

# Learning from Lionfish: Modeling Marine Invaded Systems



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NOVA SOUTHEASTERN  
UNIVERSITY

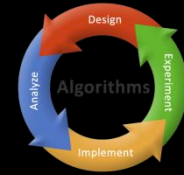
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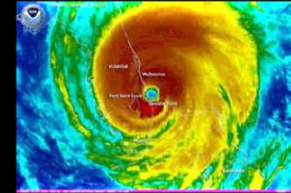
# Introduction to Invasives



# Model Background/Mechanics



# Hurricanes and Lionfish



# Lionfish Control



# Southern GOM damselfish



# What is an invasive species?

“Animals, plants or other organisms introduced by man into places out of their natural range of distribution, where they become established and disperse, generating a negative impact on the local ecosystem and species.” - International Union for the Conservation of Nature



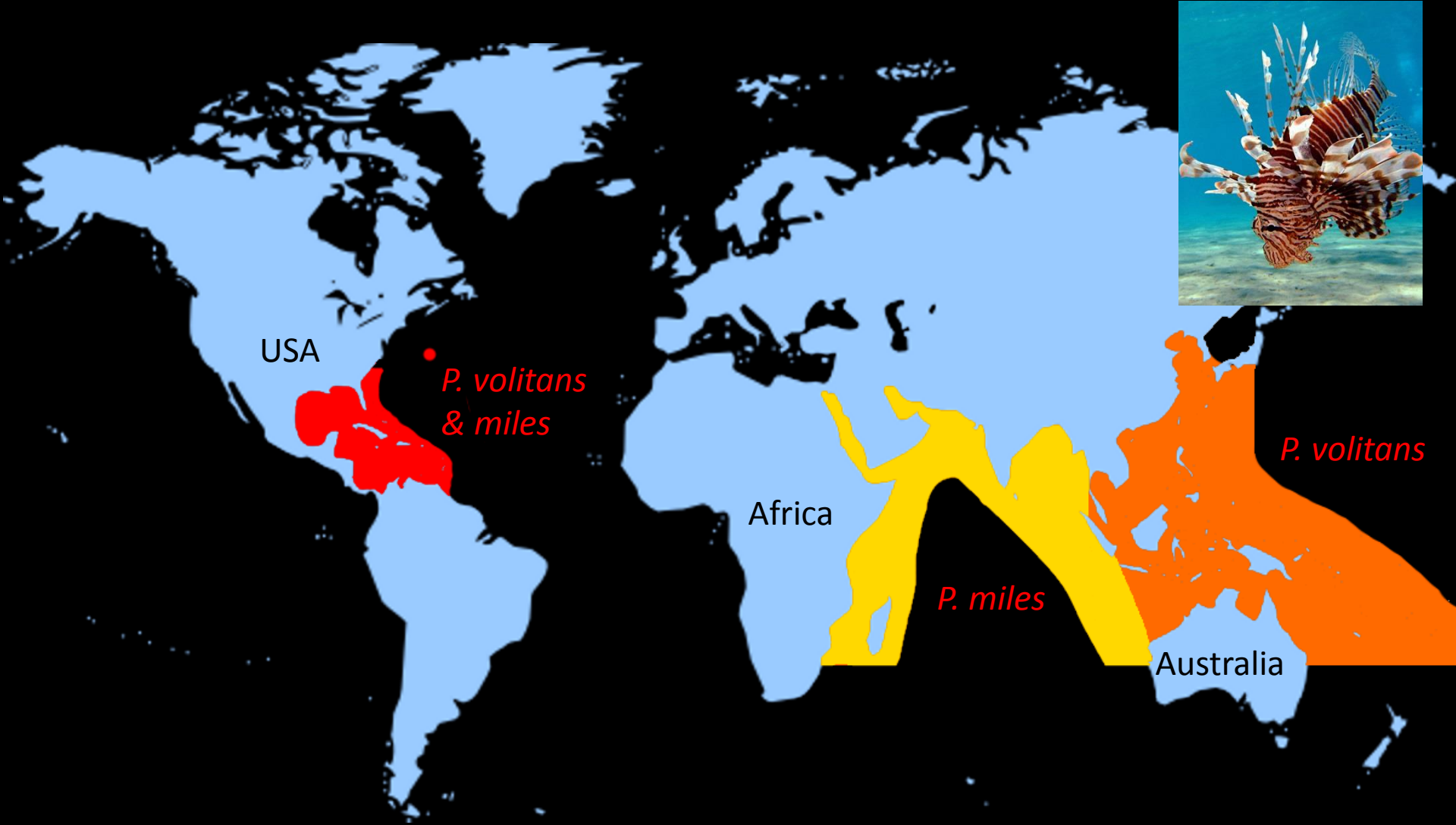
# Invasive Species



- 30,000 eggs/four days, buoyant ~30 days
- 10-12 month maturity
- Depth to 300 m
- 10° C



# Native and Invasive Range of Lionfish



# Motivation and Aim of Research

## Motivation and Aim of research:

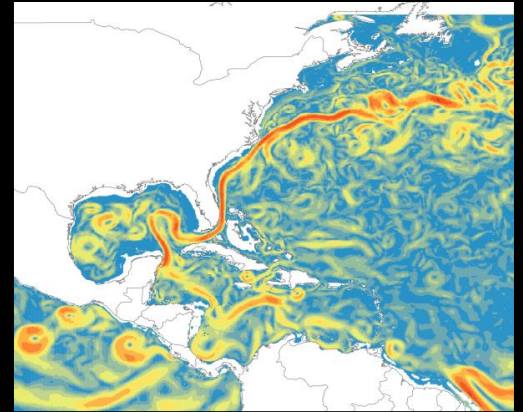
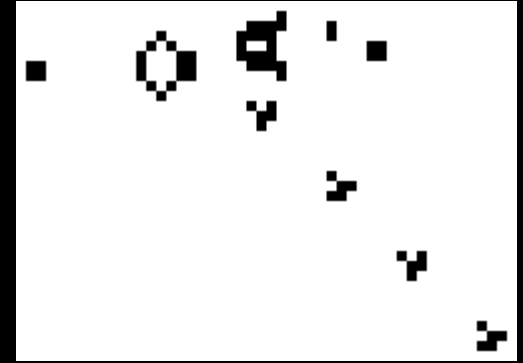
- *Understand* the invasion process
- Use mathematical computer simulation to help *understand and solve* complex questions in invasion ecology



# The Models

- **Cellular automaton** biophysical model
  - Simple rules = complex behavior
- **Lagrangian model**
  - Particle movement in water
- **Physical oceanographic conditions**
  - ocean current, SST, depth
- **Life history traits**
  - *Temporal*: breeding age, life stage mortality, larval duration, egg quantity, breeding frequency

**Validated against USGS-NAS**



# Model Source Data

**Ocean Currents (hybrid):** HYCOM – monthly and daily averages  $1/12^\circ$  (10km) and  $1/25^\circ$  (4km) , monthly  $1/3^\circ$  OSCAR (40 km), daily  $1/25^\circ$  ROM (4 km)

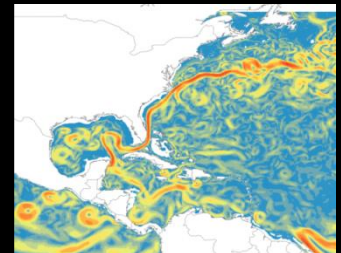
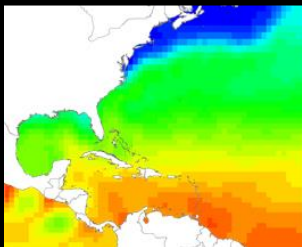
**Depth (satellite):** ETOPO 1 Global Relief Model (2 km)

