

# Coupling large and small scale shallow water models with porosity in the presence of anisotropy

Ph.D. defense of  
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under the supervision of  
Vincent GUINOT and Antoine ROUSSEAU

1 October 2021



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UNIVERSITÉ  
DE MONTPELLIER

IMAG  
INSTITUT MONTPELLIERAIN  
ALEXANDER GROTHENDIECK





# Introduction

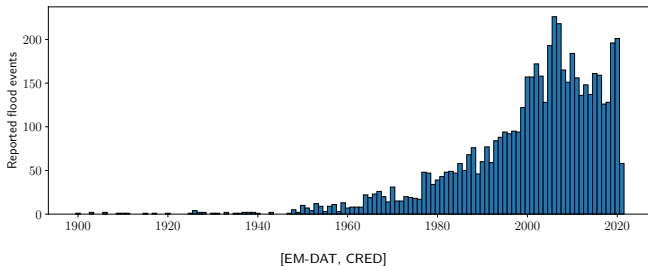


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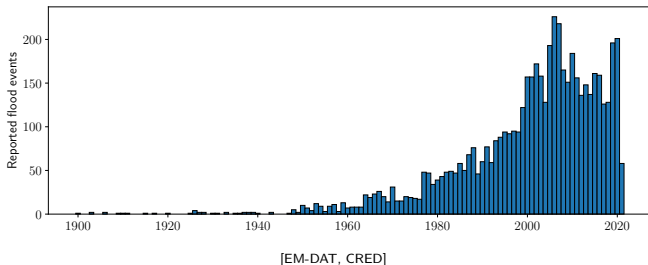


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- Increasing impacts and frequency of urban floods

### Floods in 1995-2015 (CRED & UNISDR, 2015)

- 47% of weather-related disasters
- 2.3 billion people affected



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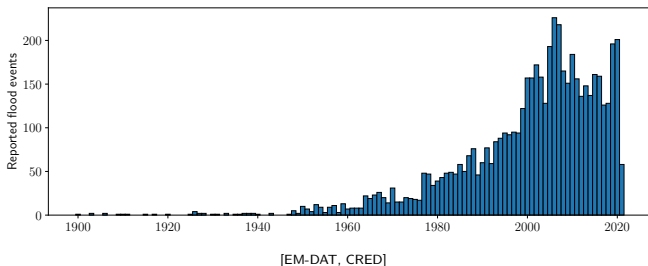
- Increasing impacts and frequency of urban floods

### Floods in 1995-2015 (CRED & UNISDR, 2015)

- 47% of weather-related disasters
- 2.3 billion people affected

### Urban population (United Nations, 2019)

- Today: 55%
- 2050: 68%



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- Increasing impacts and frequency of urban floods
- Numerical simulation using the **shallow water equations (SWE)**

$$\frac{\partial}{\partial t} \mathbf{U}(t) + \frac{\partial}{\partial x} \mathbf{F}(\mathbf{U}(t)) + \frac{\partial}{\partial y} \mathbf{G}(\mathbf{U}(t)) = \mathbf{S}(\mathbf{U}(t)), \quad \mathbf{U} = \begin{pmatrix} h \\ hu_x \\ hu_y \end{pmatrix}$$

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- Accurate results: high computational cost;

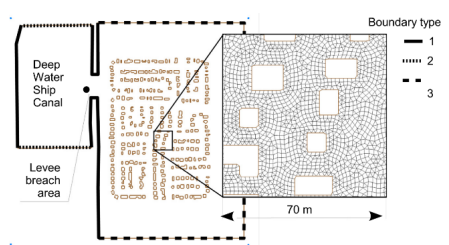
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(Guinot et al., 2017)



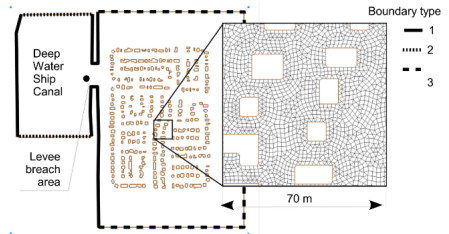
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- Increasing impacts and frequency of urban floods
- Numerical simulation using the **shallow water equations (SWE)**
- Accurate results: high computational cost;
- Limited operational application



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- Alternative: **porosity-based SWE**

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- Defina et al., 1994; Guinot and Soares-Frazão, 2006; Sanders et al., 2008; Guinot, 2012; Guinot et al., 2017; Velickovic et al., 2017;...



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### The classical SWE

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The porosity-based SWE (single porosity model; Guinot and Soares-Frazão, 2006)

$$\frac{\partial}{\partial t} \phi \mathbf{U}(t) + \frac{\partial}{\partial x} \phi \mathbf{F}(\mathbf{U}(t)) + \frac{\partial}{\partial y} \phi \mathbf{G}(\mathbf{U}(t)) = \bar{\mathbf{S}}(\mathbf{U}(t))$$

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- Urban zone: porous media.
- Porosity coefficient  $\phi(x, y) \in [0, 1]$  for representing the urban geometry;

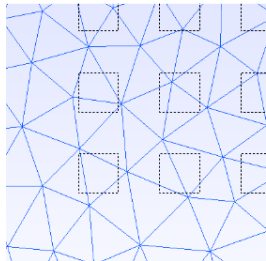
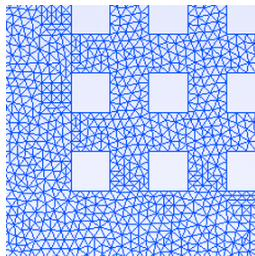
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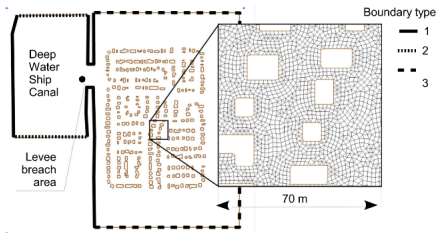


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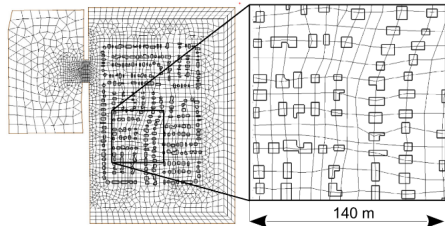
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## ■ Coarser mesh, larger time step $\implies$ smaller computational cost;



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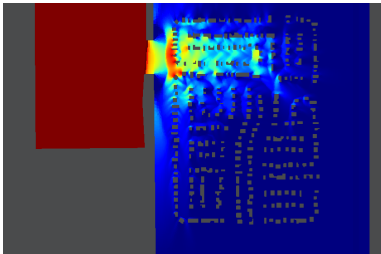


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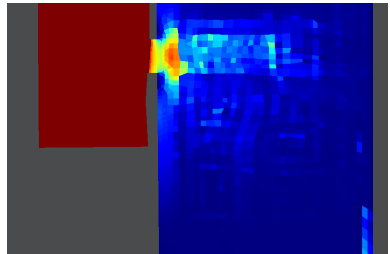
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  - Urban zone: porous media.
  - Porosity coefficient  $\phi(x, y) \in [0, 1]$  for representing the urban geometry;
- Coarser mesh, larger time step  $\implies$  smaller computational cost;
- Good global approximations, but less accurate inside the urban zone.



Computational time: 794s



Computational time: 14s





## Introduction

- How to improve results provided by the porosity-based SWE?

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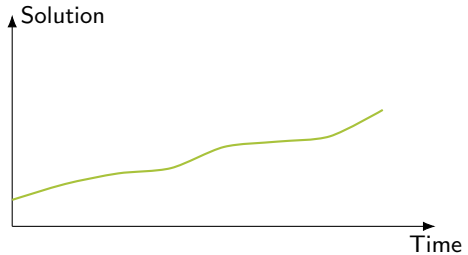
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Coarse model  
low-expensive approximation

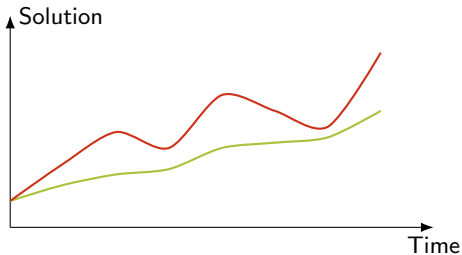


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Coarse model  
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Fine model  
more accurate, more expensive

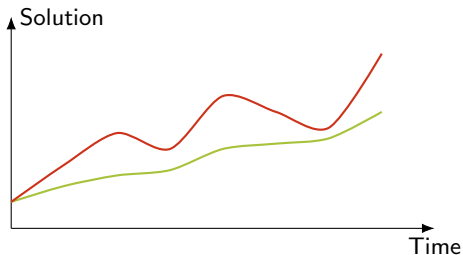


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- **Predictor-corrector iterative parallel-in-time methods**

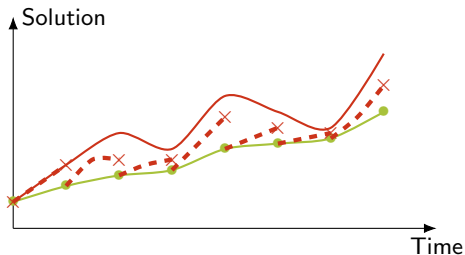
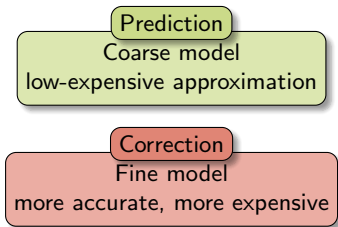
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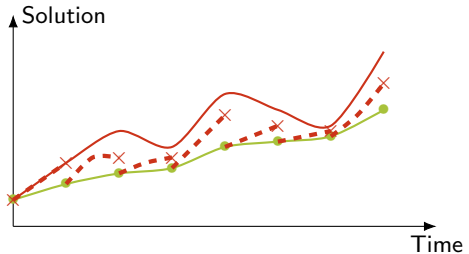
- How to improve results provided by the porosity-based SWE?
- **Predictor-corrector iterative parallel-in-time methods**
  - Parareal, PITA, PFASST, MGRIT,...

