

# A Nonlinear and Dispersive 3D Model for Coastal Waves using Radial Basis Functions



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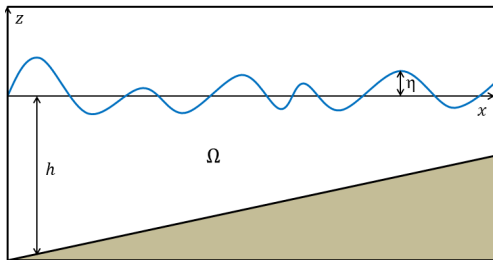
# Coastal zone wave modeling

- **Objective:** develop an accurate, nonlinear, phase-resolving nearshore wave propagation model
- **Challenge:** accurate and computationally efficient modeling of the dominant physical processes at a wide range of spatial and temporal scales



# Mathematical model

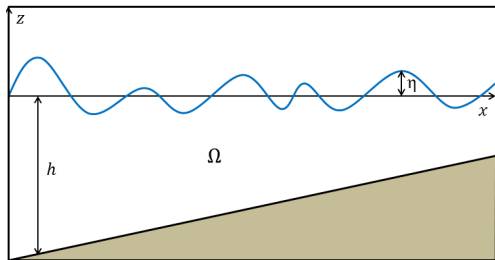
## Zakharov Equations



- incompressible flow
- inviscid fluid
- homogeneous atmospheric pressure
- irrotational flow  
 $\nabla_{3D}\phi = \underline{u}(\underline{x}, z, t)$ , with  
 $\underline{x} = (x, y)$
- continuous water column

# Mathematical model

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Temporal  
evolution  
of:

$$\begin{cases} \eta_t = -\nabla\eta\nabla\tilde{\phi} + \tilde{w} (1 + (\nabla\eta)^2) \\ \tilde{\phi}_t = -g\eta - \frac{1}{2}(\nabla\tilde{\phi})^2 + \frac{1}{2}\tilde{w}^2 (1 + (\nabla\eta)^2) \end{cases}$$

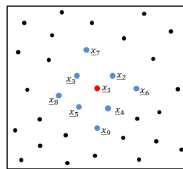
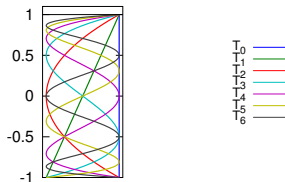
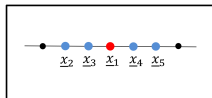
$$\text{with } \tilde{w} = \left. \frac{\partial\phi}{\partial z} \right|_{z=\eta}$$

(Zakharov, 1968)

# Numerical model

Misthyc code

- Spectral method in vertical  
(Tian et al., 2008)
- MUMPS direct linear solver  
(Amestoy et al., 2001, 2006)
- Explicit 4th order Runge-Kutta method
- Horizontal resolution:
  - 1DH: high-order finite difference schemes  
(e.g. Bingham et al., 2007)
  - 2DH: radial basis functions  
(e.g. Wright and Fornberg, 2006)

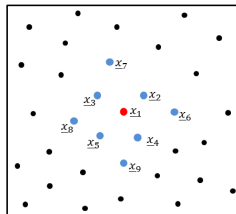


# Radial Basis Functions

Finite Difference (RBF-FD) approach

- Scattered node domain discretization
- Evaluation of linear differential operator  $L$  applied to  $f$  at node  $\underline{x}_j$ :

$$L(f)(\underline{x}_j) = \sum_{k=1}^{N_{sten}} w_{i,k}^L f(\underline{x}_k)$$



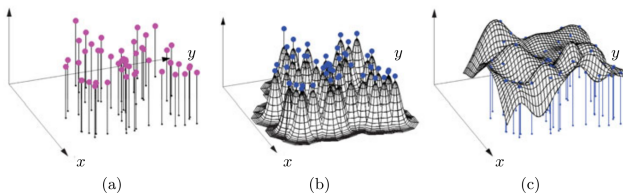
- Choice of radial basis function:  $\phi_k(\underline{x}) = \Phi(\|\underline{x} - \underline{x}_k\|)$
- Solution of  $N_{sten}$  unknown weights  $w_{i,k}^L$  for each node  $\underline{x}_i$

# Radial Basis Functions

Finite Difference (RBF-FD) approach

Implementation:

- stencil size  $N_{sten}$ ?
- what type of RBF?
- which RBF function?
- value of the shape parameter  $C$ ? (for IS RBFs)
- added polynomial of degree  $n$  ( $pn$ )?