**SST (satellite):** MODIS - monthly (4 km)

**Chlorophyll (satellite):** MODIS - monthly (4 km)

**Life History Characteristics:** Literature

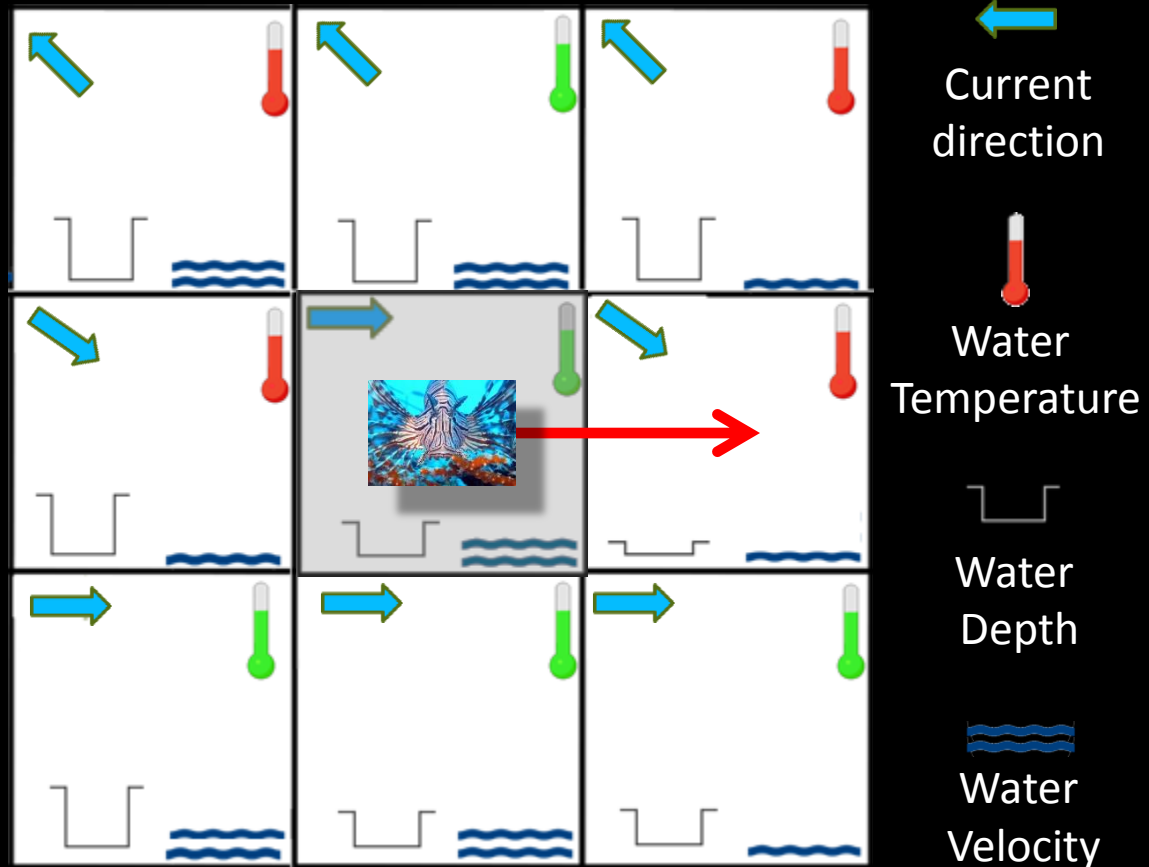
**All datasets in public domain**



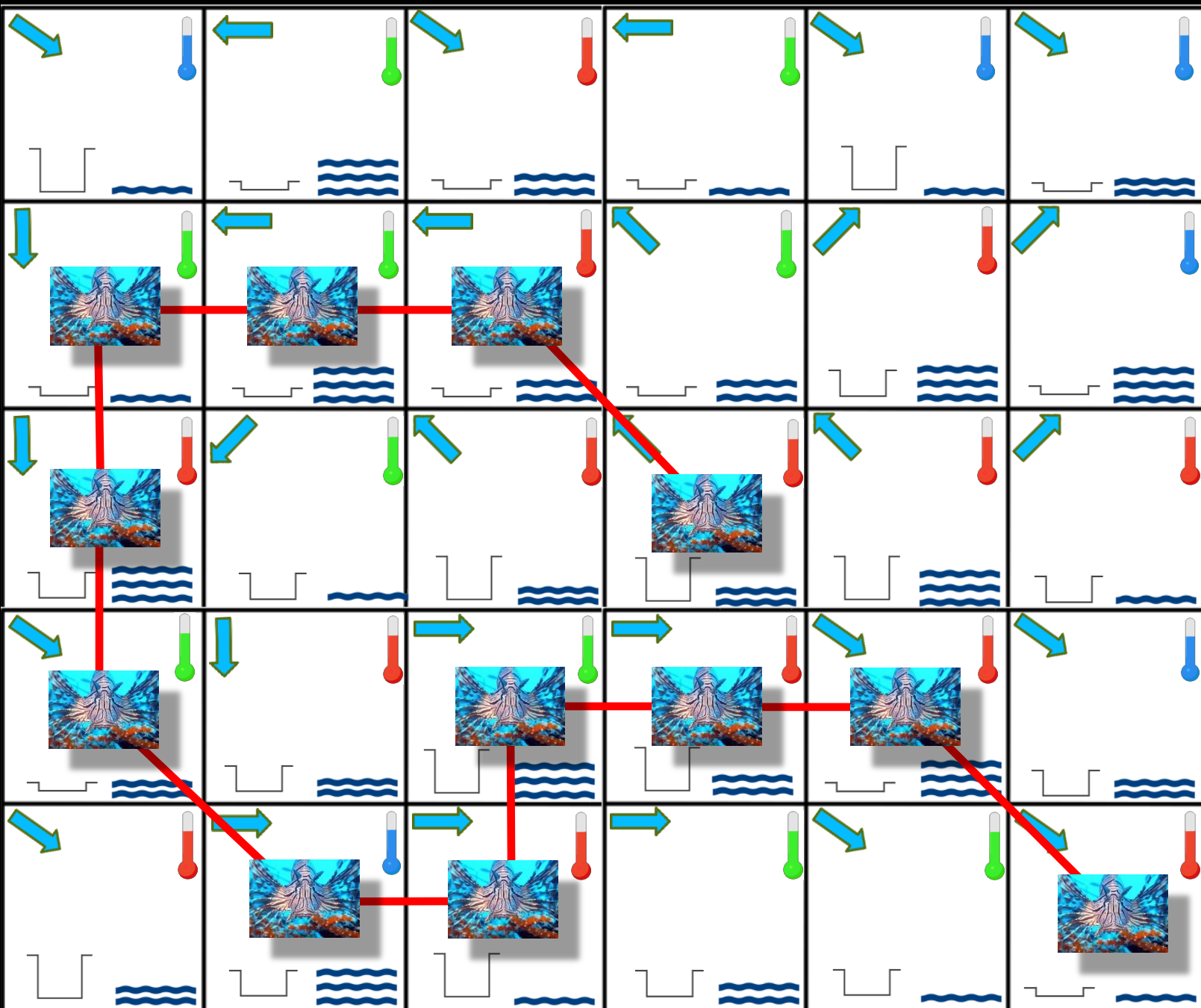


# Cellular Automaton Agent-Based Model

- Study area grid
- 4 main logic components:
  - *conceptual cells*
    - unique parameters
  - *neighborhood cells*
  - *cell state*
  - *rules*
    - downstream
    - Settling dictated by temp/depth



Rules are tested for each step per cycle (30 days) for each larva



←  
Current  
direction

🌡️  
Water  
Temperature

📊  
Water  
Depth

➡️  
Water  
Velocity

# Algorithmic Flow of the Model

## Process Steps:

**Step 1 : Select founder population (females)**

**Step 2: Apply mortality**

- Adult
- Egg/larval/juvenile mortality applied to qty larvae produced/female
- If *alive* moves to step 3

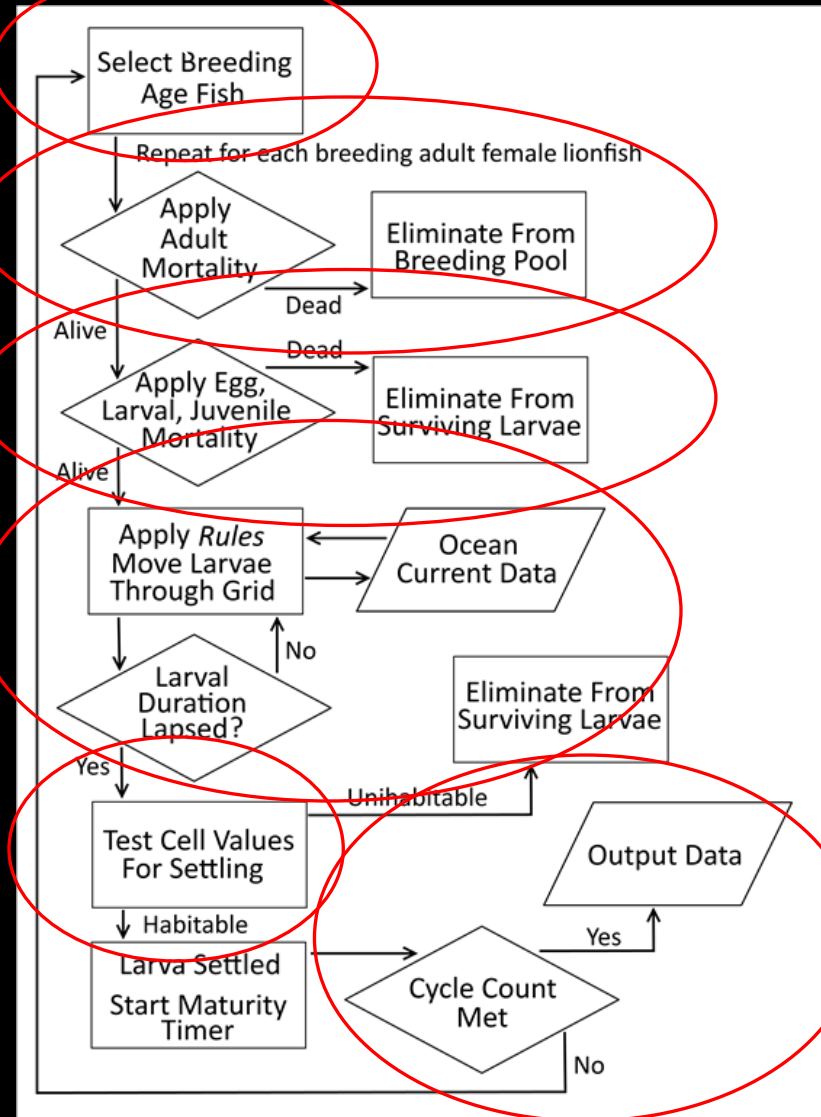
**Step 3: Movement of larvae governed by the rules**

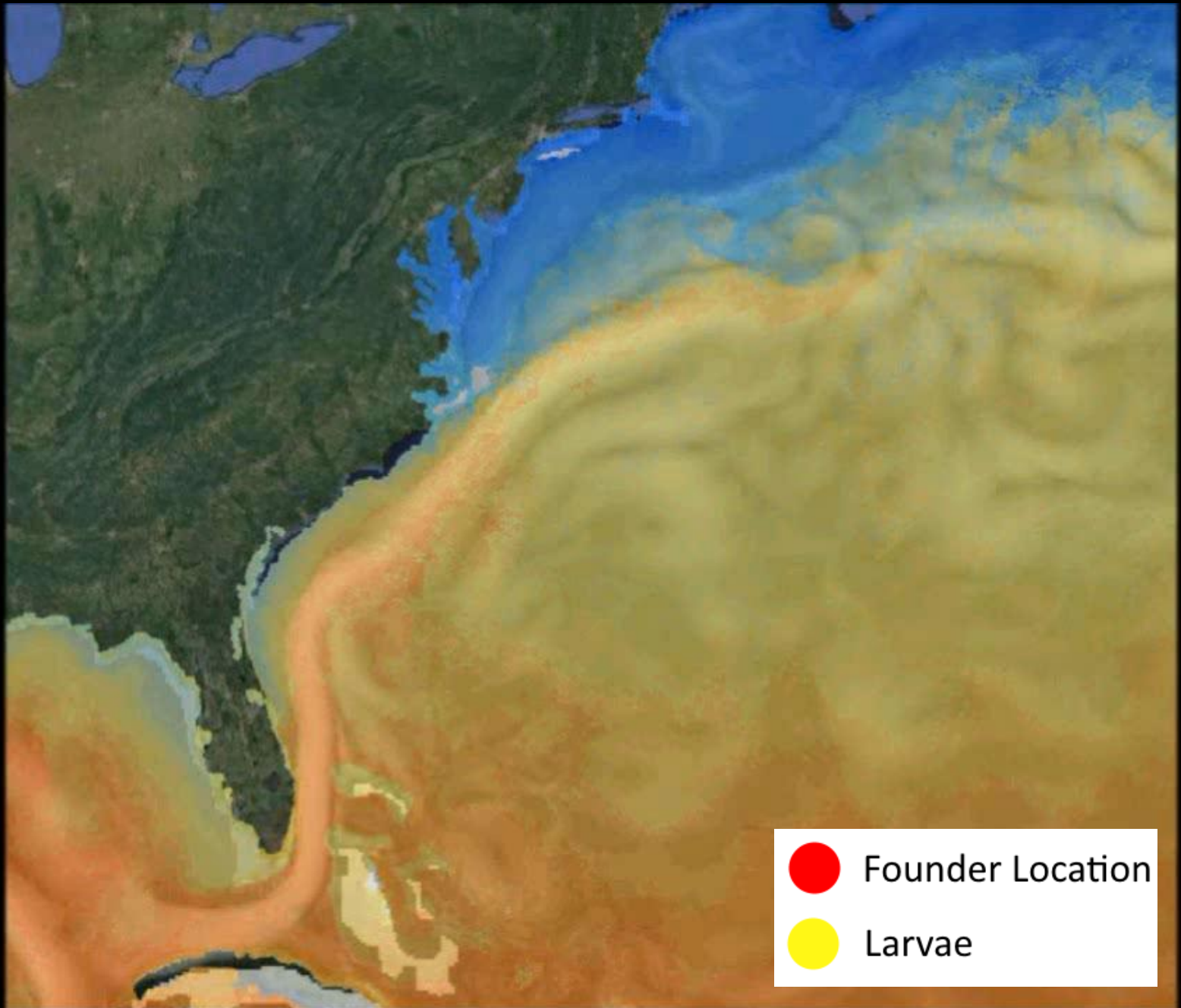
- Process repeats for larval duration period
- Last cell potential settling location