Prediction

Coarse model  
low-expensive approximation

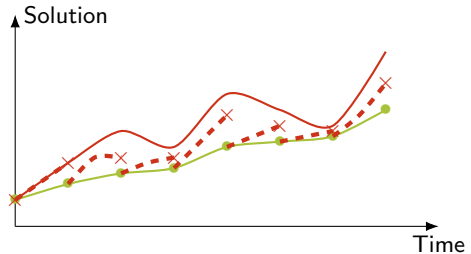
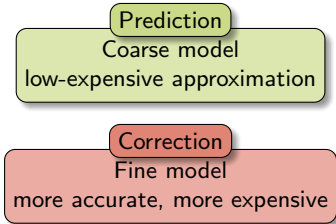
Correction

Fine model  
more accurate, more expensive



# Introduction

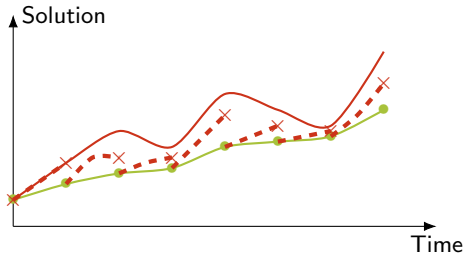
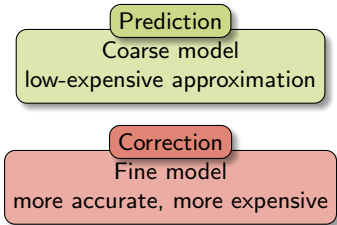
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- **Predictor-corrector iterative parallel-in-time methods**
  - Parareal, PITA, PFASST, MGRIT,...
  - Well-known issues when applied to hyperbolic problems.





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- How to improve results provided by the porosity-based SWE?
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  - Parareal, PITA, PFASST, MGRIT,...
  - Well-known issues when applied to hyperbolic problems.
  - Alternatives and adaptations





# Objectives



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- Couple classical and porosity-based SWE using **parareal methods**



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  - **Application to the simulation of urban floods**
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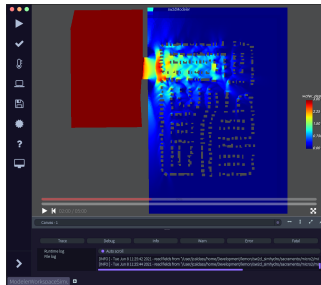


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    - ▶ Identify limitations and improve methods
  - **Application to the simulation of urban floods**
    - ▶ Identify additional challenges and improvement opportunities
- **Contribution to the SW2D software**
  - Developed by Inria LEMON team
  - Classical and porosity-based SWE
  - Explicit finite volumes discretization;



sw2d.inria.fr





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- 1 The parareal method and its adaptation using reduced-order models
- 2 Improving the parareal performance
- 3 Coupling the classical and porosity-based shallow water models
- 4 Conclusions and perspectives

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- 1 The parareal method and its adaptation using reduced-order models
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Parareal

Improvements

Coupling

Conclusion

## The parareal method

[Lions et al., 2001]



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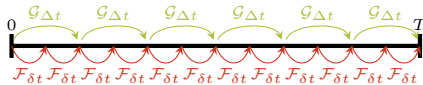
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  - Accurate but too expensive



## The parareal method

[Lions et al., 2001]

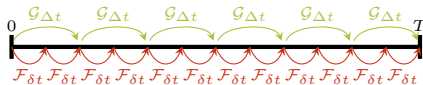
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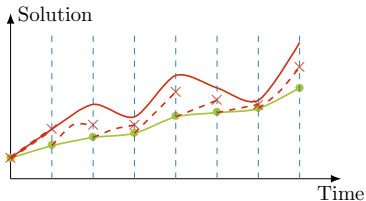
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### Predictor-corrector iterative method

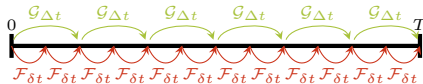




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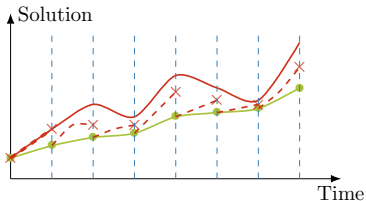
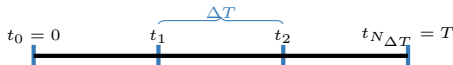
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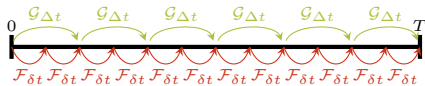
- $N_{\Delta T}$  time slices



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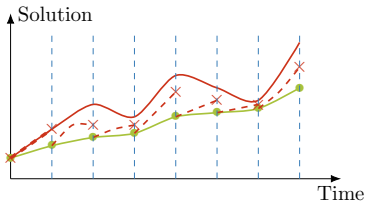
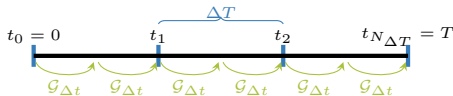
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- $N_{\Delta T}$  time slices
- Sequential **coarse predictions**



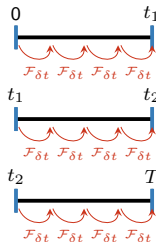
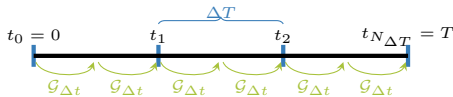
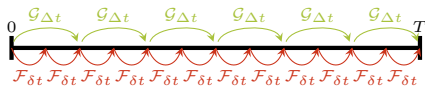
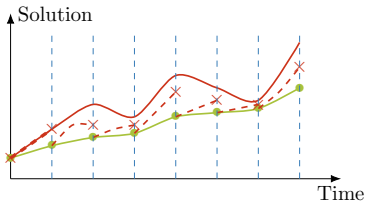
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- **Parallel fine corrections**



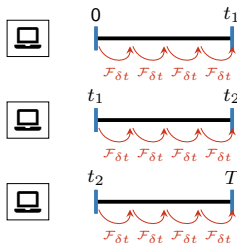
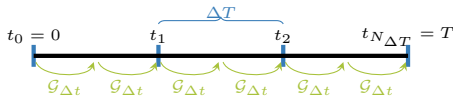
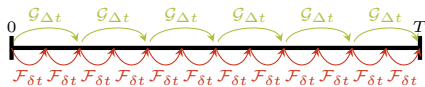
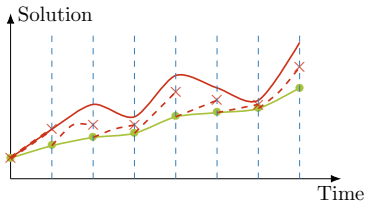
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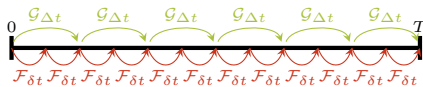
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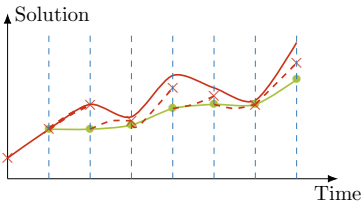
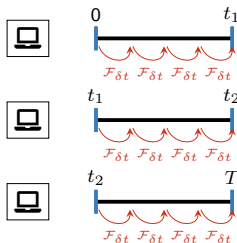
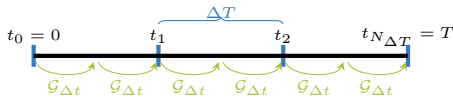
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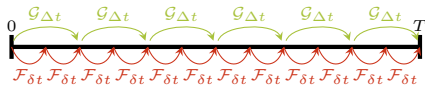
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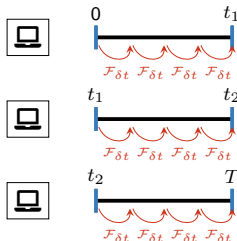
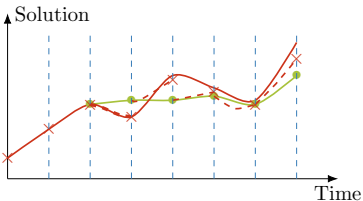
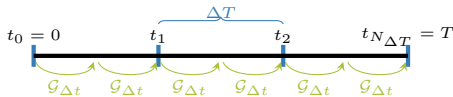
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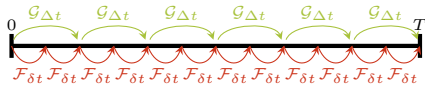
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## The parareal method

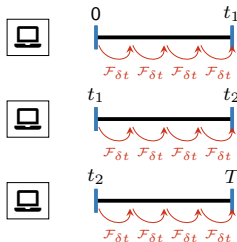
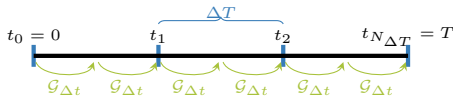
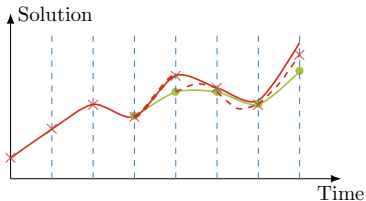
[Lions et al., 2001]

- $\mathcal{F}_{\delta t}$ : A **fine discretization**
  - Accurate but too expensive
- $\mathcal{G}_{\Delta t}$ : A **coarser discretization**
  - Much cheaper but less accurate



### Predictor-corrector iterative method

- $N_{\Delta T}$  time slices
- Sequential **coarse predictions**
- **Parallel fine corrections**



Parareal

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## Performance of parallel-in-time methods



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- Objective: convergence in few ( $\ll N_{\Delta T}$ ) iterations;
- Fast convergence for parabolic, diffusive problems;
- In the case of hyperbolic problems: slow convergence, instabilities
- Causes (Ruprecht, 2018):
  - Mismatch of discrete phase speeds between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$
  - Mainly on high wavenumbers (damped in parabolic problems);



## The ROM-based parareal method

[Chen et al., 2014]

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- Low-dimensional approximation to an expensive problem;

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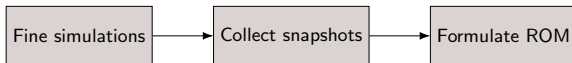
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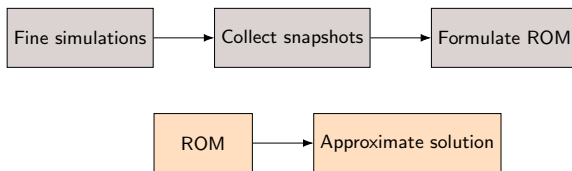
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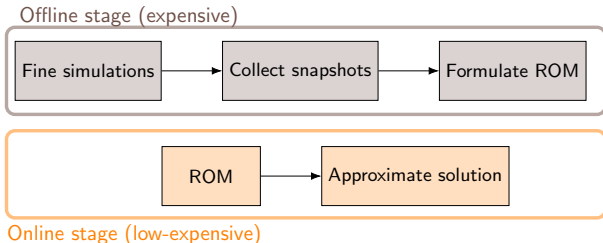
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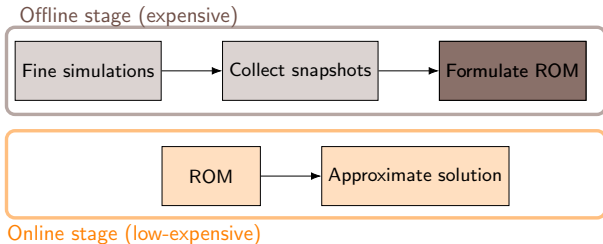
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- **Nonlinear problems:** combined POD-EIM

