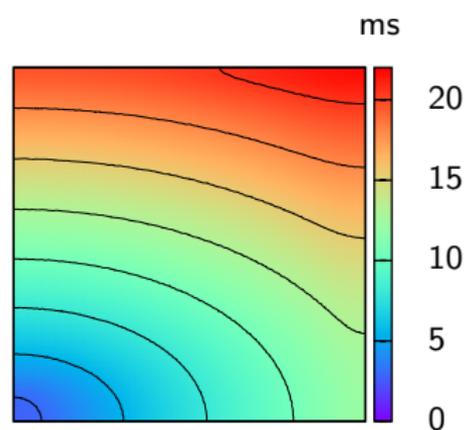
- 1 Discretization error in space
- 2 Time-stepping methods

## Test case

- square geometry (1 cm<sup>2</sup>)
- constant anisotropy (horizontal fibres)
- Beeler-Reuter model
- $A_m = 500 \text{ cm}^{-1}$
- single-site stimulation (at the origin)



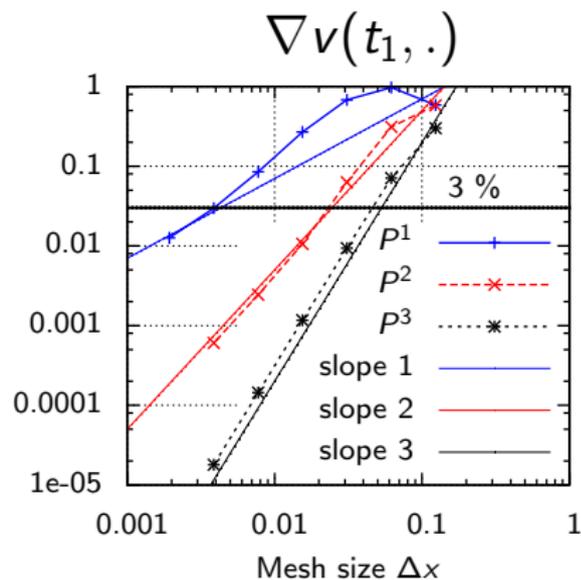
Potential at time  $t = 16 \text{ ms}$



Activation times

# Discretization error in space, 1

Relative error (in  $L^2$ -norm) on:



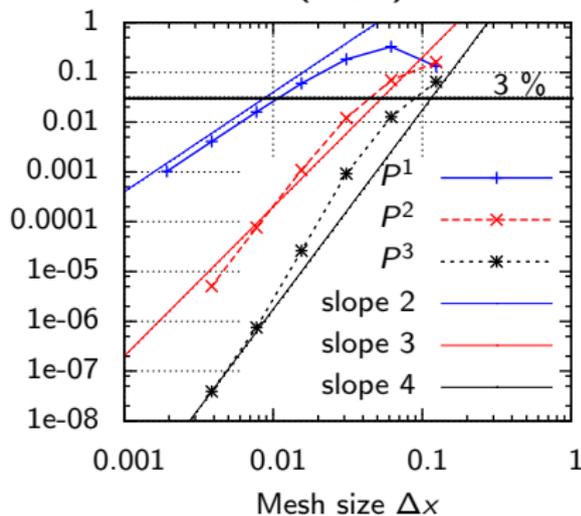
$$\text{Error} = O(\Delta x^k)$$

$v(t_1, \cdot)$  = transmembrane potential at time  $t_1 = 16$  ms

# Discretization error in space, 1

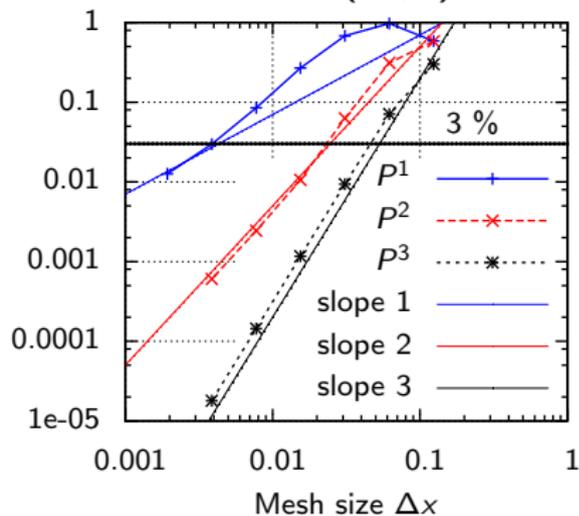
Relative error (in  $L^2$ -norm) on:

$v(t_1, \cdot)$



$$\text{Error} = O(\Delta x^{k+1})$$

$\nabla v(t_1, \cdot)$



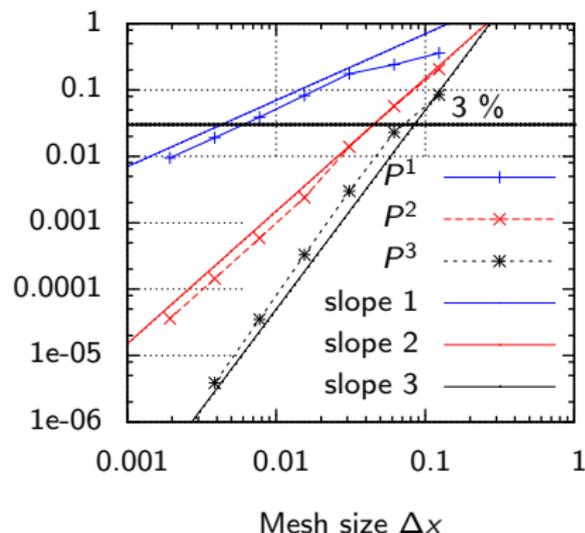
$$\text{Error} = O(\Delta x^k)$$

$v(t_1, \cdot)$  = transmembrane potential at time  $t_1 = 16$  ms

## Discretization error in space, 2

Relative error (in  $L^2$ -norm) on:

wavefront velocity

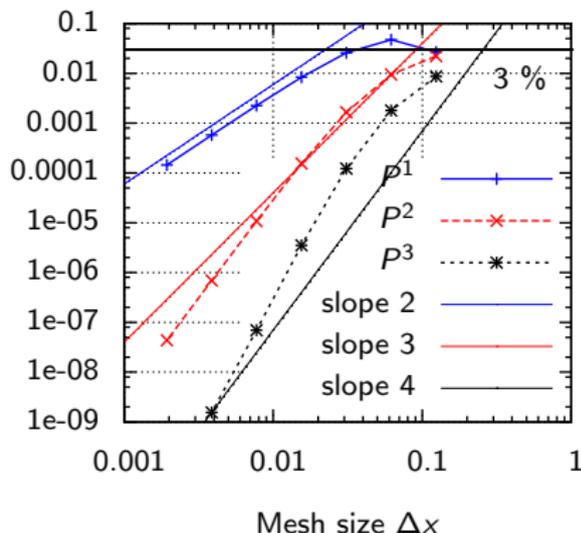


$$\text{Error} = O(\Delta x^k)$$

# Discretization error in space, 2

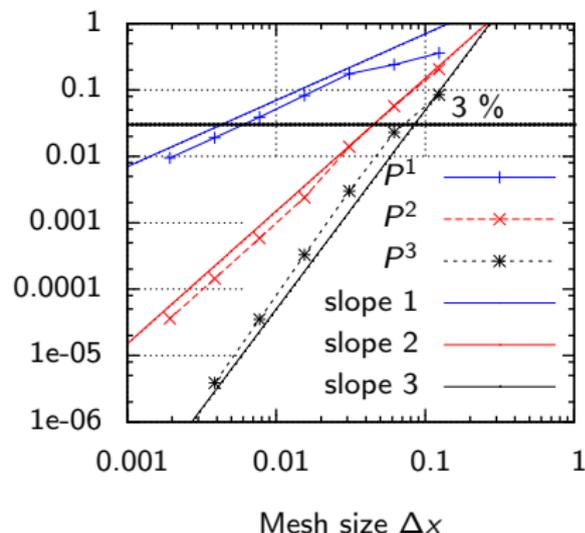
Relative error (in  $L^2$ -norm) on:

activation times



$$\text{Error} = O(\Delta x^{k+1})$$

wavefront velocity



$$\text{Error} = O(\Delta x^k)$$

## Discretization error in space, 3

### Maximal mesh size

to have a discretization error in space

**below 3%**

Error type:	$v(t_1, \cdot)$	$\nabla v(t_1, \cdot)$	act. times	wave speed
$p^1$	0.01	$4 \times 10^{-3}$	0.03	$6 \times 10^{-3}$
$p^2$	0.04	0.02	0.1	0.04
$p^3$	0.09	0.04	0.2	0.07

### Conclusion

- From order 1 to order 2: **4 time coarser mesh**
- From order 1 to order 3: **8 time coarser mesh**

## Time-stepping

Equation for the gating variables  $w$ :

$$\frac{dw}{dt} = \frac{w_{\infty} - w}{\tau} = a(v, w)w + b(v, w)$$

with  $a(v, w) = -1/\tau$  and  $b(v, w) = w_{\infty}/\tau$ .