**Step 4: Settlement**

- Parameters tested for settlement

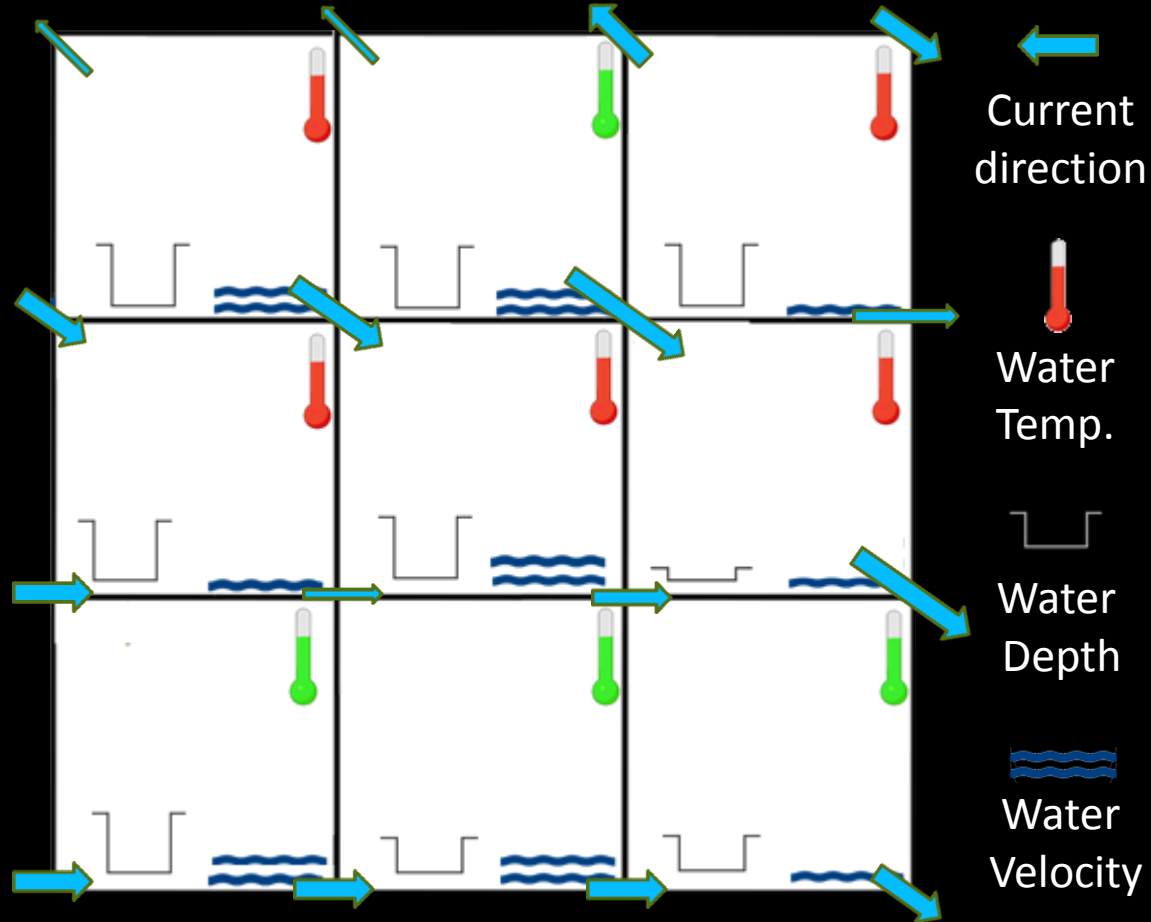
**Step 5: Repeat for duration**





# Lagrangian Agent-Based Model

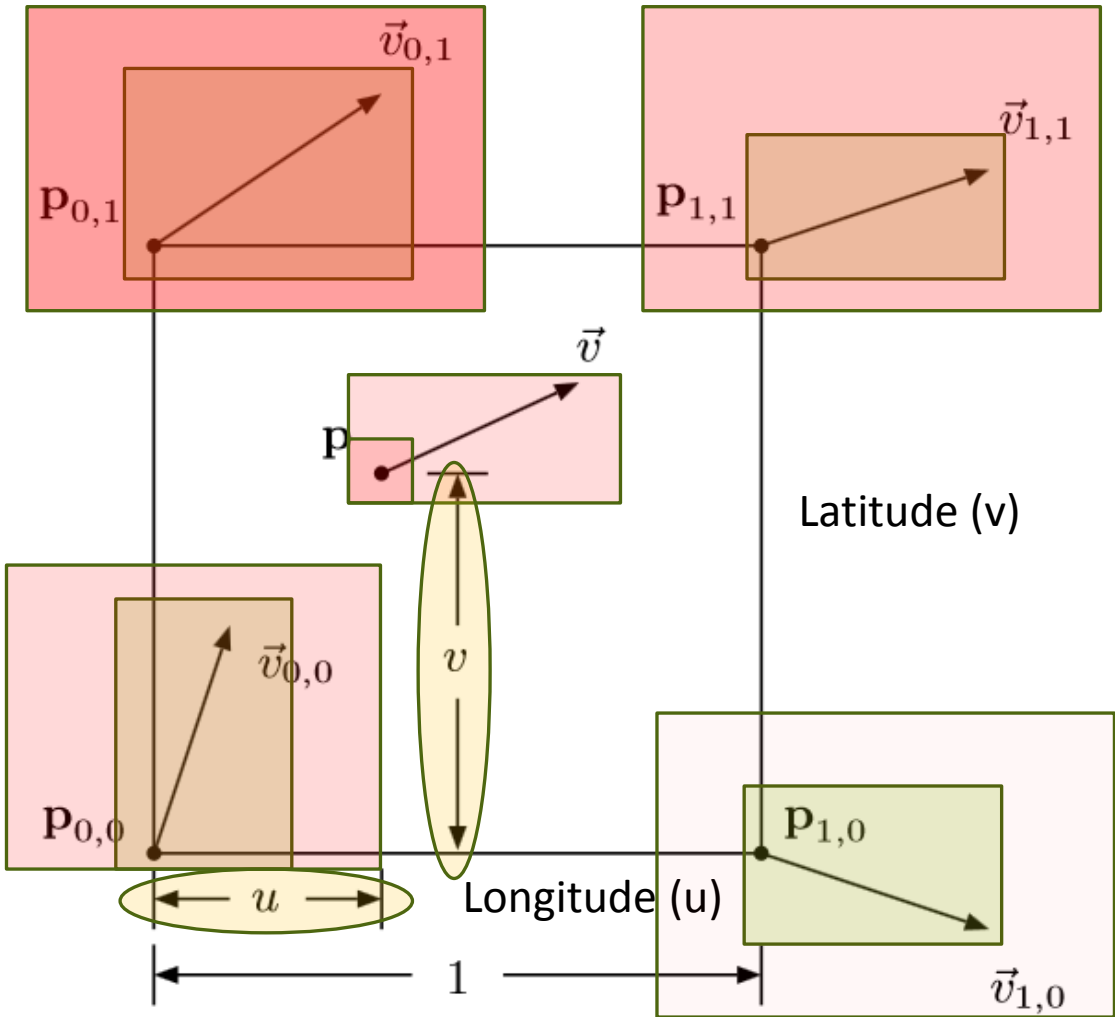
- Grid containing flow vectors derived from  $u$  (east-west) and  $v$  (north-south) components
- *conceptual cells*
  - Unique parameters
- *rules*
  - Settling dictated by ocean conditions
- *movement*
  - Euler method
  - Hourly time-steps