(Barrault et al., 2004; Chaturantabut & Sorensen, 2010)

- **POD:** proper orthogonal decomposition
- **EIM:** empirical interpolation method





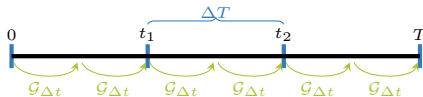
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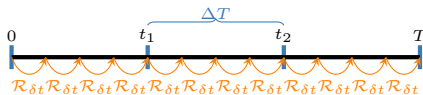
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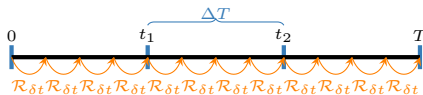
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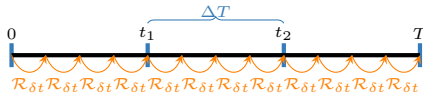
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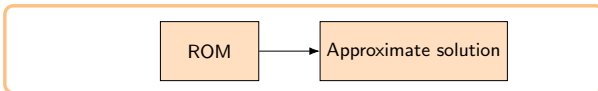
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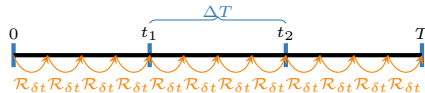


Online stage (low-expensive)

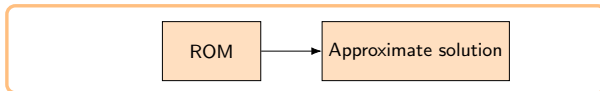
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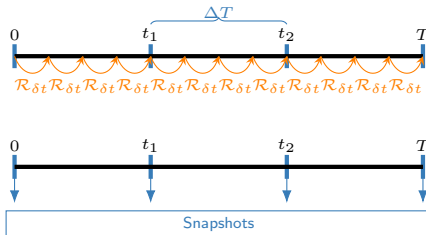


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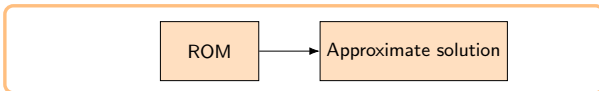
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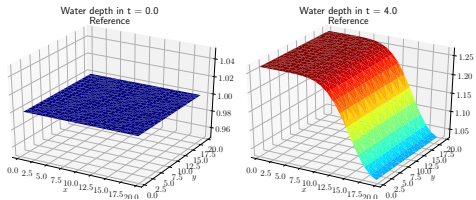
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- Pseudo-2D test case:



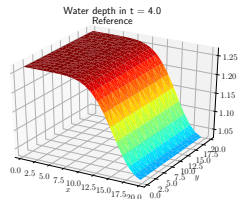
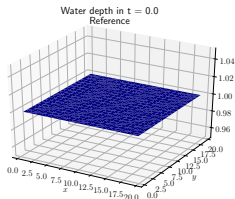


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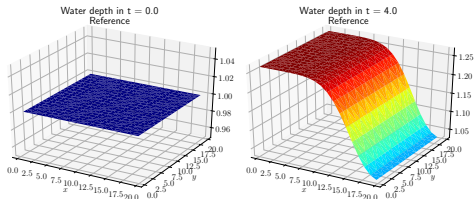


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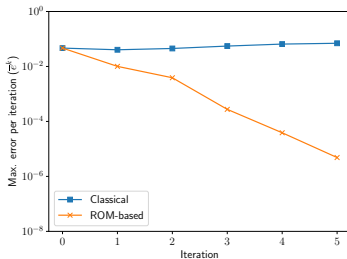
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### Errors

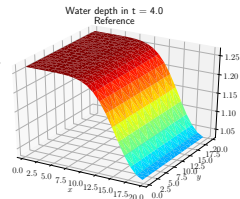
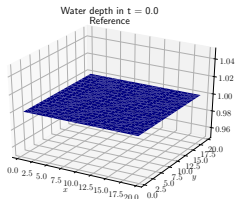


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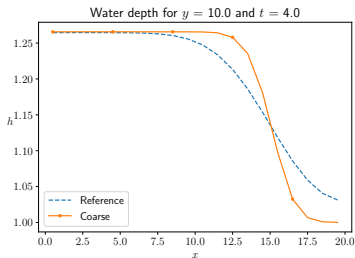
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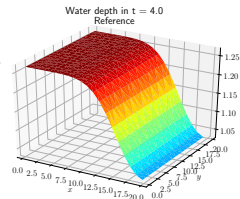
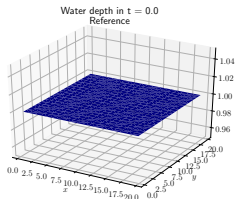
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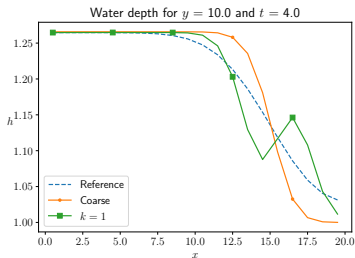
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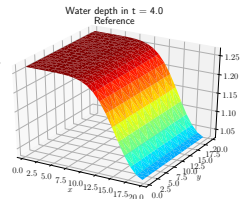
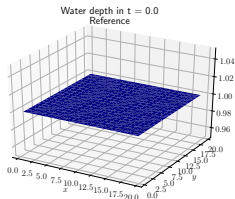
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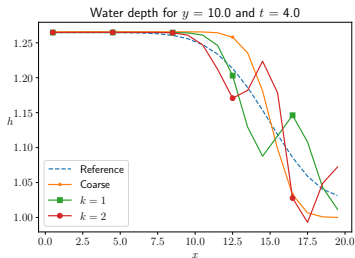
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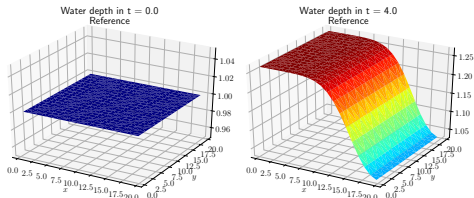
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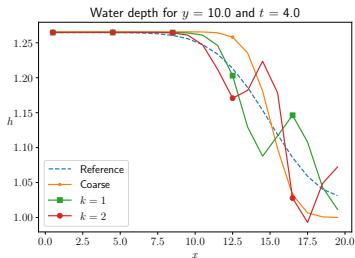
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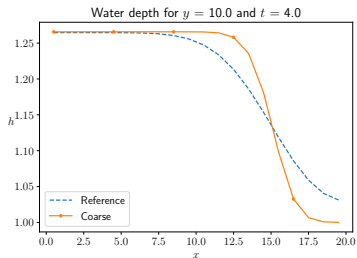
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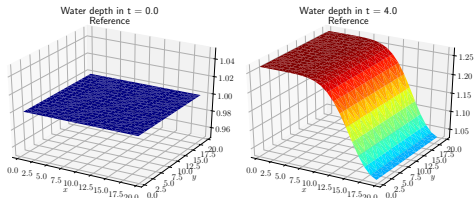


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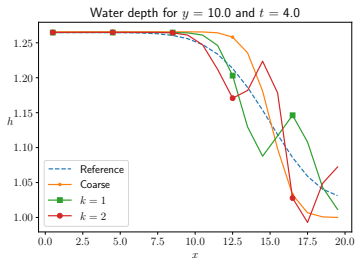
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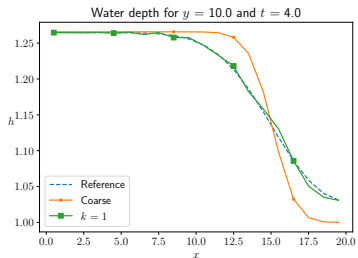
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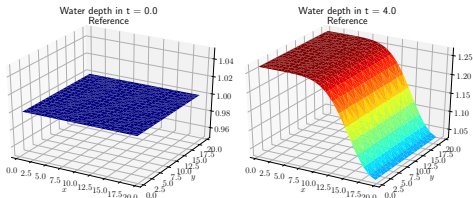


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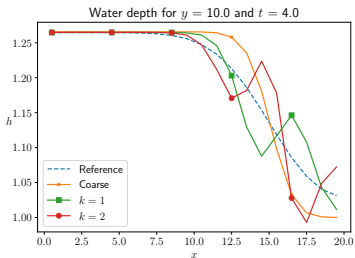
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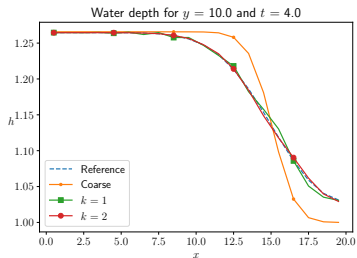
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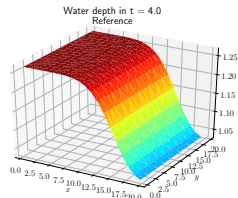
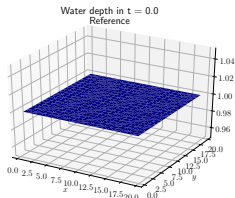


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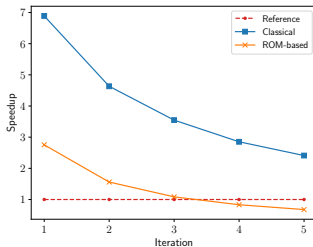
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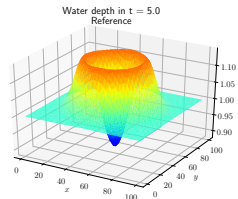
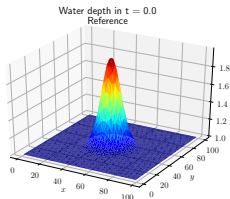


### Speedup



## First comparisons between the classical and ROM-based parareal

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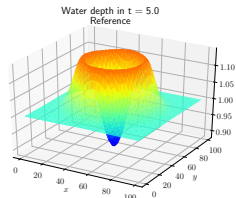
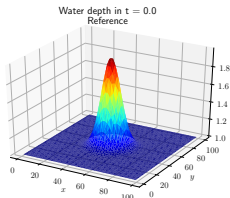
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### ■ 2D test case:

$\mathcal{F}_{\delta t}$	$\mathcal{G}_{\Delta t}$
$\delta t = 0.001$	$\Delta t = 0.25$
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$T = 5$ ,  $N_{\Delta T} = 20$  time slices,

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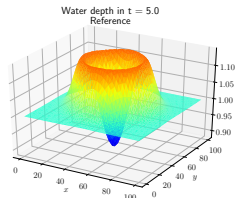
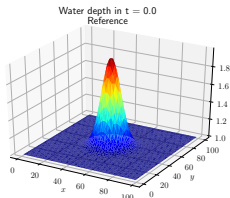