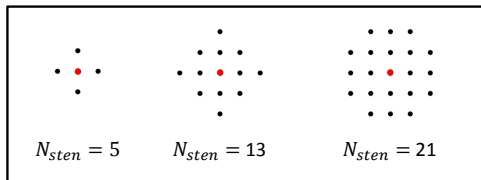
(Fornberg and Flyer, 2015)

# Radial Basis Functions

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# Radial Basis Functions

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Regularity	Type	Function $\phi(r)$	Condition
Infinitely smooth	Multiquadric ( $MQ$ )	$\sqrt{r^2 + C^2}$	$C \in \mathbf{R}$
	Inverse Multiquadric ( $IMQ$ )	$1/\sqrt{r^2 + C^2}$	$C \in \mathbf{R}$
	Inverse Quadratic ( $IQ$ )	$1/(r^2 + C^2)$	$C \in \mathbf{R}$
	Gaussian ( $GA$ )	$e^{-r^2/C^2}$	$C \in \mathbf{R}$
Piecewise smooth	Polyharmonic Spline ( $PHS$ )	$r^m$	$m$ odd integer
	Thin Plate Spline ( $TPS$ )	$r^m \log r$	$m$ even integer

# Radial Basis Functions

Finite Difference (RBF-FD) approach

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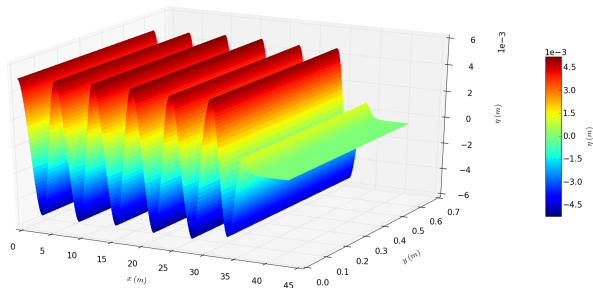
## Implementation:

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*Recommendation:  $20 \leq N_{sten} \leq 30$ , PHS  $r^7 + p3$*

# Regular wave propagation over a flat bottom [1/2]

## Analytic test case



### Regular waves:

- $A = 0.005$  m
- $T = 2.26$  s
- $L = 6.14$  m
- $h = 1$  m

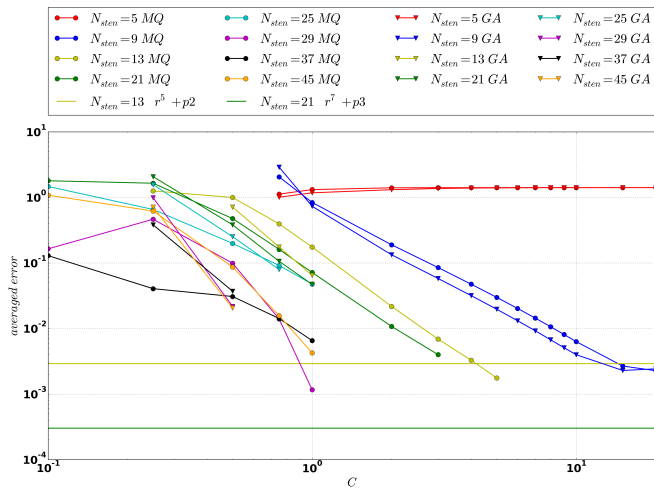
### Irregularly spaced nodes, $\Delta x = \Delta y \approx L/100$