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$$w_{n+1} = w_n + \Delta t \varphi_1(\alpha_n \Delta t) (\alpha_n w_n + \beta_n)$$

for  $\varphi_1(z) = (e^z - 1)/z$  with:

$$\alpha_n = a(v_n, w_n) := a_n$$

$$\beta_n = b(v_n, w_n) := b_n$$

**Rush-Larsen (1978): order 1.**

## Time-stepping

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for  $\varphi_1(z) = (e^z - 1)/z$  with:

$$\alpha_n = \frac{3}{2}a_n - \frac{1}{2}a_{n-1}$$

$$\beta_n = \frac{3}{2}b_n - \frac{1}{2}b_{n-1}$$

**Perego-Veneziani (2009): order 2.**

## Time-stepping

Equation for the gating variables  $w$ :

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$$w_{n+1} = w_n + \Delta t \varphi_1(\alpha_n \Delta t) (\alpha_n w_n + \beta_n)$$

for  $\varphi_1(z) = (e^z - 1)/z$  with:

$$\alpha_n = \frac{1}{12}(23a_n - 16a_{n-1} + 5a_{n-2})$$

$$\beta_n = \frac{1}{12}(23b_n - 16b_{n-1} + 5b_{n-2}) + \frac{\Delta t}{12}(a_n b_{n-1} - a_{n-1} b_n)$$

**Coudière-Lontsi-Pierre (2017): order 3.**

# Time-stepping

$$w_{n+1} = w_n + \Delta t \varphi_1(\alpha_n \Delta t) (\alpha_n w_n + \beta_n)$$

for  $\varphi_1(z) = (e^z - 1)/z$  with:

$$\alpha_n = \frac{1}{24}(55a_n - 59a_{n-1} + 37a_{n-2} - 9a_{n-3}),$$

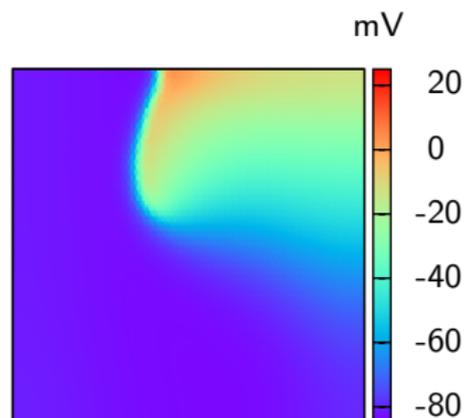
$$\beta_n = \frac{1}{24}(55b_n - 59b_{n-1} + 37b_{n-2} - 9b_{n-3})$$

$$+ \frac{\Delta t}{12}(a_n(3b_{n-1} - b_{n-2}) - (3a_{n-1} - a_{n-2})b_n),$$

**Coudière-Lonsi-Pierre (2017): order 4.**

## Spiral wave test case

- Total error in space = 4.3 %



- Beeler Reuter model (modified)
- $A_m = 600 \text{ cm}^{-1}$
- Order 2 finite elements:  
 $\Delta x = 0.6 \text{ mm}$

## Spiral wave test case

- Total error in space = 4.3 %
- Total discretization error with order  $k$  Rush-Larsen like scheme:

Order $k$ :	1	2	3	4
$\Delta t = 0.1$ ms	–	18 %	<b>5.1 %</b>	–
$\Delta t = 0.1/2$ ms	–	8.3 %	4.4 %	<b>4.2 %</b>
$\Delta t = 0.1/4$ ms	23 %	<b>5.3 %</b>	4.3 %	4.3 %
$\Delta t = 0.1/8$ ms	11.8 %	4.5 %	4.3 %	4.3 %

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$\Delta t = 0.1/4$ ms	23 %	<b>5.3 %</b>	4.3 %	4.3 %
$\Delta t = 0.1/8$ ms	11.8 %	4.5 %	4.3 %	4.3 %

- Required CPU to have an error  $\simeq 5$  %

Order $k$ :	1	2	3	4
CPU	27	3.75	<b>1</b>	2.05

# Future developments

More realistic test cases:

- complex domains with curved boundaries,
- 3D geometry.

Time stepping methods:

- improved stability,
- one-step methods.