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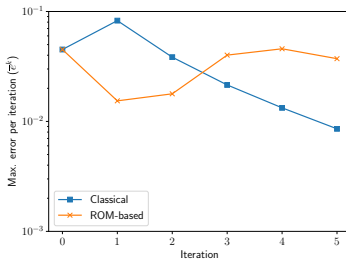
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### Errors per iteration

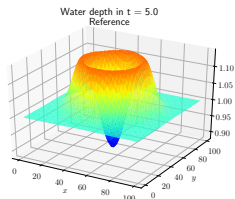
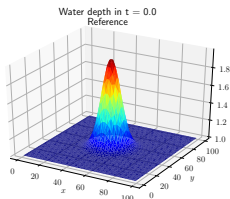


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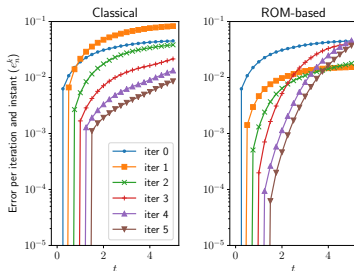
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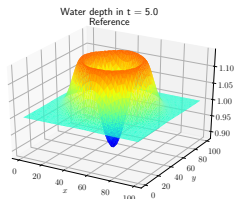
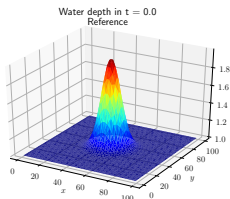


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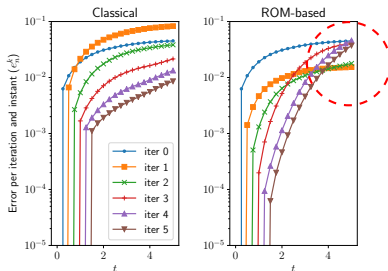
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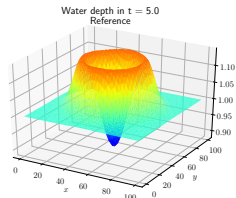
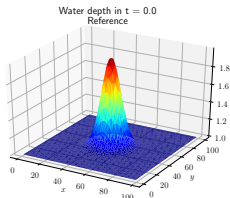


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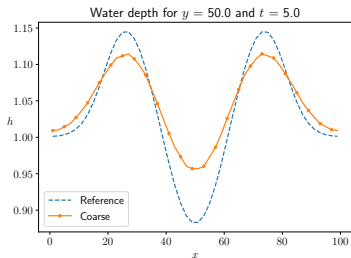
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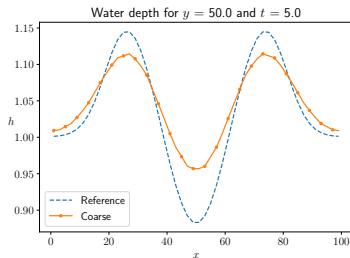
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### Classical parareal



### ROM-based parareal

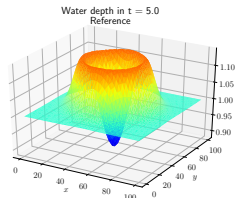
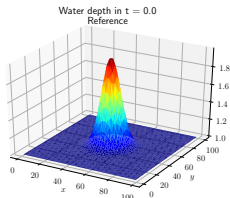


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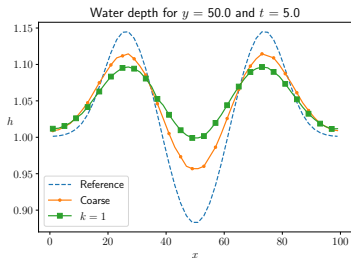
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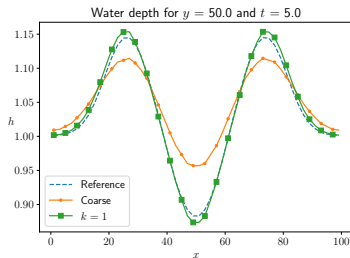
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### Classical parareal



### ROM-based parareal



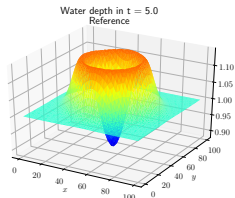
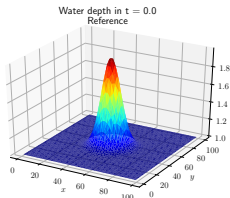


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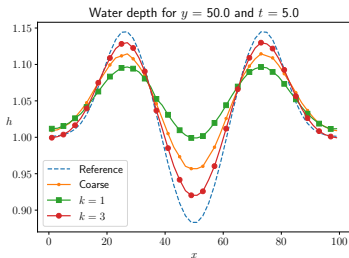
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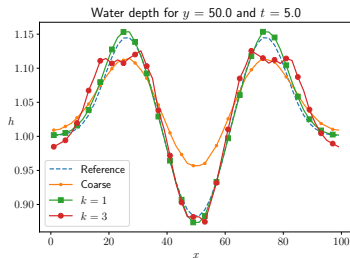
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### Classical parareal



### ROM-based parareal

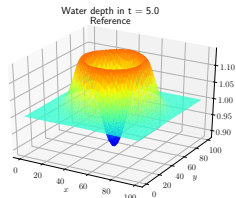
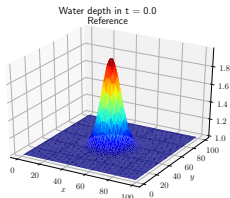


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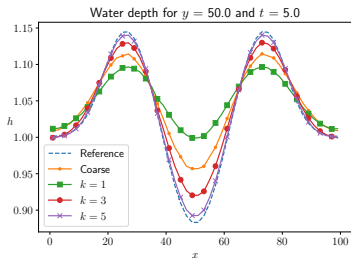
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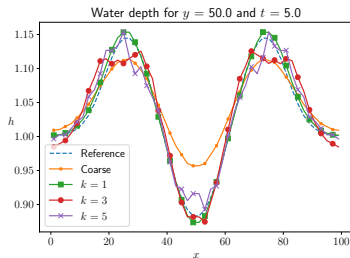
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### Classical parareal



### ROM-based parareal

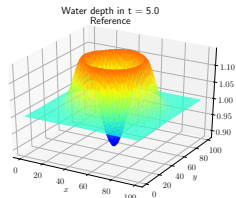
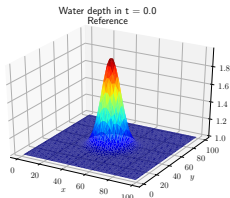


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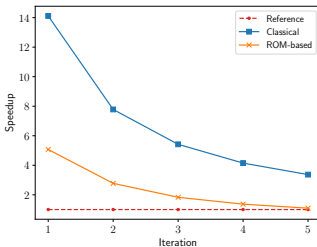
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### Speedup



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- 1 The parareal method and its adaptation using reduced-order models
- 2 Improving the parareal performance**
- 3 Coupling the classical and porosity-based shallow water models
- 4 Conclusions and perspectives

Parareal

Improvements

Coupling

Conclusion

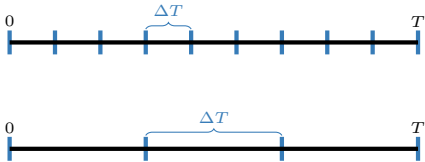
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- Increase time slice length (Ruprecht, 2018)

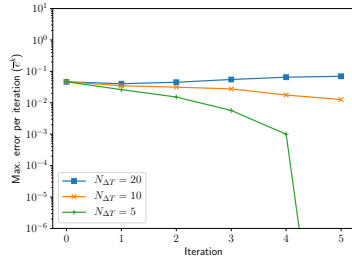
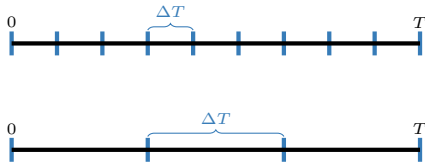
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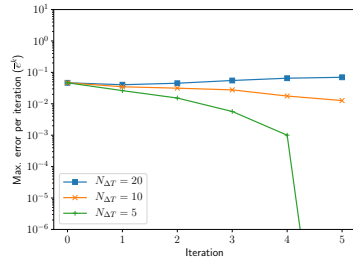
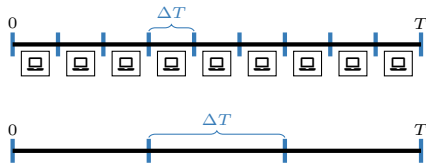
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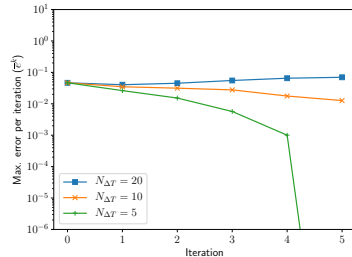
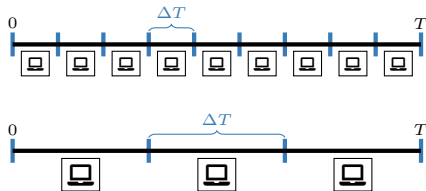
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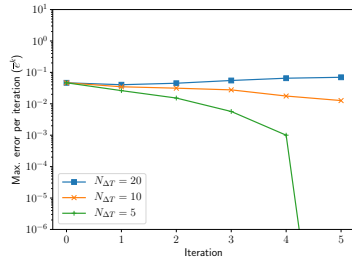
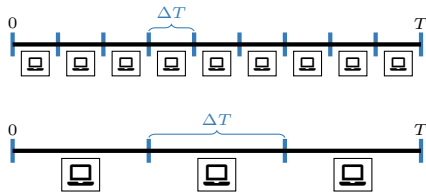
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**Trade-off between convergence, stability and computational cost**