### Constant time step $\Delta t = T/100$

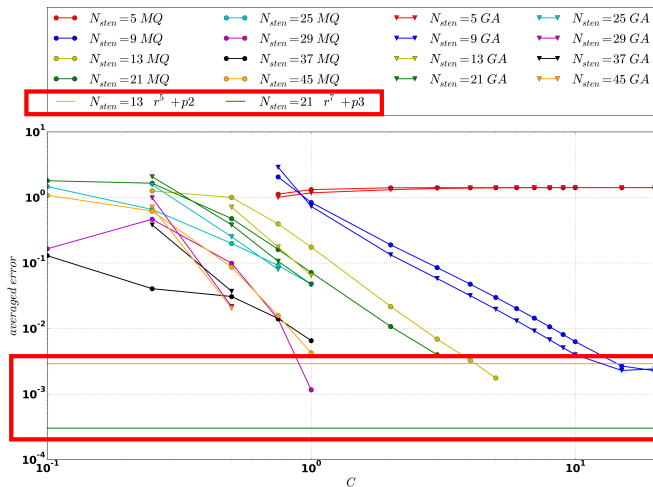
### Normalized error:

$$\text{average error} = \sqrt{\frac{\sum_{i=1}^N |\eta(\underline{x}_i) - \eta_{ref\_1DH}(\underline{x}_i)|^2}{\sum_{i=1}^N |\eta_{ref\_1DH}(\underline{x}_i)|^2}}$$

# Regular wave propagation over a flat bottom [2/2]

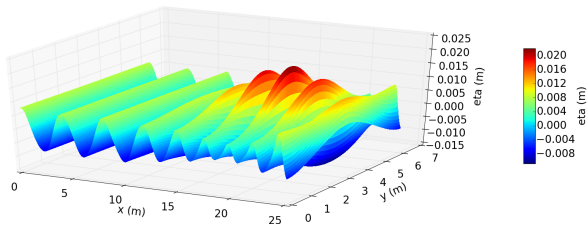


# Regular wave propagation over a flat bottom [2/2]

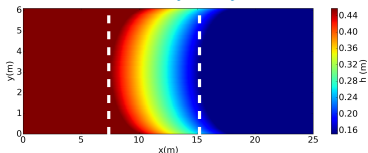


# Regular wave propagation over a convergent step [1/2]

Whalin (1971) wave tank experiments



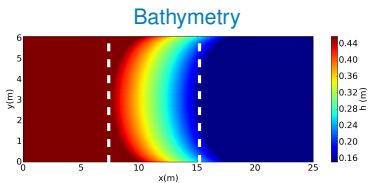
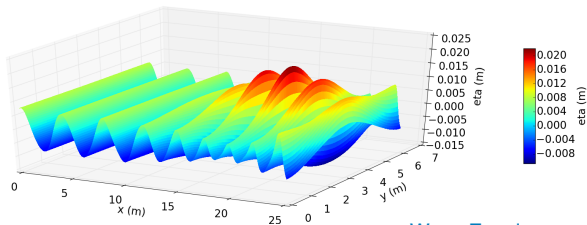
## Bathymetry



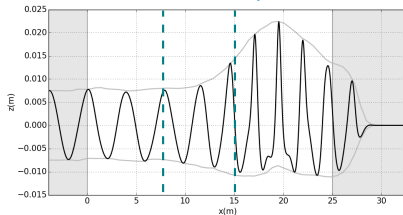
- Regular waves:
  - $A = 0.0075$  m
  - $T = 2$  s
- Regularly spaced nodes,  
 $\Delta x = \Delta y \approx L/98$
- Constant time step,  $\Delta t \approx T/112$