# Lagrangian Agent-Based Model – 2D

## Vector Interpolation

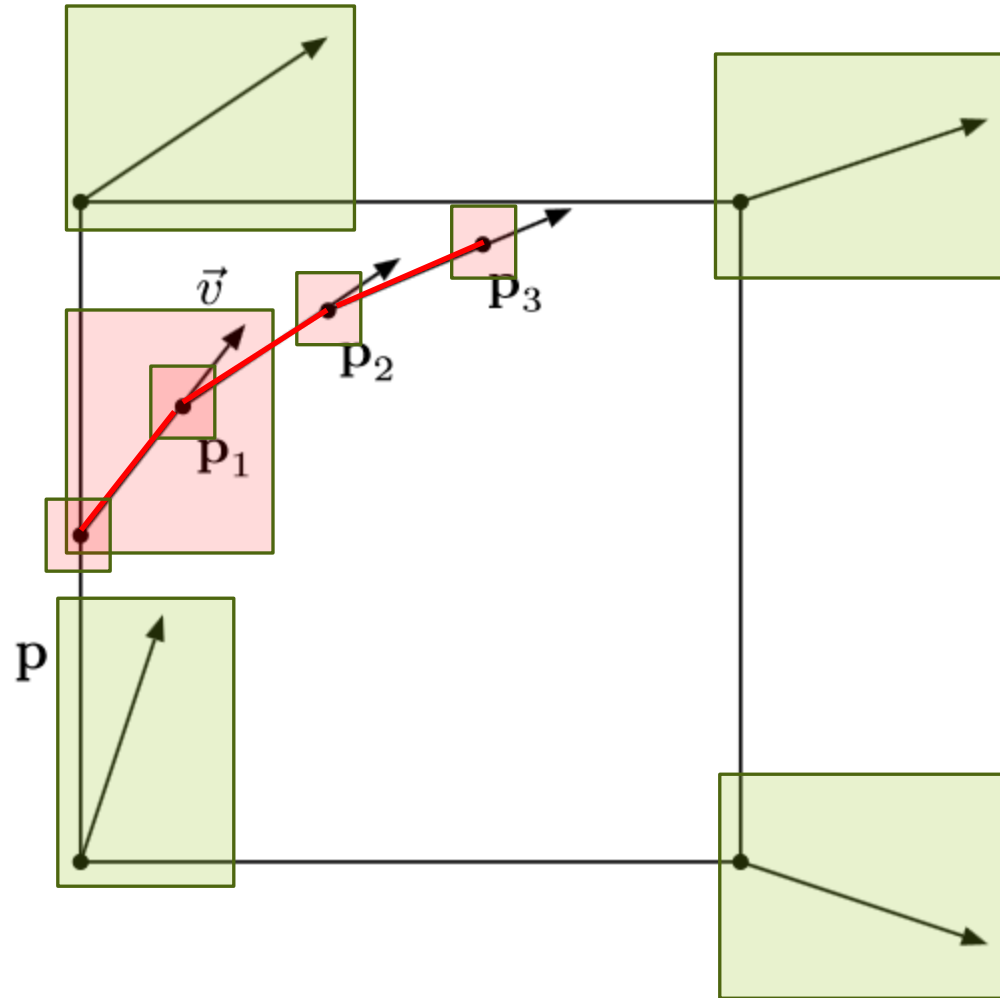
- Position of larva (P) – u and v (or x/y)
- Nearest 4 vectors
- Weighted vector averaging to predict trajectory of particle, i.e.  $\vec{v}$
- Bilinear interpolation using the Euler method



$$\vec{v}_i = (1-v)(1-u)\vec{v}_{0,0} + (1-v)u\vec{v}_{1,0} + v(1-u)\vec{v}_{0,1} + vu\vec{v}_{1,1}$$

# Calculating Trajectory

- From starting position (P)  $u/v$ :
  - 4 nearest vectors
  - Vector path interpolated
  - Particle moved along vector at calculated velocity for one hour i.e., one timestep  $\Delta t$
  - Process repeats over PLD



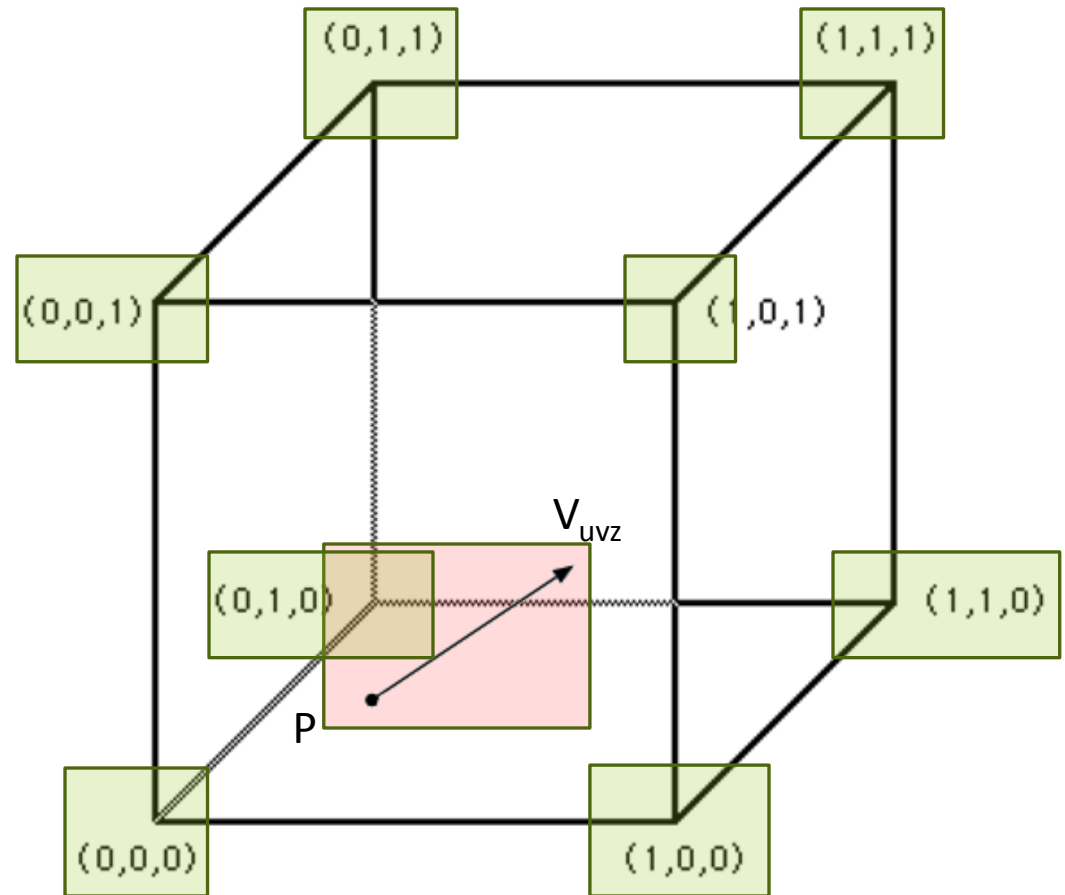
$$\vec{v}_i = (1-v)(1-u)\vec{v}_{0,0} + (1-v)u\vec{v}_{1,0} + v(1-u)\vec{v}_{0,1} + vu\vec{v}_{1,1}$$

$$P_1 = P_0 + \Delta t \vec{v}$$

$$P_{i+1} = P_i + \Delta t \vec{v}_i$$

# Lagrangian Agent-Based Model – 3D

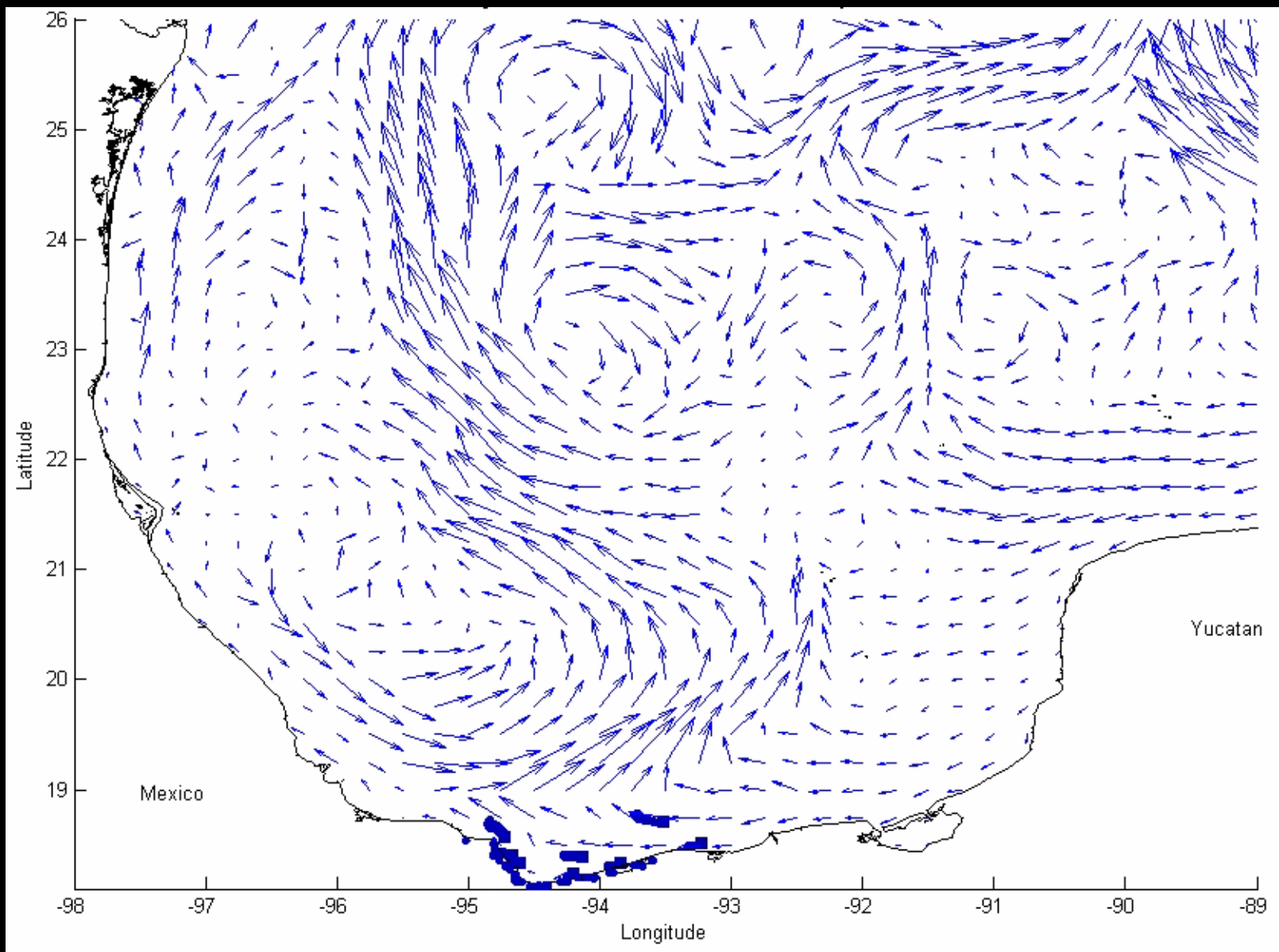
- Position of larva ( $P$ )  
 $u/v/z$
- Nearest 8 vectors -  
i.e., trilinear  
interpolation
- Particle moved  
along vector at  
calculated velocity  
for one hour i.e.,  
one timestep  $\Delta t$



$$\mathbf{V}_{uvz} = V_{000} (1 - u) (1 - v) (1 - z) + V_{100} u (1 - v) (1 - z) + V_{010} (1 - u) v (1 - z) + V_{001} (1 - u) (1 - v) z + V_{101} u (1 - v) z + V_{011} (1 - u) v z + V_{110} u v (1 - z) + V_{111} u v z$$