Parareal

Improvements

Coupling

Conclusion

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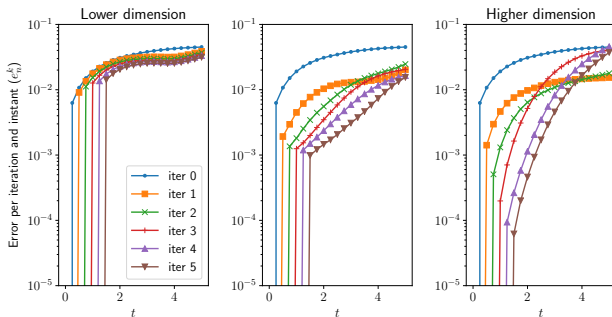
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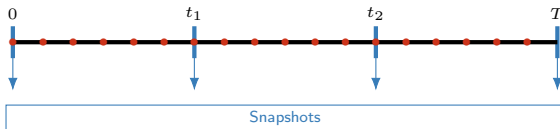
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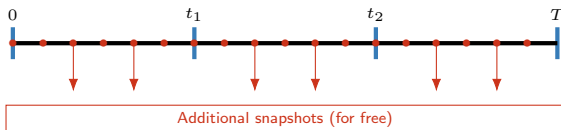
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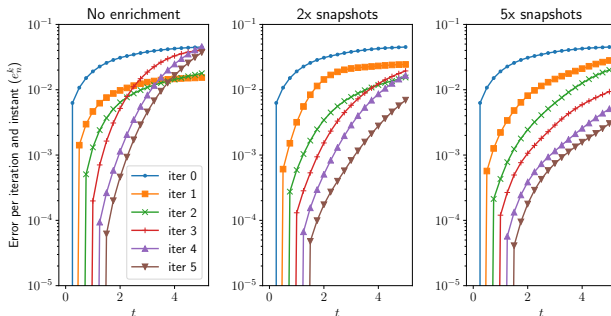
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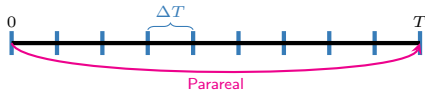


## How to improve the ROM-based parareal performance?

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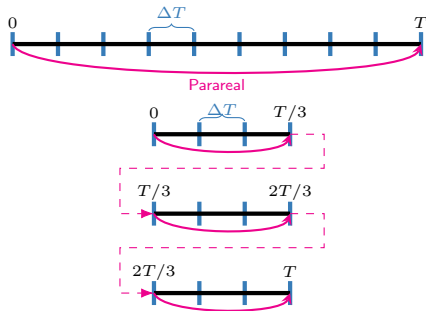
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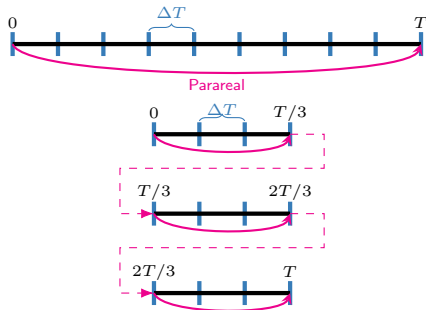
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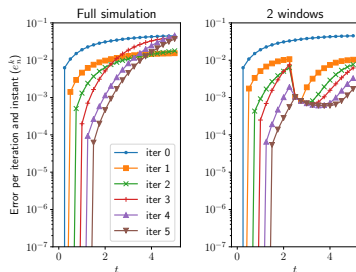
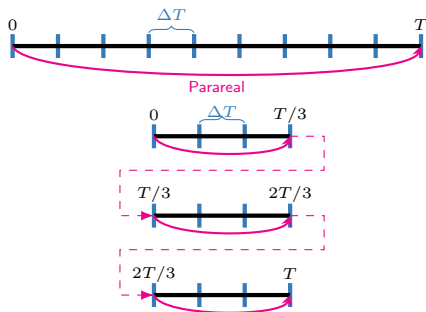
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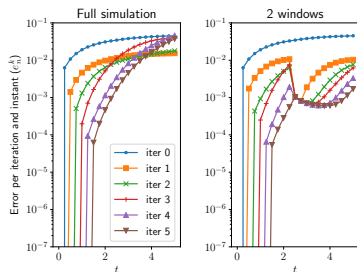
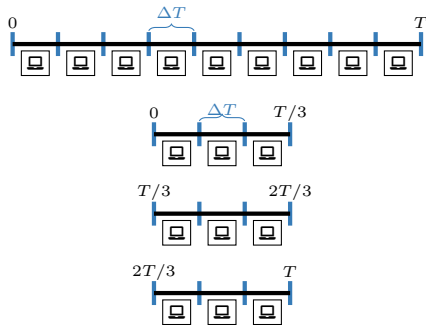
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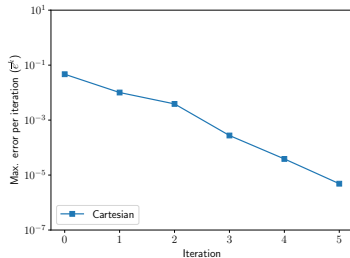
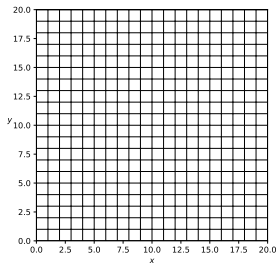


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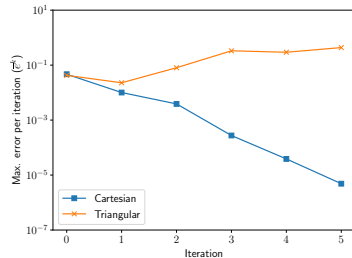
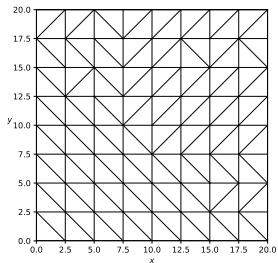
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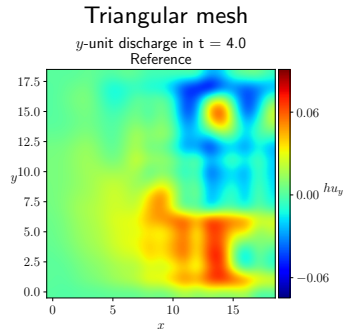
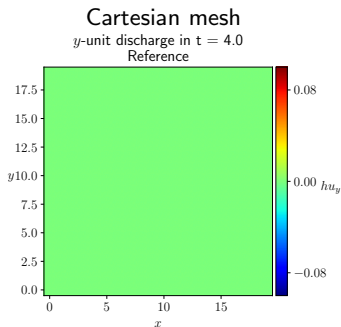
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**ROM quality  $\implies$  performance of the ROM-based parareal method**

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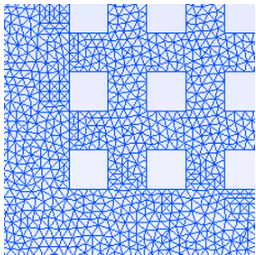
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## Parareal for coupling the classical and porosity-based SWE

- Application to the simulation of urban floods

## Parareal for coupling the classical and porosity-based SWE

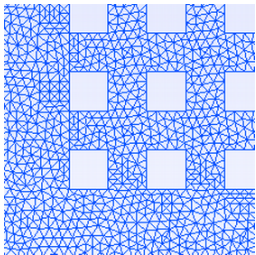
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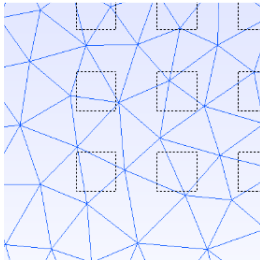
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## Parareal for coupling the classical and porosity-based SWE

- Application to the simulation of urban floods
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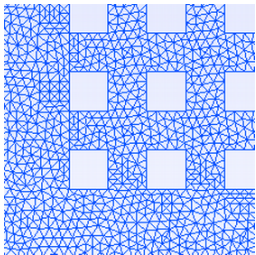
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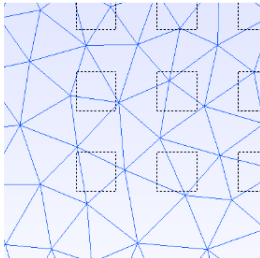
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## Parareal for coupling the classical and porosity-based SWE

- Application to the simulation of urban floods
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- Challenges:



$$\frac{\partial}{\partial t} \mathbf{U} + \frac{\partial}{\partial x} \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \mathbf{G}(\mathbf{U}) = \mathbf{S}(\mathbf{U})$$

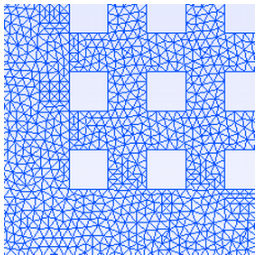


$$\frac{\partial}{\partial t} \phi \mathbf{U} + \frac{\partial}{\partial x} \phi \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \phi \mathbf{G}(\mathbf{U}) = \bar{\mathbf{S}}(\mathbf{U})$$

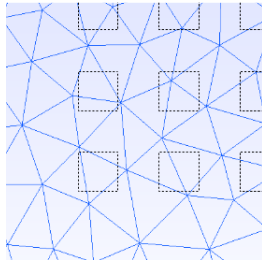


## Parareal for coupling the classical and porosity-based SWE

- Application to the simulation of urban floods
  - Fine (reference model): classical SWE
  - Coarse model: porosity-based SWE
- Challenges:
  - Large spatial and temporal domains



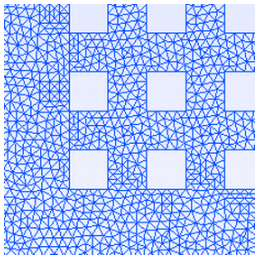
$$\frac{\partial}{\partial t} \mathbf{U} + \frac{\partial}{\partial x} \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \mathbf{G}(\mathbf{U}) = \mathbf{S}(\mathbf{U})$$



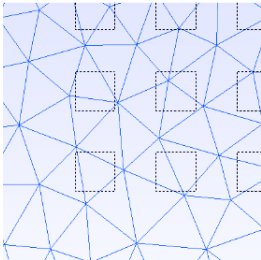
$$\frac{\partial}{\partial t} \phi \mathbf{U} + \frac{\partial}{\partial x} \phi \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \phi \mathbf{G}(\mathbf{U}) = \bar{\mathbf{S}}(\mathbf{U})$$

## Parareal for coupling the classical and porosity-based SWE

- Application to the simulation of urban floods
  - Fine (reference model): classical SWE
  - Coarse model: porosity-based SWE
- Challenges:
  - Large spatial and temporal domains
  - Spatial coarsening



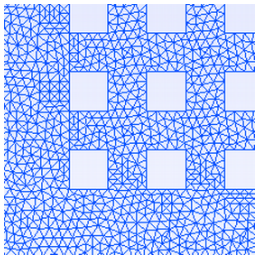
$$\frac{\partial}{\partial t} \mathbf{U} + \frac{\partial}{\partial x} \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \mathbf{G}(\mathbf{U}) = \mathbf{S}(\mathbf{U})$$



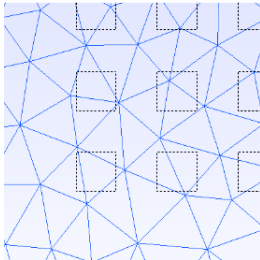
$$\frac{\partial}{\partial t} \phi \mathbf{U} + \frac{\partial}{\partial x} \phi \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \phi \mathbf{G}(\mathbf{U}) = \bar{\mathbf{S}}(\mathbf{U})$$

## Parareal for coupling the classical and porosity-based SWE

- Application to the simulation of urban floods
  - Fine (reference model): classical SWE
  - Coarse model: porosity-based SWE
- Challenges:
  - Large spatial and temporal domains
  - Spatial coarsening
  - Highly discontinuous solutions



$$\frac{\partial}{\partial t} \mathbf{U} + \frac{\partial}{\partial x} \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \mathbf{G}(\mathbf{U}) = \mathbf{S}(\mathbf{U})$$



$$\frac{\partial}{\partial t} \phi \mathbf{U} + \frac{\partial}{\partial x} \phi \mathbf{F}(\mathbf{U}) + \frac{\partial}{\partial y} \phi \mathbf{G}(\mathbf{U}) = \bar{\mathbf{S}}(\mathbf{U})$$

Parareal

Improvements

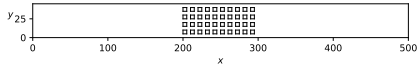
Coupling

Conclusion

**A more realistic test case**

## A more realistic test case

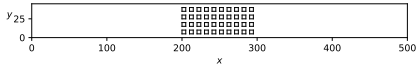
- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;



## A more realistic test case

- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;
  - Various spatial and temporal mesh sizes; near CFL.