# Regular wave propagation over a convergent step [1/2]

Whalin (1971) wave tank experiments



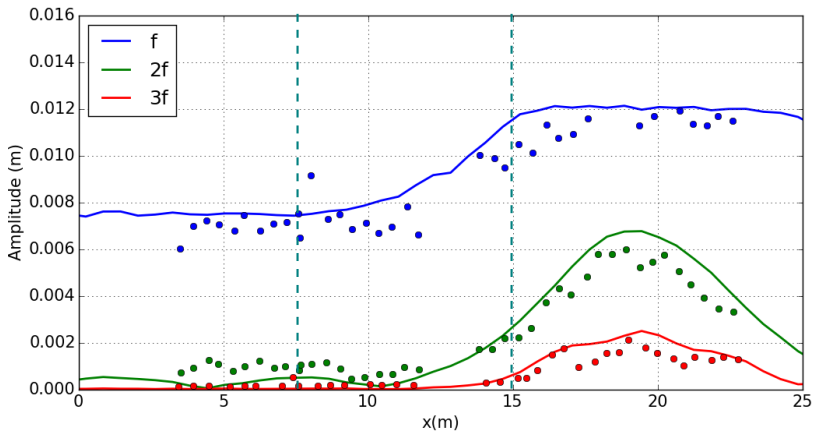
Wave Envelope





# Regular wave propagation over a convergent step [2/2]

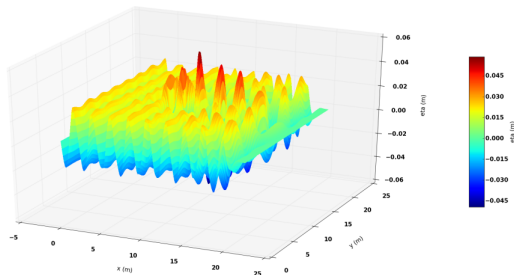
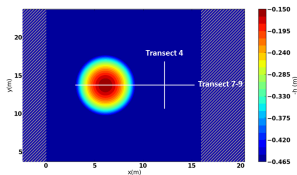
## Evolution of harmonic amplitudes



# Regular wave propagation over an elliptical shoal [1/4]

Vincent & Briggs (1989) wave tank experiments

## Bathymetry



### ■ Regular waves (case M1):

■  $A = 0.02325$  m

■  $T = 1.3$  s

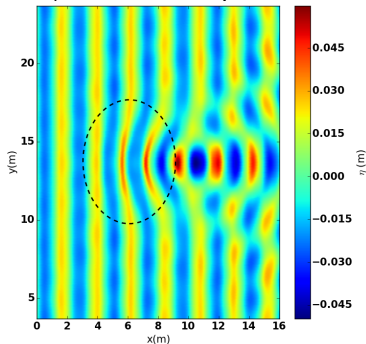
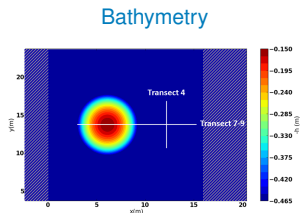
### ■ Regularly spaced nodes, $\Delta x = \Delta y \approx L/30$

### ■ Constant time step, $\Delta t \approx T/36$

### ■ $N_T = 5$

# Regular wave propagation over an elliptical shoal [1/4]

## Vincent & Briggs (1989) wave tank experiments

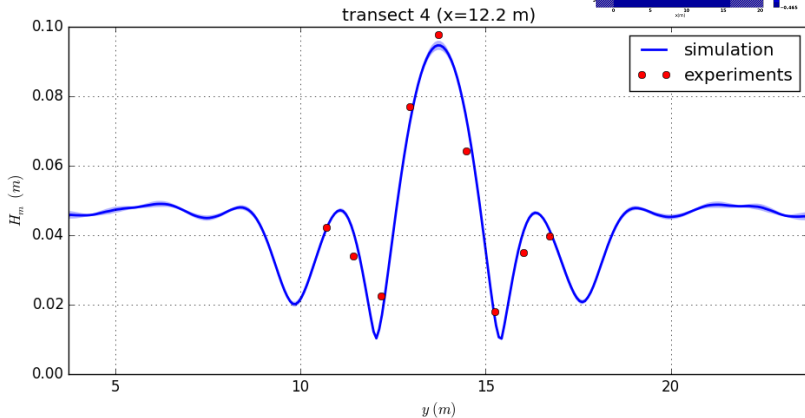
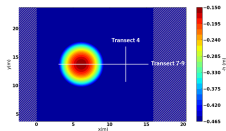