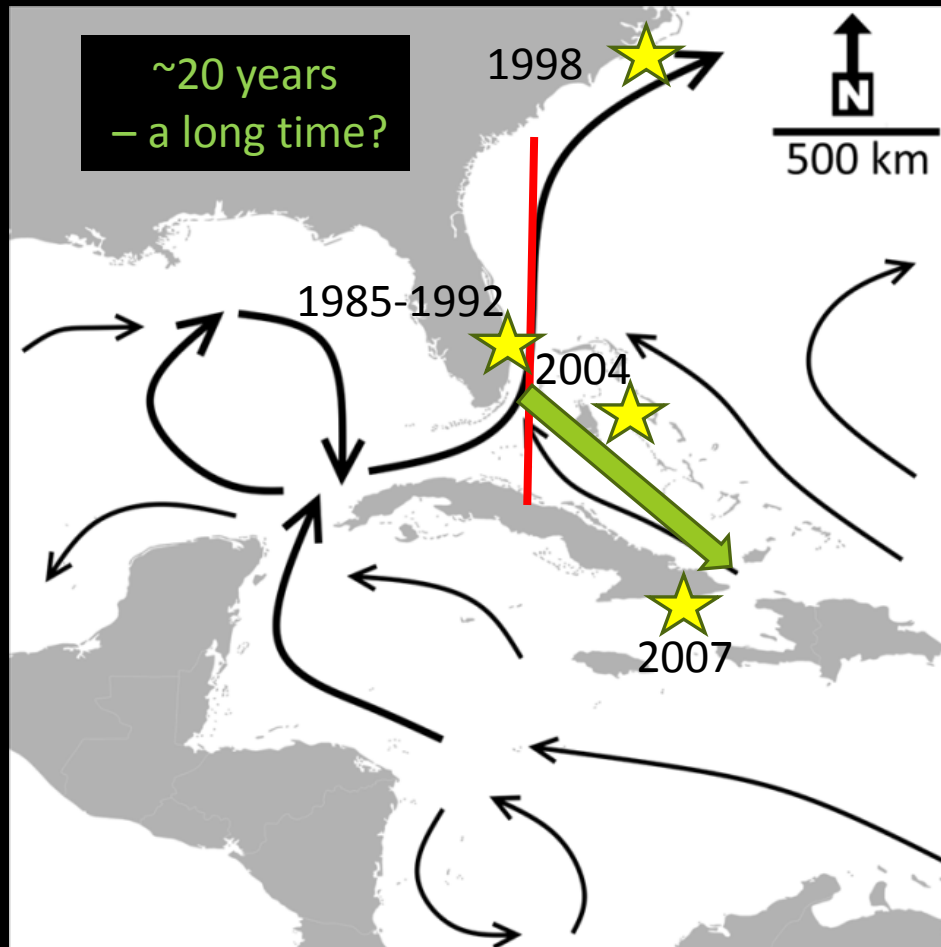
$$P_{i+1} = P_i + \Delta t \vec{v}_i$$





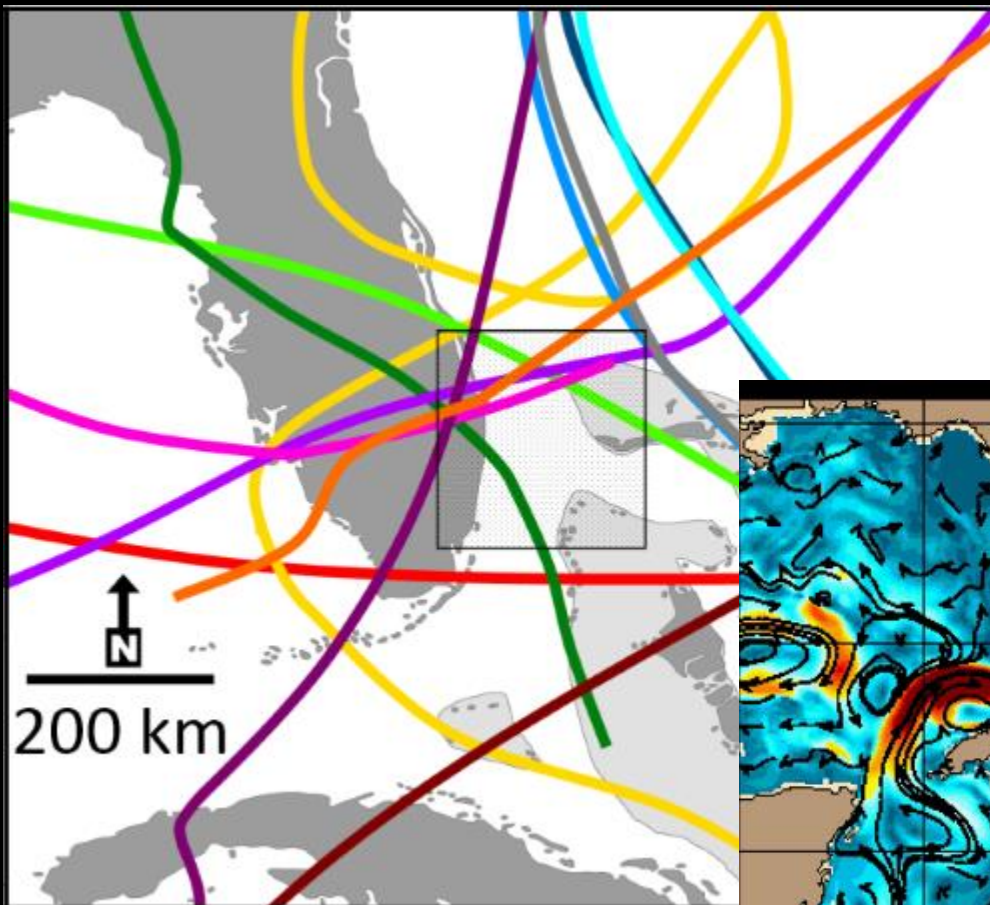
14.5 million larval movements spanning 5 years

# Hurricanes accelerated the Florida-Bahamas Lionfish invasion

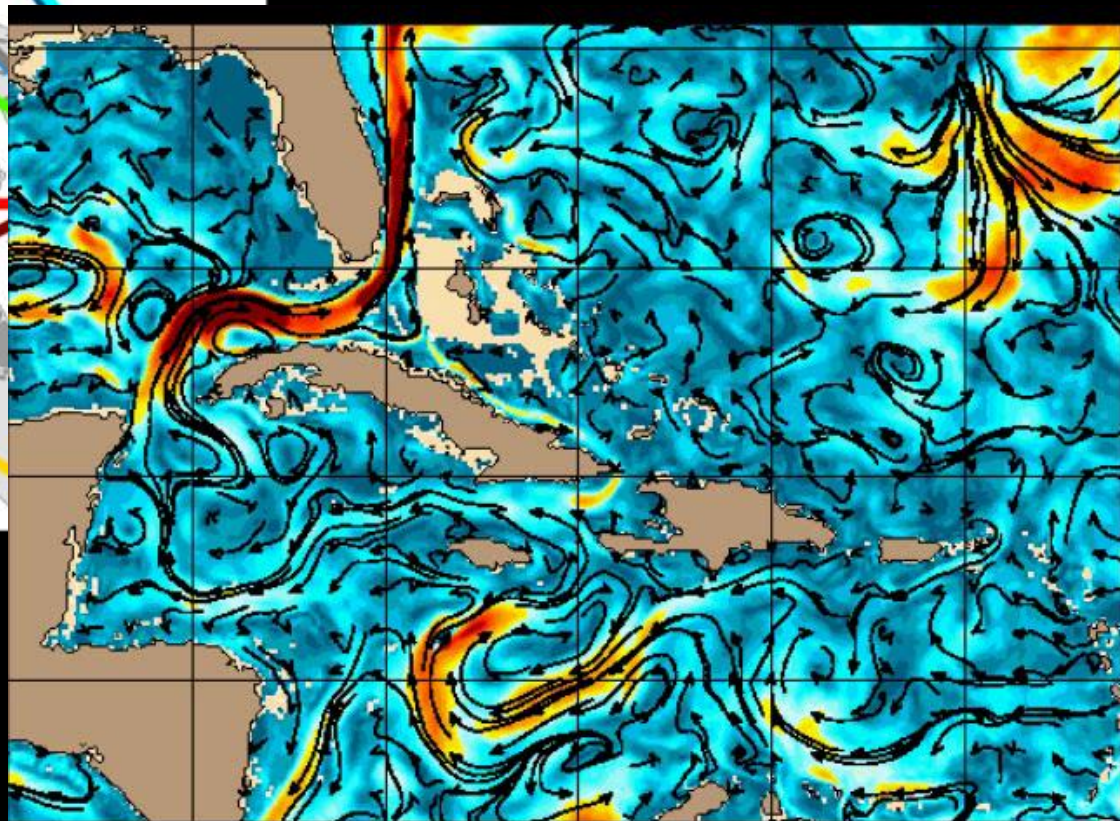


- **Curious:** Bahamas mean currents run north and west – lionfish moved south east
- Current anomalies?
- Role of hurricanes?