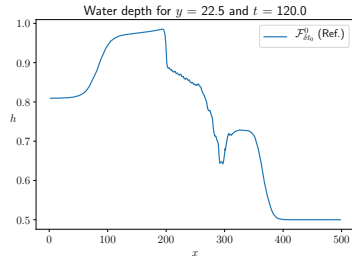
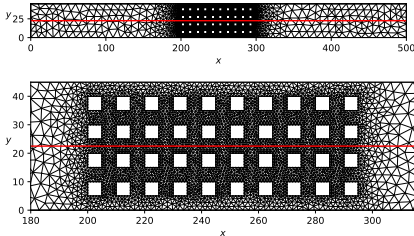
	Mesh size	Time step
$\mathcal{F}_{\delta t_0}^0$	1.0	0.05
$\mathcal{F}_{\delta t_1}^1$	2.5	0.25
$\mathcal{G}_{\Delta t}$	11.9	0.5



## A more realistic test case

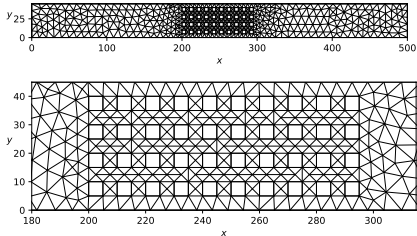
- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;
  - Various spatial and temporal mesh sizes; near CFL.

	Mesh size	Time step
$\mathcal{F}_{\delta t_0}^0$	1.0	0.05
$\mathcal{F}_{\delta t_1}^1$	2.5	0.25
$\mathcal{G}_{\Delta t}$	11.9	0.5

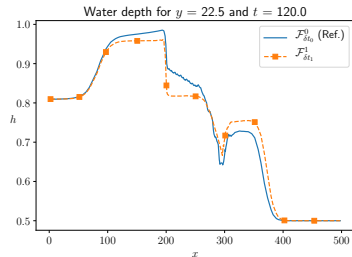


## A more realistic test case

- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;
  - Various spatial and temporal mesh sizes; near CFL.



	Mesh size	Time step
$\mathcal{F}_{\delta t_0}^0$	1.0	0.05
$\mathcal{F}_{\delta t_1}^1$	2.5	0.25
$\mathcal{G}_{\Delta t}$	11.9	0.5

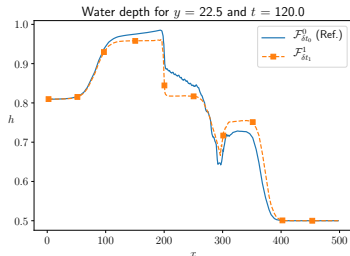
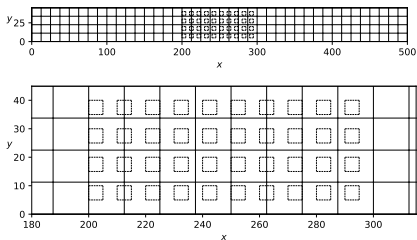




## A more realistic test case

- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;
  - Various spatial and temporal mesh sizes; near CFL.

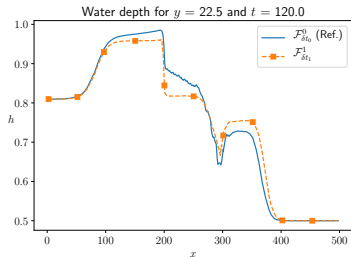
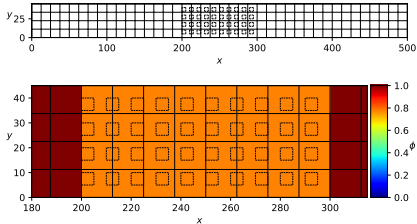
	Mesh size	Time step
$\mathcal{F}_{\delta t_0}^0$	1.0	0.05
$\mathcal{F}_{\delta t_1}^1$	2.5	0.25
$\mathcal{G}_{\Delta t}$	11.9	0.5



## A more realistic test case

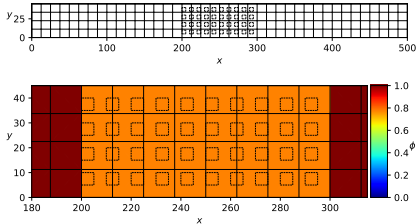
- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;
  - Various spatial and temporal mesh sizes; near CFL.

	Mesh size	Time step
$\mathcal{F}_{\delta t_0}^0$	1.0	0.05
$\mathcal{F}_{\delta t_1}^1$	2.5	0.25
$\mathcal{G}_{\Delta t}$	11.9	0.5

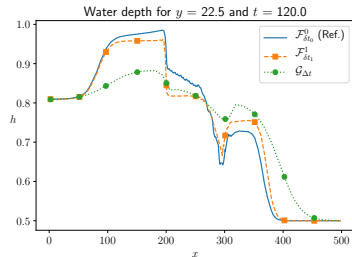


## A more realistic test case

- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;
  - Various spatial and temporal mesh sizes; near CFL.

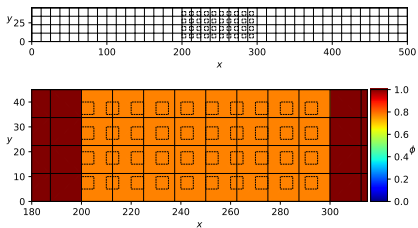


	Mesh size	Time step
$\mathcal{F}_{\delta t_0}^0$	1.0	0.05
$\mathcal{F}_{\delta t_1}^1$	2.5	0.25
$\mathcal{G}_{\Delta t}$	11.9	0.5

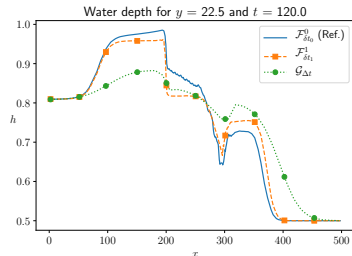


## A more realistic test case

- Influence of coarsening between  $\mathcal{F}_{\delta t}$  and  $\mathcal{G}_{\Delta t}$  on the performance;
  - Various spatial and temporal mesh sizes; near CFL.
- Qualitative evaluation of convergence and speedup;



	Mesh size	Time step
$\mathcal{F}_{\delta t_0}^0$	1.0	0.05
$\mathcal{F}_{\delta t_1}^1$	2.5	0.25
$\mathcal{G}_{\Delta t}$	11.9	0.5





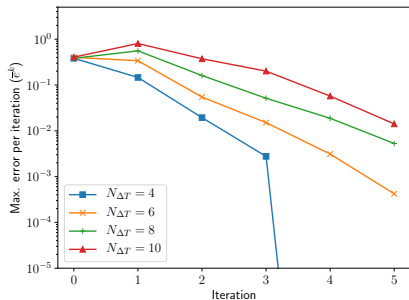
## A more realistic test case

Using the classical parareal method

## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t}$

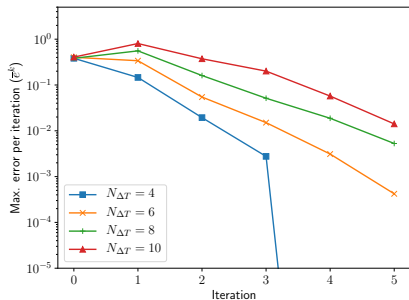


Coarse model:  $\mathcal{F}_{\delta t_1}^1$

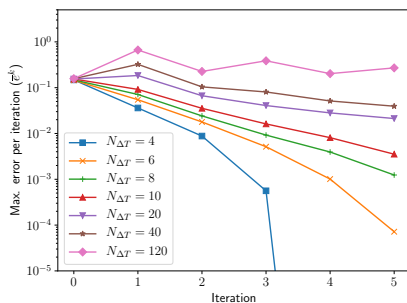
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t}$



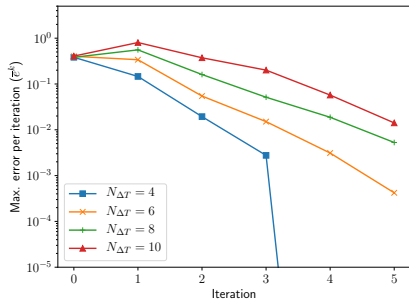
Coarse model:  $\mathcal{F}_{\delta t_1}^1$



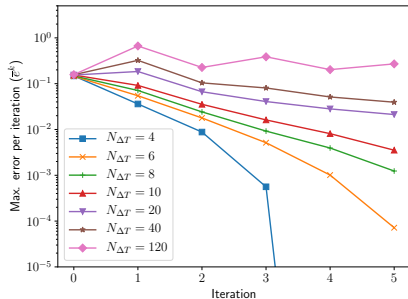
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



Coarse model:  $\mathcal{F}_{\delta t_1}^1$

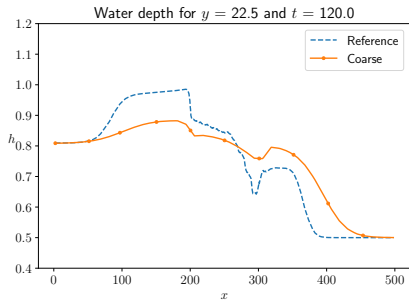




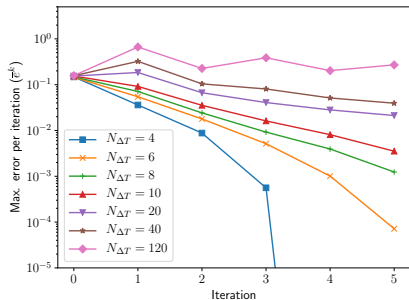
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