### ■ Regular waves (case M1):

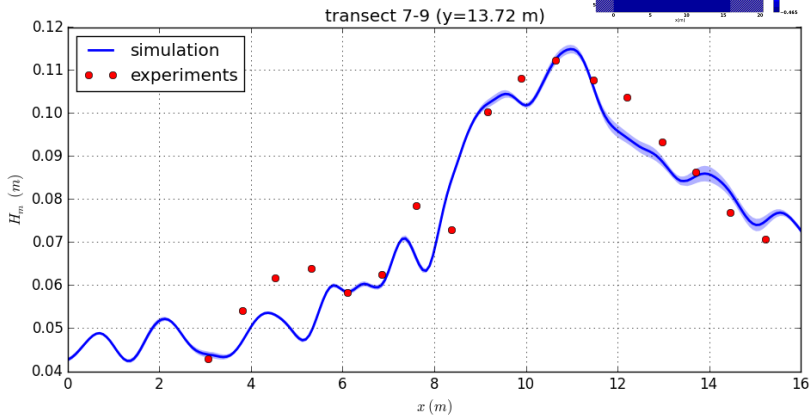
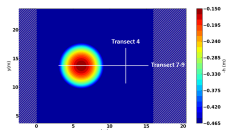
- $A = 0.02325$  m
- $T = 1.3$  s

- Regularly spaced nodes,  $\Delta x = \Delta y \approx L/30$
- Constant time step,  $\Delta t \approx T/36$
- $N_T = 5$

# Regular wave propagation over an elliptical shoal [2/4]



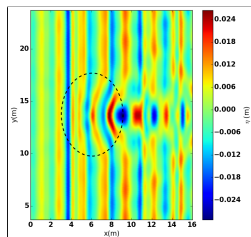
# Regular wave propagation over an elliptical shoal [3/4]



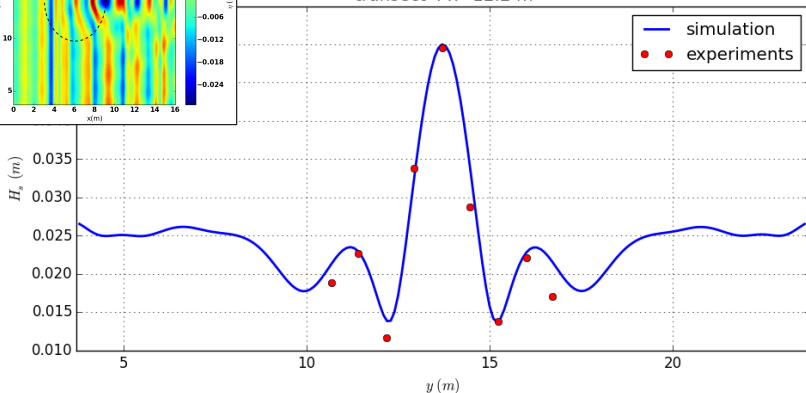
# Irregular wave propagation over an elliptical shoal [4/4]

Jonswap spectrum (Case U3)

$H_s = 0.0254$  m,  $T_p = 1.3$  s,  $\gamma = 2$



transect 4 x=12.2 m



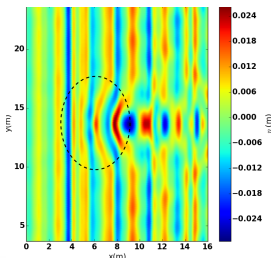
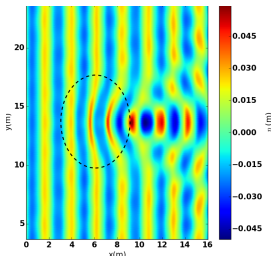
# Summary