# Hurricanes accelerated the Florida-Bahamas Lionfish invasion



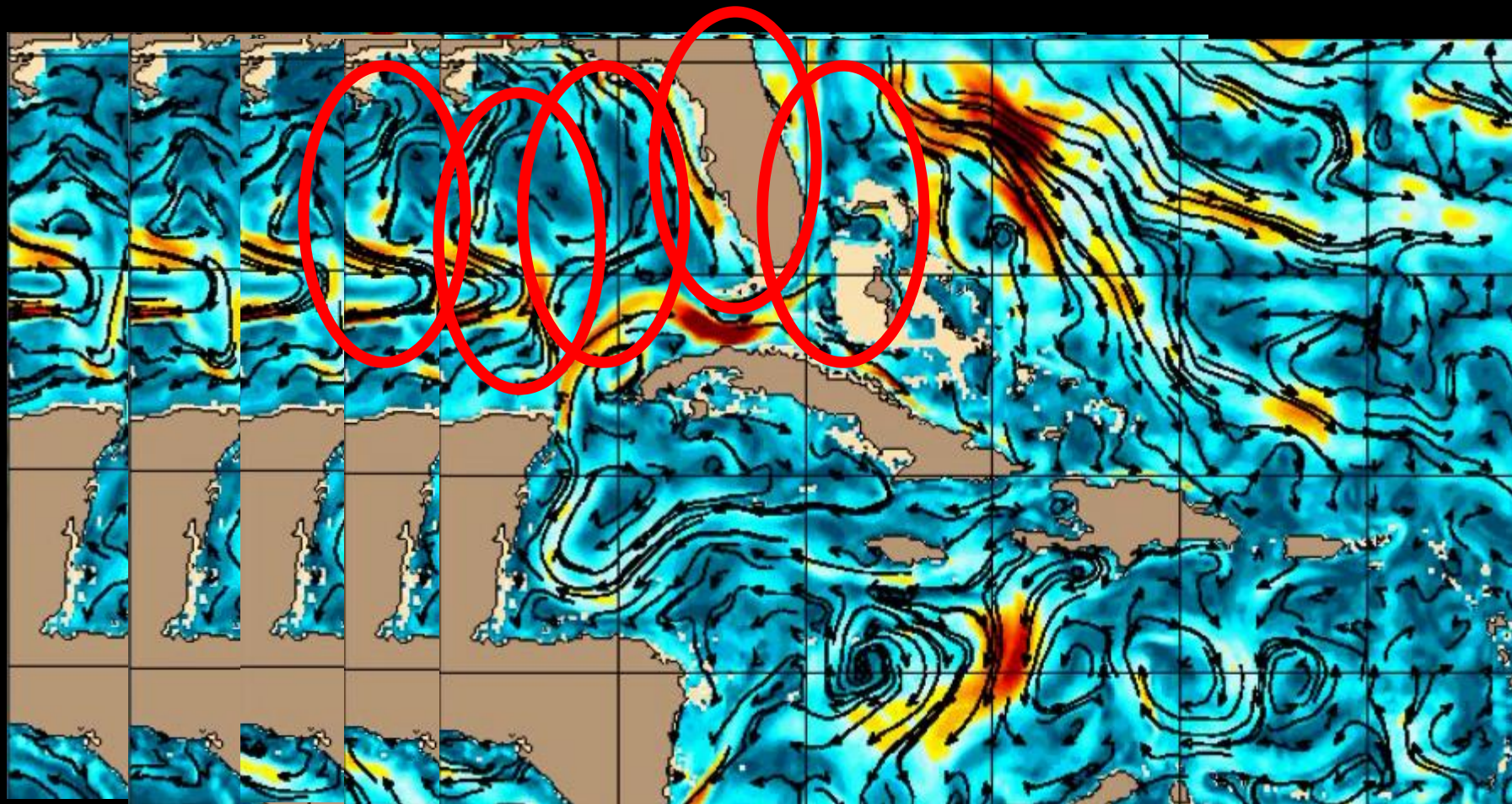
1992 – 2003 (13 storms)



Sandy 2012

# Hurricanes accelerated the Florida-Bahamas Lionfish invasion

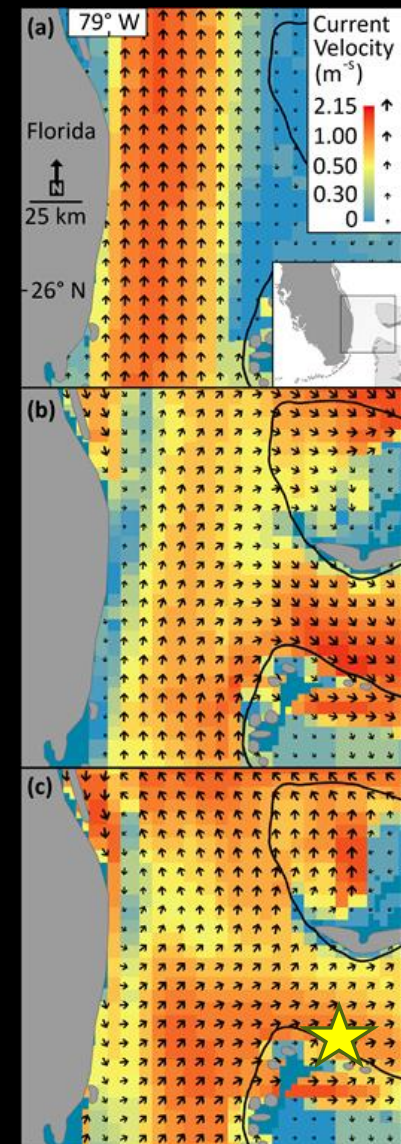
## Hurricane Sandy - 2012



24 hour frames

# Hurricanes accelerated the Florida-Bahamas Lionfish invasion

- Step 1 - Identify crossover events due to hurricanes
  - Analyze direction/velocity of daily HYCOM data in Florida Straits
- Step 2 – Analyze effect of hurricanes on population size
  - Small founder pop. In NW Bahamas
  - 2000 – 2007
  - Simulations using: monthly mean currents (average year)
  - Simulations using: daily currents for 2004-2005 hurricane seasons
  - Contrasted hurricane vs. non-hurricane