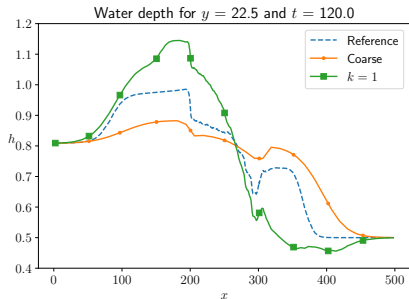
Coarse model:  $\mathcal{F}_{\delta t_1}^1$



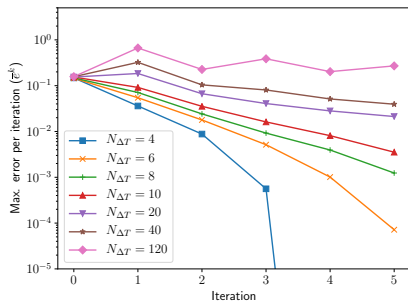
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



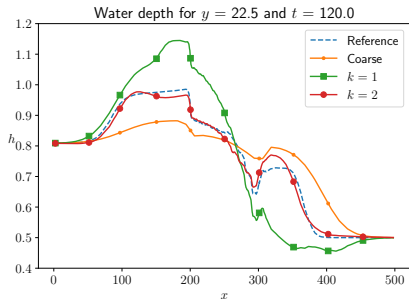
Coarse model:  $\mathcal{F}_{\delta t_1}^1$



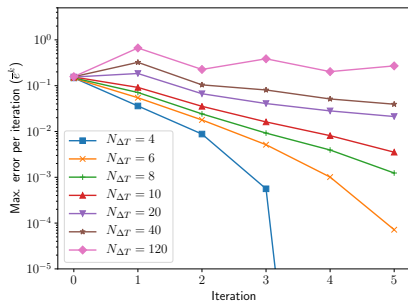
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



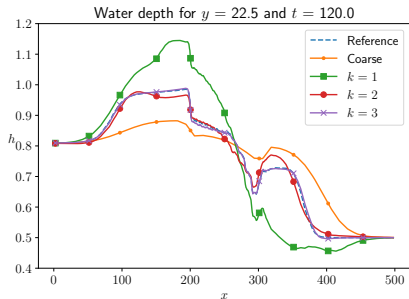
Coarse model:  $\mathcal{F}_{\delta t_1}^1$



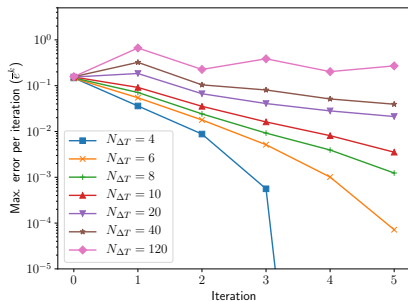
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



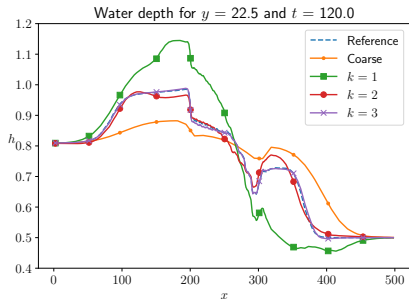
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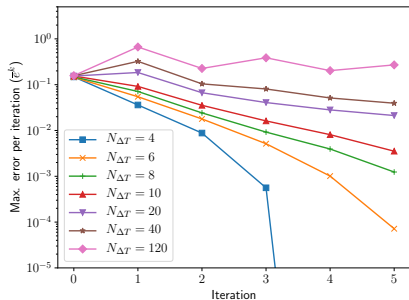
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



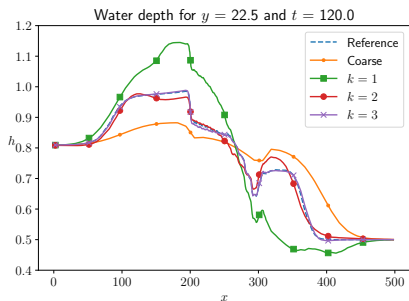
Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$



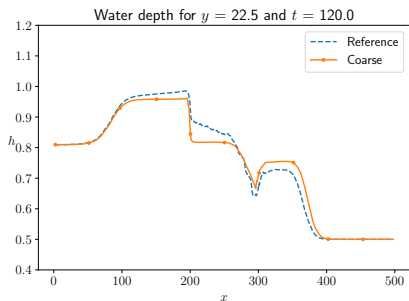
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



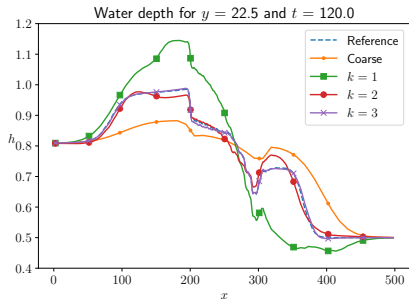
Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$



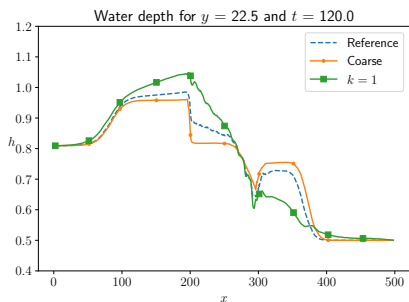
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



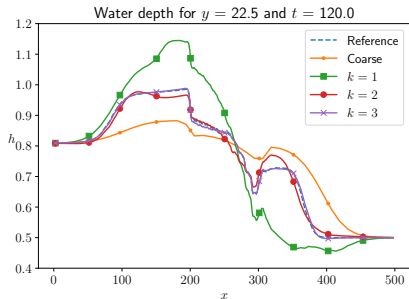
Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$



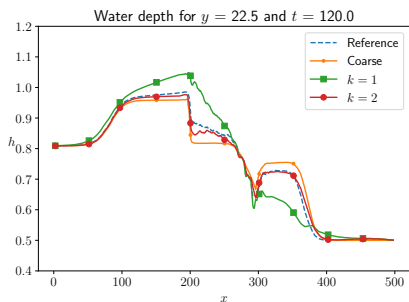
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$

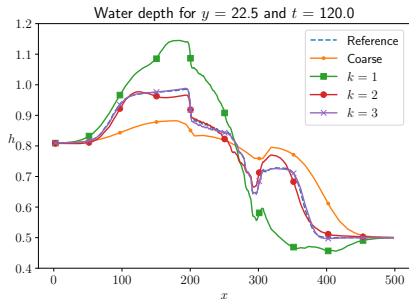




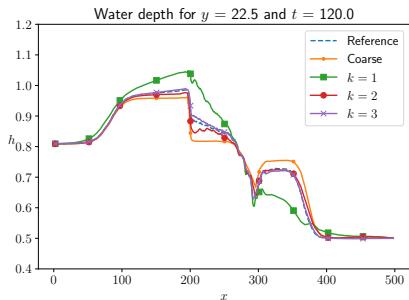
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



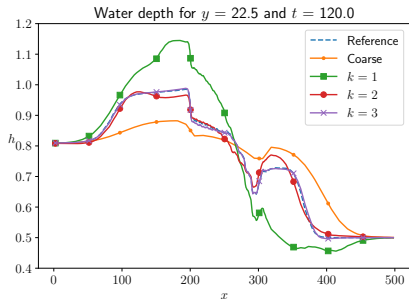
Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$



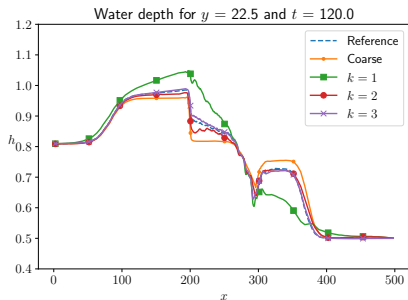
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$



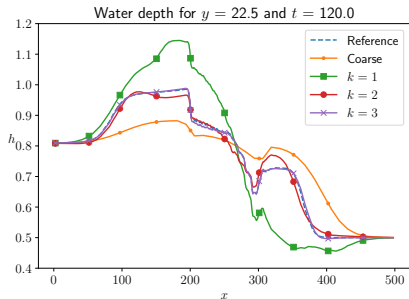
#### ■ Speedup after

- 2 iterations: 2.40
- 3 iterations: 1.66

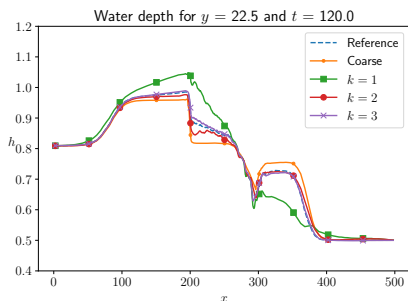
## A more realistic test case

### Using the classical parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$



#### ■ Speedup after

- 2 iterations: 2.40
- 3 iterations: 1.66

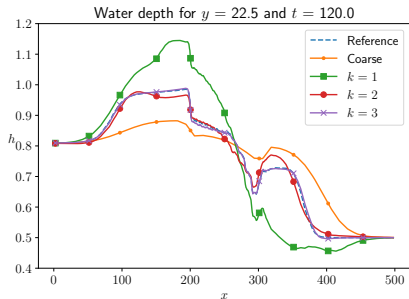
#### ■ Speedup after

- 2 iterations: 3.12
- 3 iterations: 2.35

## A more realistic test case

### Using the classical parareal method

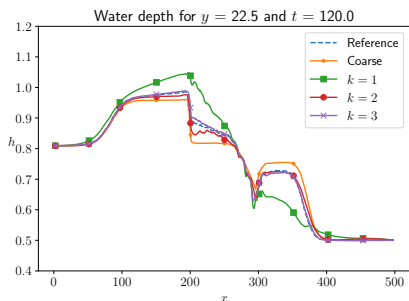
Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 6$