## Conclusions:

- Accurate reproduction of nonlinear and dispersive effects
- Robustness of RBF-FD approach to maintain flexibility
- Recommendation: PHS  $r7 + p3$  with 20 – 30 nodes

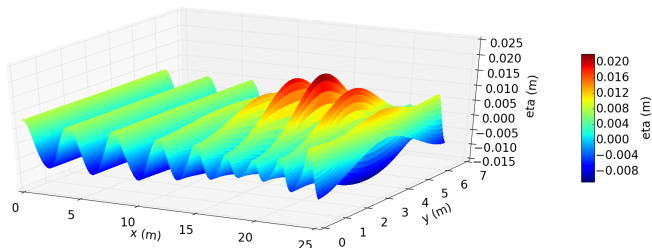
## Challenges and ongoing work:

- Instabilities at boundaries
- Optimal node spacing
- Computational efficiency





# Thank you!

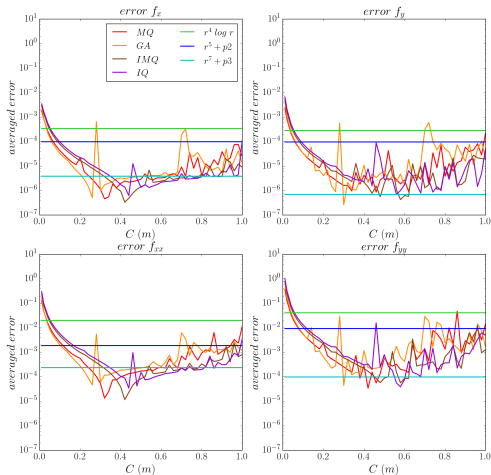


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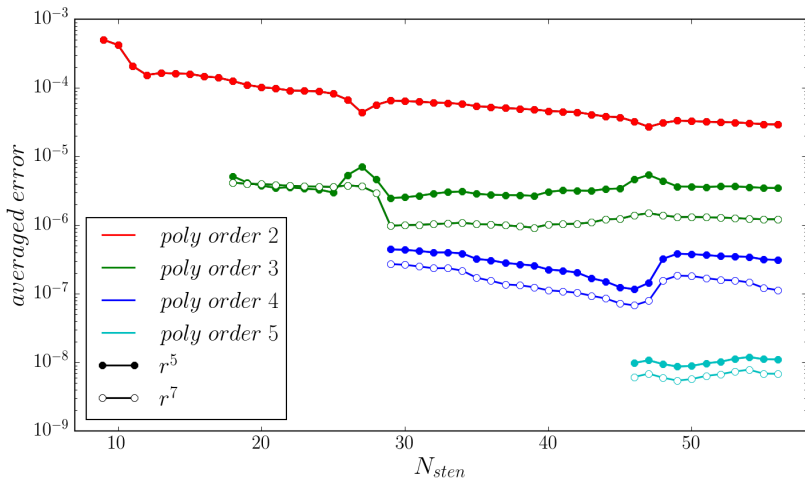
# Comparing Types of RBFs

## Estimating derivatives



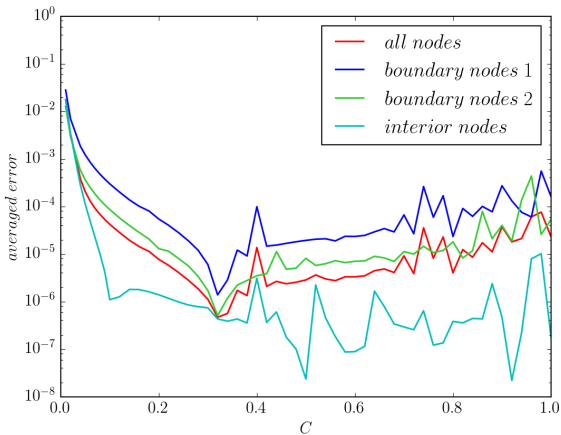
# Reducing errors with added polynomials

