



### SUMMER SCHOOL ON DATA SCIENCE **FGV EMAp**

## Advances in Numerical Modeling and Data Analysis on Water Resources related Issues

### **Rodrigo Amado Garcia Silva**

Contact: rodrigoamado@oceanica.ufrj.br





**Coastal and Oceanographic Engineering Area (Ocean Engineering Program)** 

- Research Engineer (postdoc)
- Issues: Environmental hydrodynamics, wave generation and propagation, sediment transport, coastal vulnerability, water quality



HidroAmb – Water Resources and Environmental Engineering

- Director and Environmental Engineer
- Issues: the same



Water resources related issues

- Environmental Hydrodynamics
- Wave generation and propagation
- Sediment transport



Hydrodynamics

#### Wave propagation







#### Morphodynamics





#### Water resources related issues

- Environmental Hydrodynamics
- Wave propagation
- Sediment transport
- Pollutant transport and dispersion

### ALL NONLINEAR PHENOMENA!!







#### Water resources related issues

- Environmental Hydrodynamics
- Wave propagation
- Sediment transport
- Pollutant transport and dispersion

#### **ALL NONLINEAR PHENOMENA!!**

Simulation requires numerical solution of nonlinear differential equations





### SisBaHiA – Environmental Hydrodynamics Base System

### Computational modeling system provided by COPPE/UFRJ

>Environmental modeling of water bodies with complex geometry, as rivers, estuaries, lagoons, bays, coasts, reservoirs, etc.

> Open code (Fortran) free software

➢ Finite elements and finite difference numerical models







# How does it work? **Example: Ilhabela – SP**





Batimetria (m) RN: Nível de Redução Carta Náutica 1643



**Google** Earth



SP



How does it work?

Santos

- Example: Ilhabela SP
- Digital terrain model

60

Bertioga

Batimetria (m) RN: Nivel de Redução Carta Náutica 1643



SR



Ilhabela





Sistema Base de Hidrodinâmica Ambiental

COPPE - Engenharia Costeira & Oceanográfica

### How does it work?

- Example: Ilhabela SP
- Digital terrain model







- How does it work?
- **Example: Ilhabela SP**
- Simulated phenomena: wind waves generation
- **Input data:**
- **Bathymetry (DTM)**
- $\succ$
- **Boundary conditions**  $\succ$









# How does it work? Example: Ilhabela – SP

Altura Significativa (m)

1.3

1.5

1.8

2.0

Caraquatatub

1.0

Results

0.5

0.8

0.0

7385000

7360000

7335000

7310000

0.3





Wave height (m)













SisBaHiA<sub>10</sub>

How does it work?

### Example: Ilhabela – SP







### Data analysis

#### Sea bottom surface







### Data analysis

• Wind data acquisition

**C**ECMWF

European Centre for Medium-Range Weather Forecasts

#### **Global athmospheric models**

- Wind data
- NETCDF format
- Python interface



Wind data analysis

Grapher (2D and 3D graphing and analysis)







Model setup and execution



Grapher

(temporal results)

**Results analysis** 

Surfer

(spatial results)



SisBaHiA









**Research and Development** 

- > Nearshore morphological processes
- Wave induced sediment transport

#### **Port sedimentation**



#### **Coastal erosion**

































**Beach Profile** 









**Beach Profile** 







Good results









- Good results
- Highly dependent on case to case calibration









- Good results
- Highly dependent on case to case calibration
- Several parameters involved









- Good results
- Highly dependent on case to case calibration
- Several parameters involved
- Nonlinearity expressed in the data









- Good results
- Highly dependent on case to case calibration
- Several parameters involved
- Nonlinearity expressed in the data
- Upcoming research: how to find a pattern?









- Good results
- Highly dependent on case to case calibration
- Several parameters involved
- Nonlinearity expressed in the data
- Upcoming research: how to find a pattern?
  - Machine learning





### **Beach Profile**



### **Machine learning**

### Several methods:

- Artificial neural networks;
- Genetic algorithms;
- Bayesian networks;
- Regression trees;

➢ etc



#### Goldstein et. al (2019)



# Thanks a lot!

Rodrigo Amado G. Silva

rodrigoamado@oceanica.ufrj.br