#### ■ Speedup after

- 2 iterations: 2.40
- 3 iterations: 1.66

Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 20$



#### ■ Speedup after

- 2 iterations: 3.12
- 3 iterations: 2.35



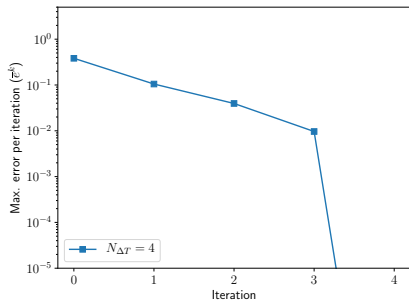
## A more realistic test case

Using the ROM-based parareal method

## A more realistic test case

### Using the ROM-based parareal method

Coarse model:  $\mathcal{G}_{\Delta t}$

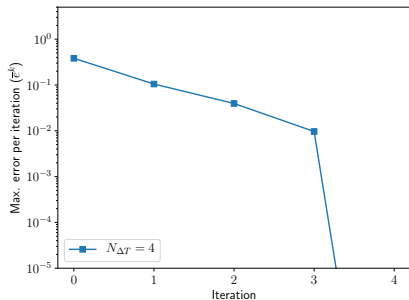


Coarse model:  $\mathcal{F}_{\delta t_1}^1$

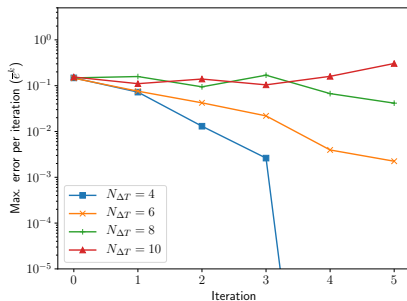
## A more realistic test case

### Using the ROM-based parareal method

Coarse model:  $\mathcal{G}_{\Delta t}$



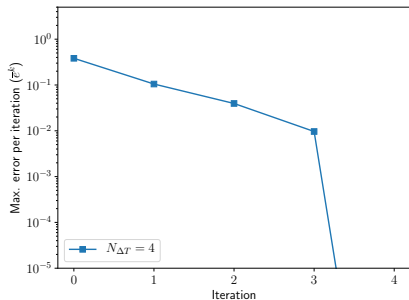
Coarse model:  $\mathcal{F}_{\delta t_1}^1$



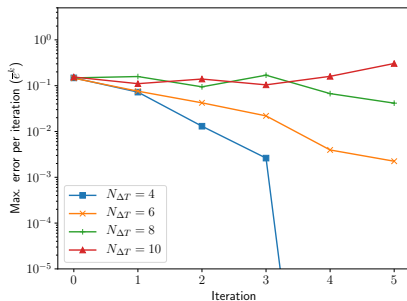
## A more realistic test case

### Using the ROM-based parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 4$



Coarse model:  $\mathcal{F}_{\delta t_1}^1$



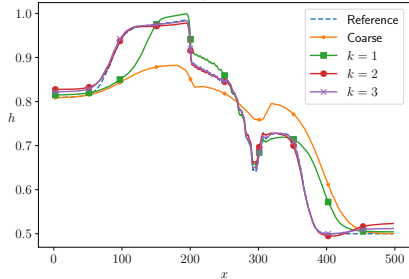


## A more realistic test case

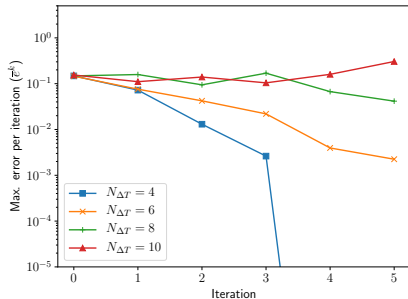
### Using the ROM-based parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 4$

Water depth for  $y = 22.5$  and  $t = 120.0$



Coarse model:  $\mathcal{F}_{\delta t_1}^1$

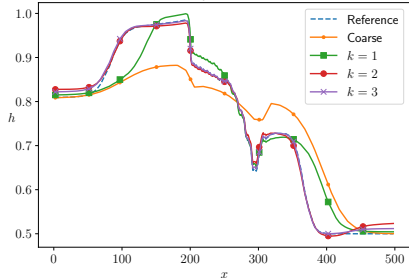


## A more realistic test case

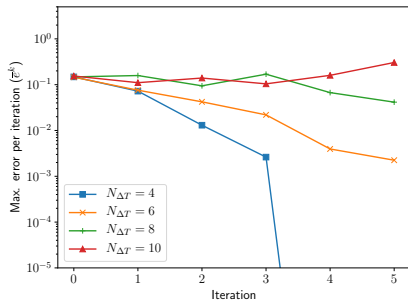
### Using the ROM-based parareal method

Coarse model:  $\mathcal{G}_{\Delta t} - N_{\Delta T} = 4$

Water depth for  $y = 22.5$  and  $t = 120.0$



Coarse model:  $\mathcal{F}_{\delta t_1}^1 - N_{\Delta T} = 4$

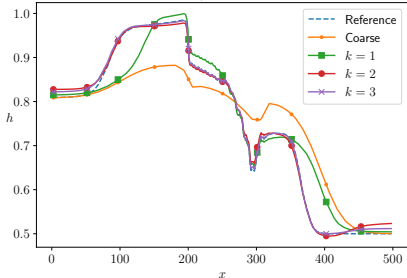


## A more realistic test case

### Using the ROM-based parareal method

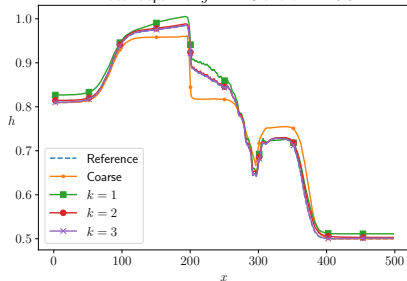
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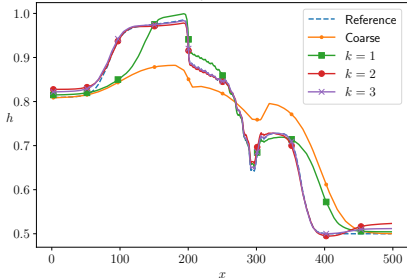


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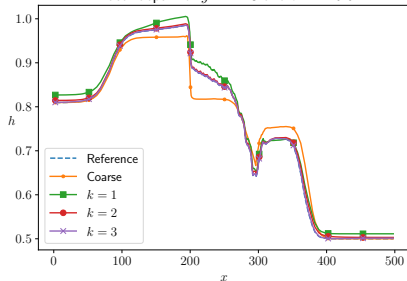


#### ■ Speedup after

- 2 iterations: 1.35
- 3 iterations: 0.92

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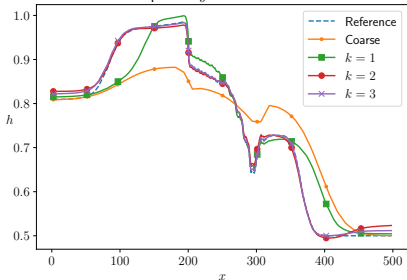
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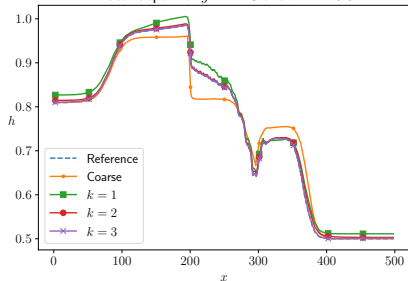


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- 1 The parareal method and its adaptation using reduced-order models
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- 4 Conclusions and perspectives

## Conclusions and perspectives

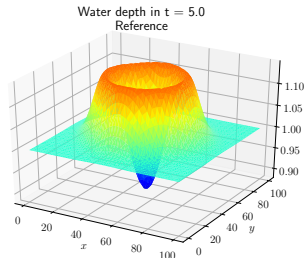
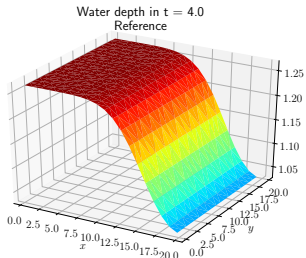
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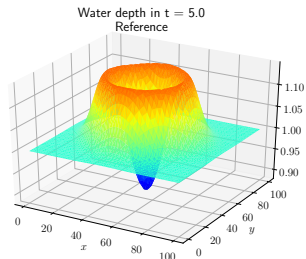
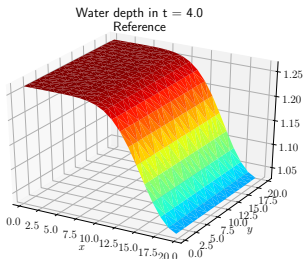




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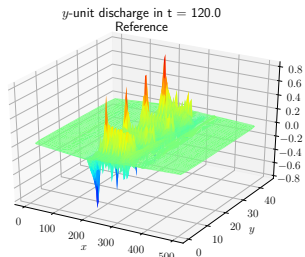
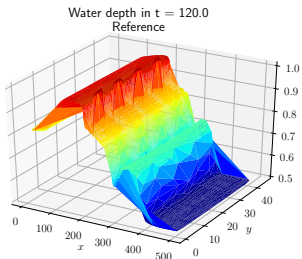
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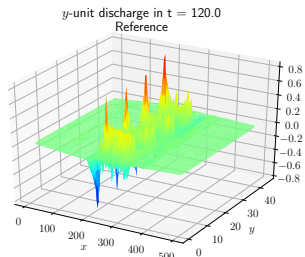
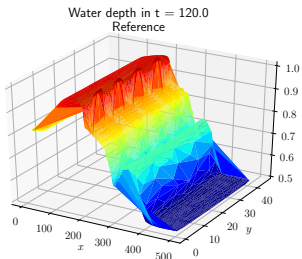
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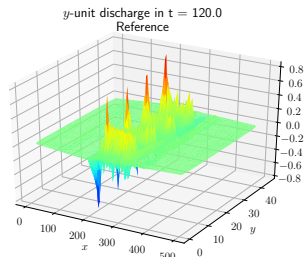
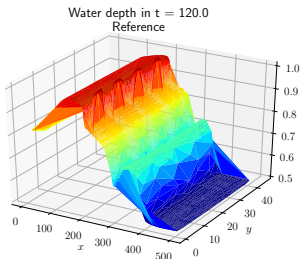
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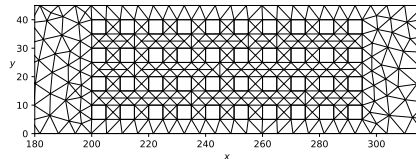
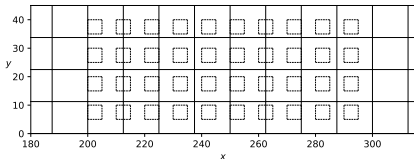
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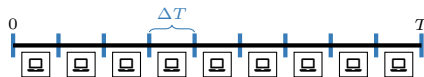
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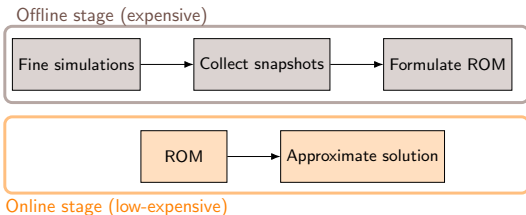
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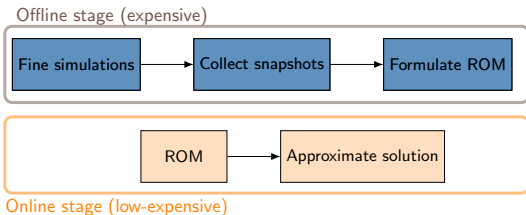
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Thank you for your attention



# Committee's deliberation

(coming back soon)

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