## Estimating derivatives



# Boundary node errors

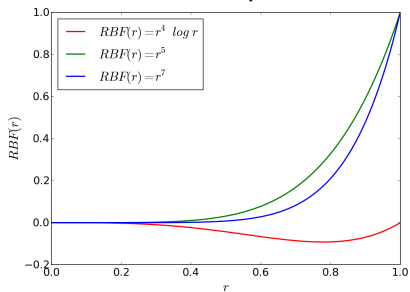
## Estimating derivatives



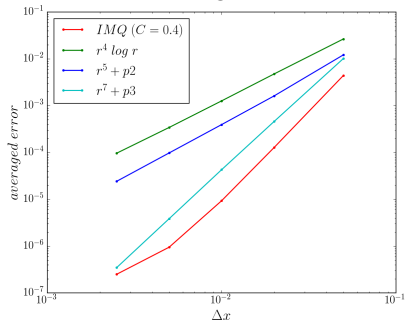
# PHS functions

## Estimating derivatives

### RBF shape



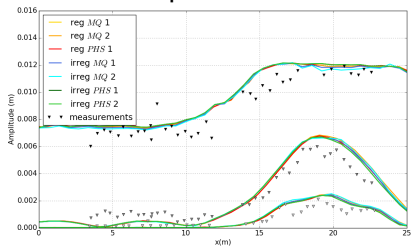
### Convergence



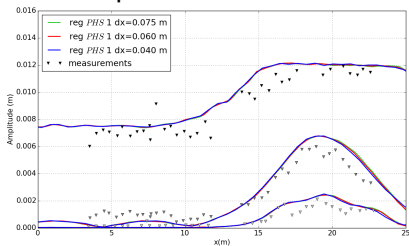
# Comparing spatial discretizations

Whalin (1971) experiments

## RBF parameters



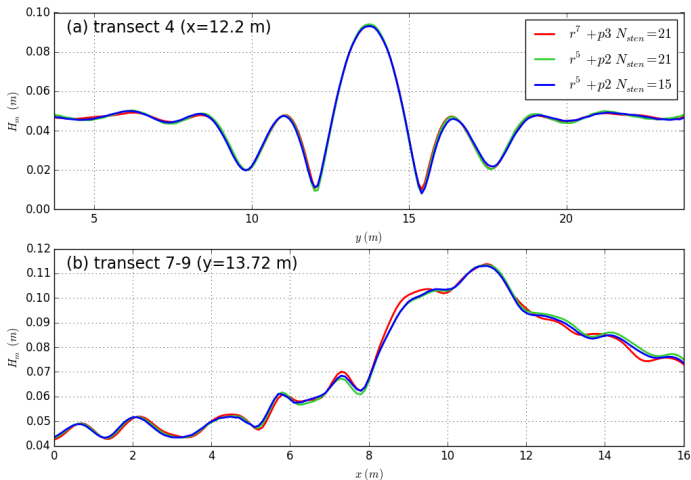
## Spatial resolution





# RBF PHS functions

Vincent & Briggs (1989) experiments



## CPU time

### ■ 1DH cases (processor 3.4 GHz)

- Solitary wave ( $\delta = 0.5$ ):  $NPX = 7000$ ,  $N_T = 7$ , cputime/time step  $\approx 2$ s
- Irregular waves propagating over a barred beach (Becq et al. 1999):  $NPX = 601$ ,  $N_T = 7$ , cputime/time step  $\approx 0.098$ s

### ■ 2DH cases (processor 2.7 GHz (cluster))

- Regular waves over a convergent step (Whalin, 1971):  $NPXY = 60716$ ,  $N_T = 7$ ,  $N_{sten} = 13$ , cputime/time step = 333 s

Improve computational efficiency with parallelization and pre-conditioned iterative solvers.