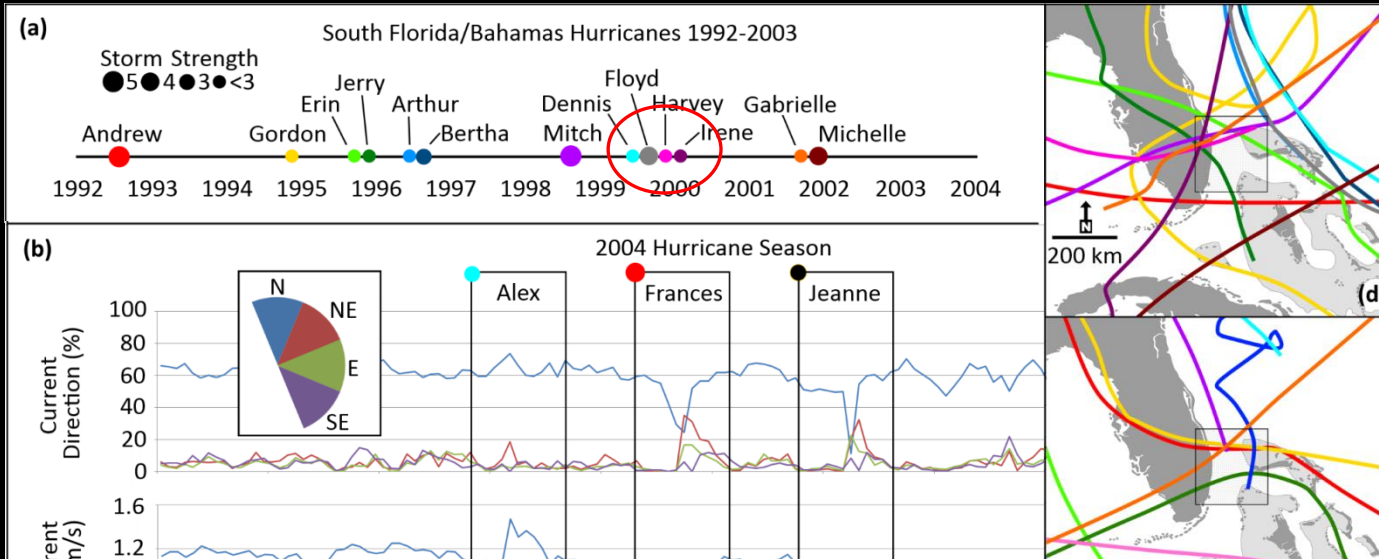


Average  
Year

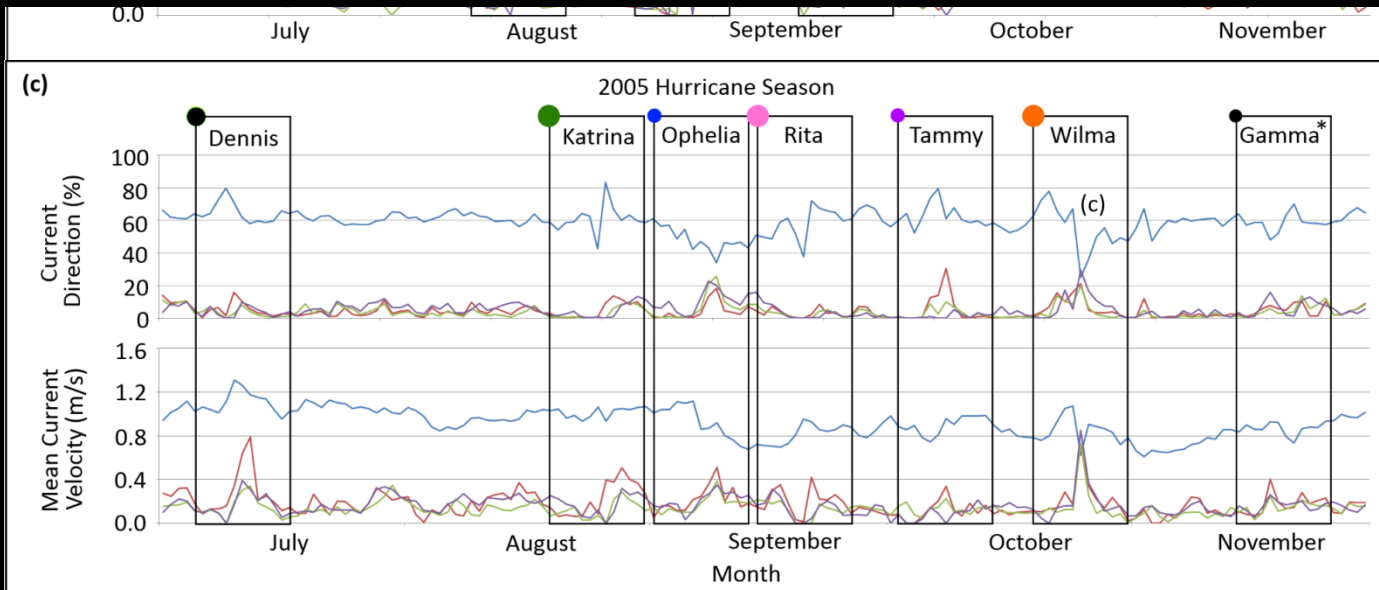
Jeanne  
2004

Wilma  
2005

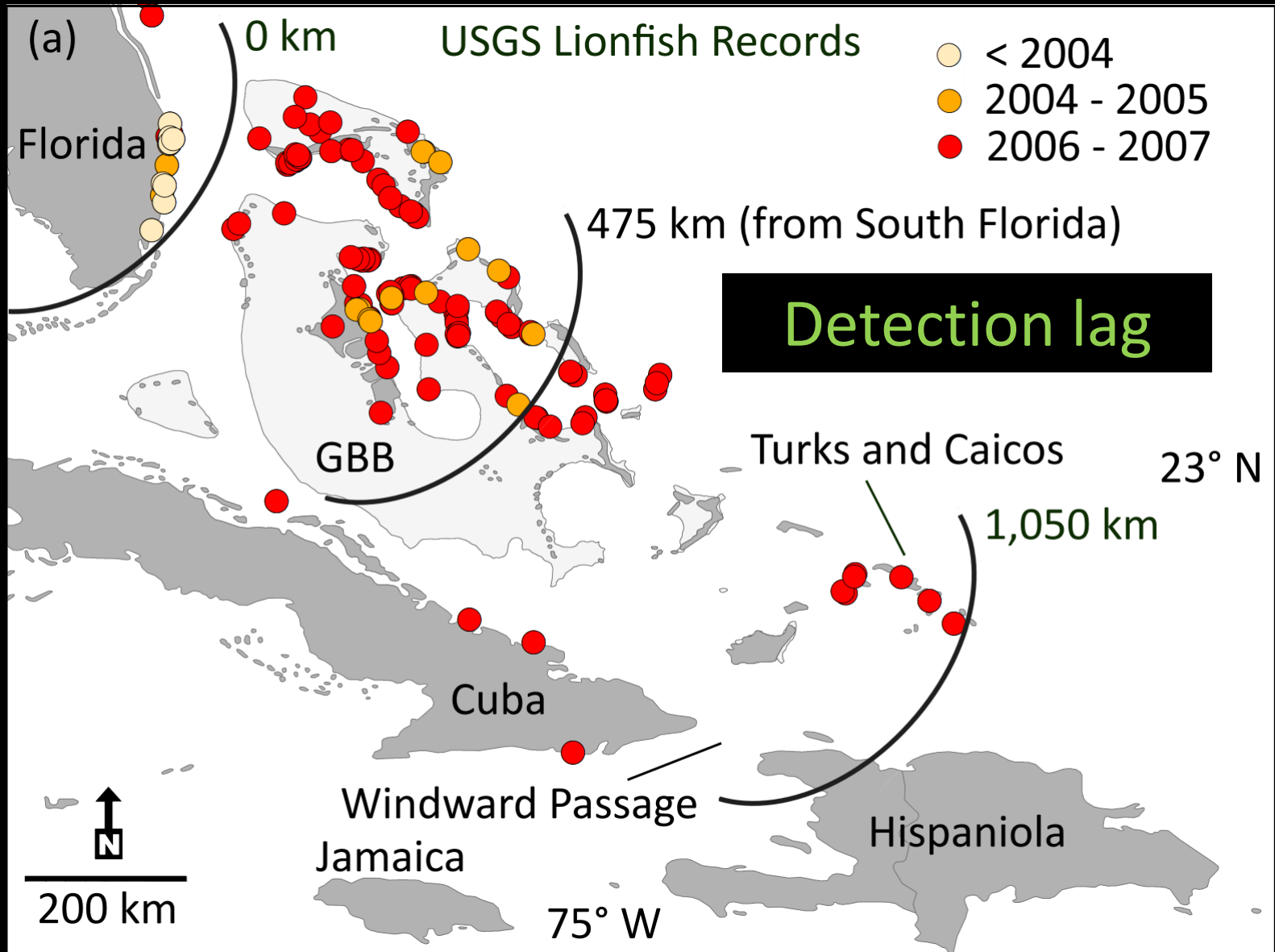
# Step 1 - Identify crossover events due to hurricanes



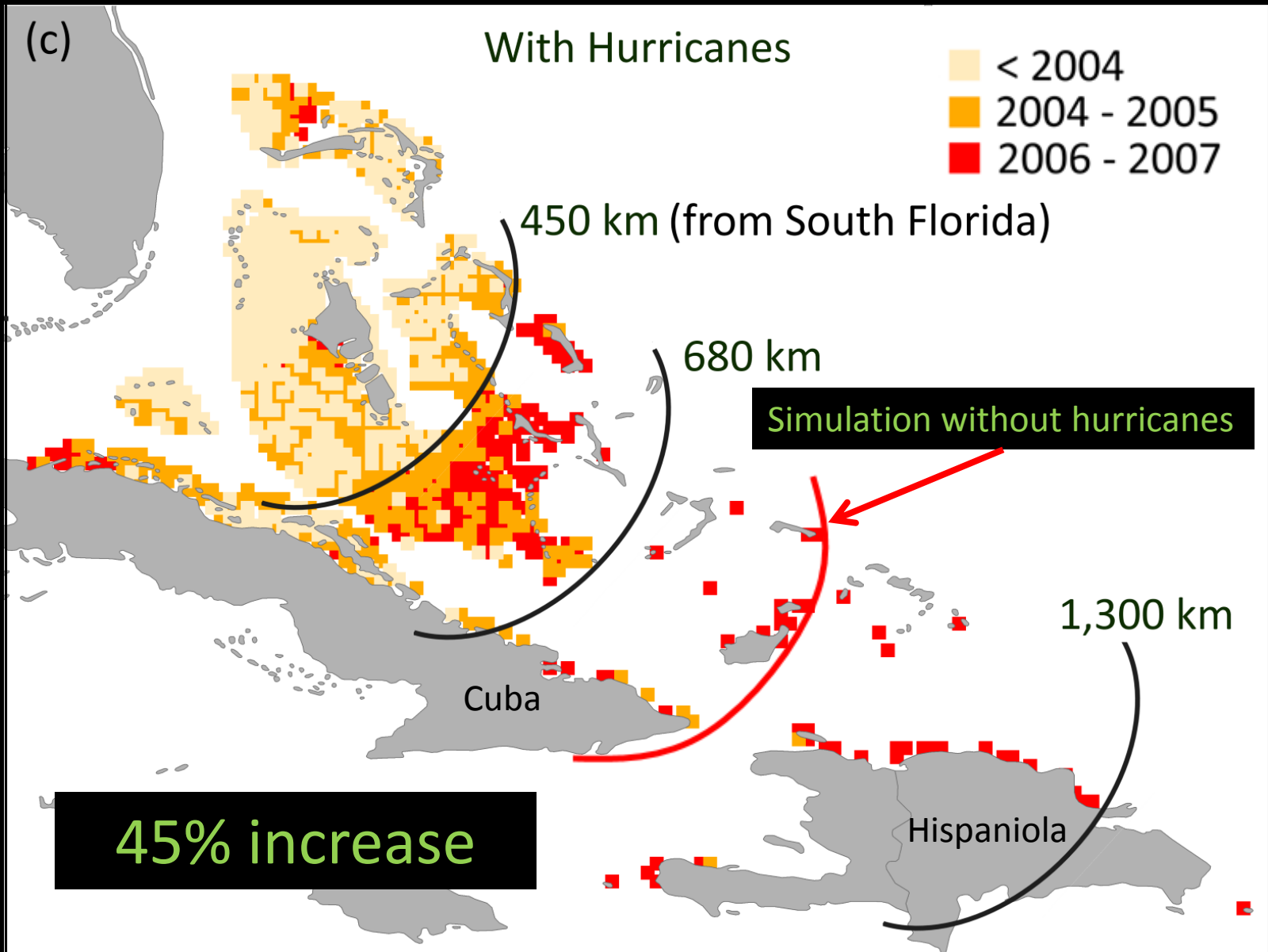
23 opportunities between 1992 - 2005



## Step 2 – Analyze effect of hurricanes on population size

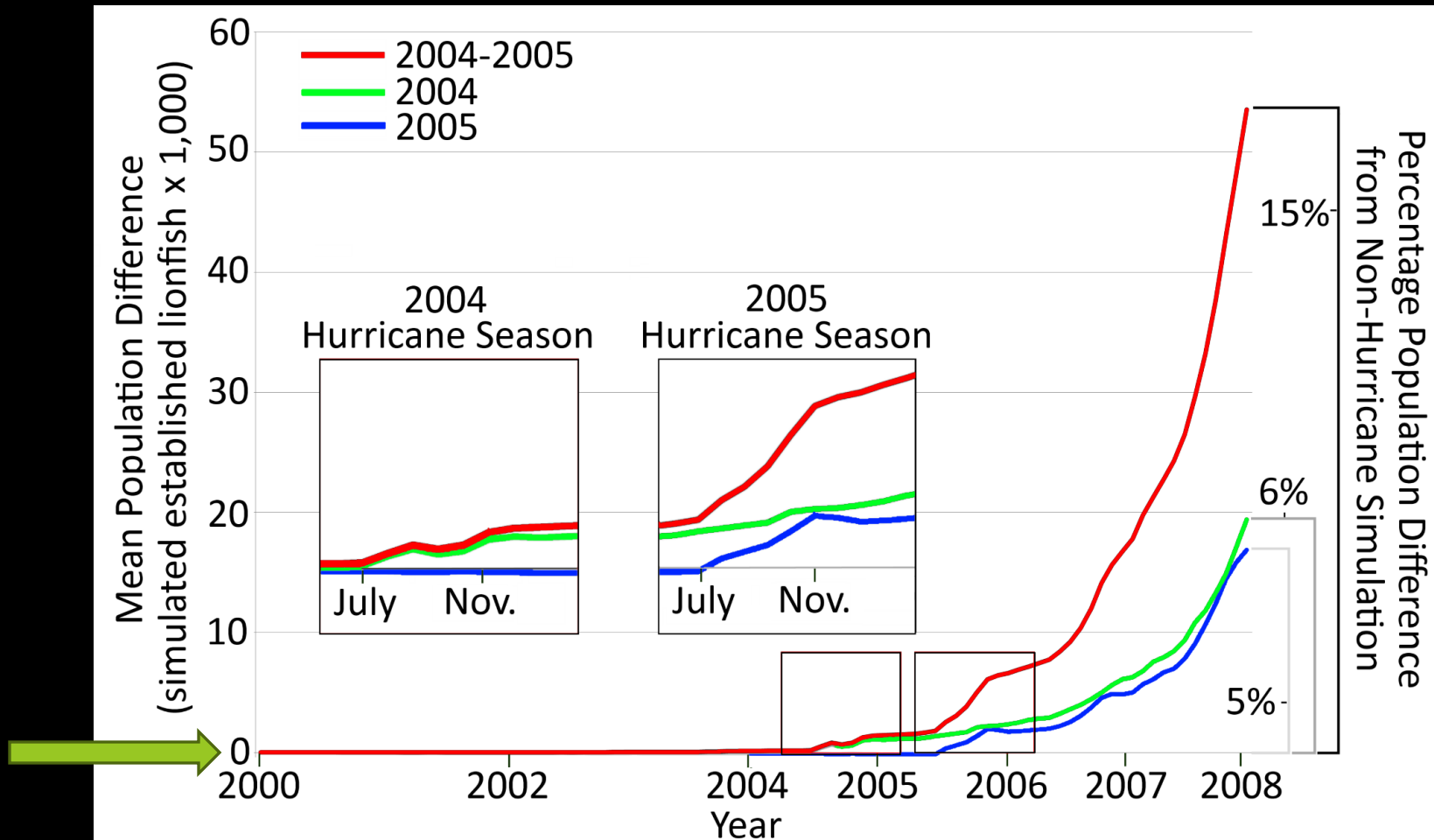


## Step 2 – Analyze effect of hurricanes on population size





## Step 2 – Analyze effect of hurricanes on population size



- Difference in pop. from an average year
- 5-6% population increase/storm year
- 15% increase in consecutive years
- First to link hurricanes with marine invasives
- Implications for all species

# Lionfish Removals Require a Coordinated International Effort



- Lionfish removals – do they work?
  - Sporadic and incomplete
  - Contemporary controls leave remnant populations
  - What rate, where, how often?
- Previous modelling efforts (Arias-González et al. [2011], Barbour et al. [2011], Morris et al. [2011])
  - Local control only - how does connectivity factor?

# Lionfish Removals Require a Coordinated International Effort

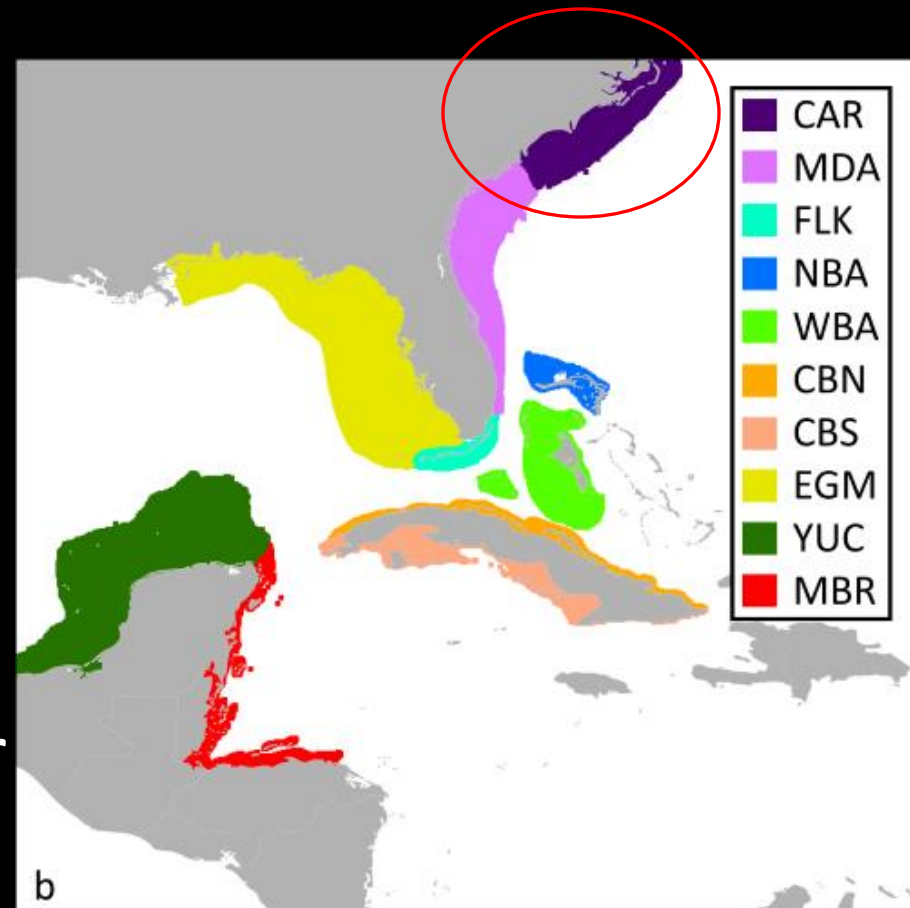
- Two goals - quantify:
  - **Connectivity between regions**
    - Identify importer/exporter relationships
  - **Removal rates required to contain invasion**
    - Target 100% of population or just the majority (95%)
- **Focus:** impact of removals on Carolinas lionfish populations



# Lionfish Removals Require a Coordinated International Effort

## Goal 1 - Quantify connectivity between regions

- Identify all 10 precincts linked to CAR (i.e. Johnston and Purkis 2014b)
- 5 years
- 10 random locations, 100 lionfish each
- Track exporter vs. importer location
- Identify exporter/importer links – major exporters supply 95% to an importer precinct



# Lionfish Removals Require a Coordinated International Effort

## Goal 2 - Quantify Removal Rates Required to contain invasion

### ■ Step 1

- Model virtual culls performed in the **major exporter precincts** - i.e., those that supply 95% of lions to the **Carolinas**
- 5 years, 10 random locations, 100 lionfish each
- Perform culls at varied rates
  - Annual (i.e. derbies) 50% - 90%
  - Monthly – 10% - 60%



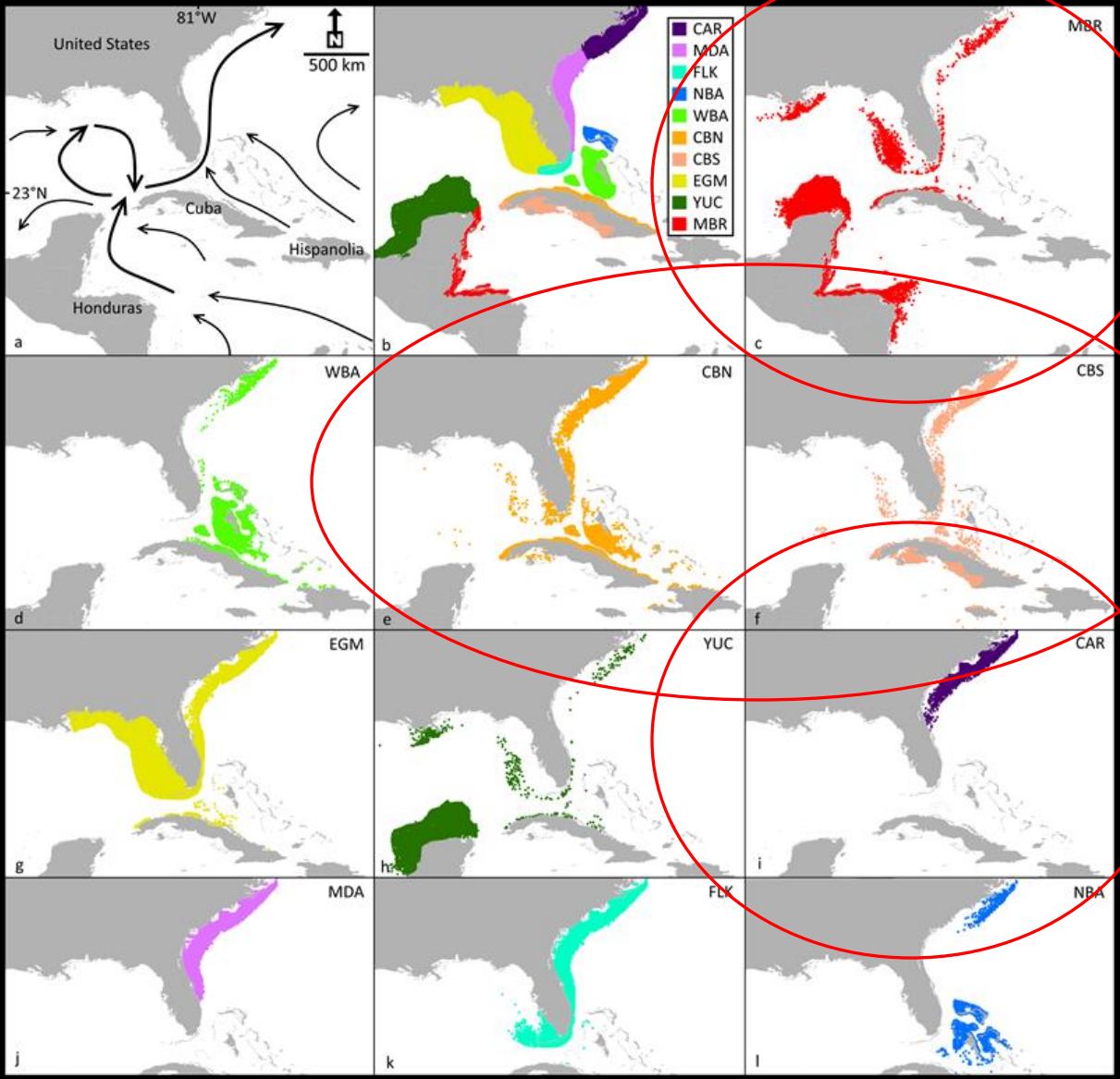
### ■ Step 2

- Repeat basin-wide for all 10 precincts that provide **100% of lionfish** to the **Carolinas**

Tests **sporadic** vs. **continuous** culls targeting 95% or 100%

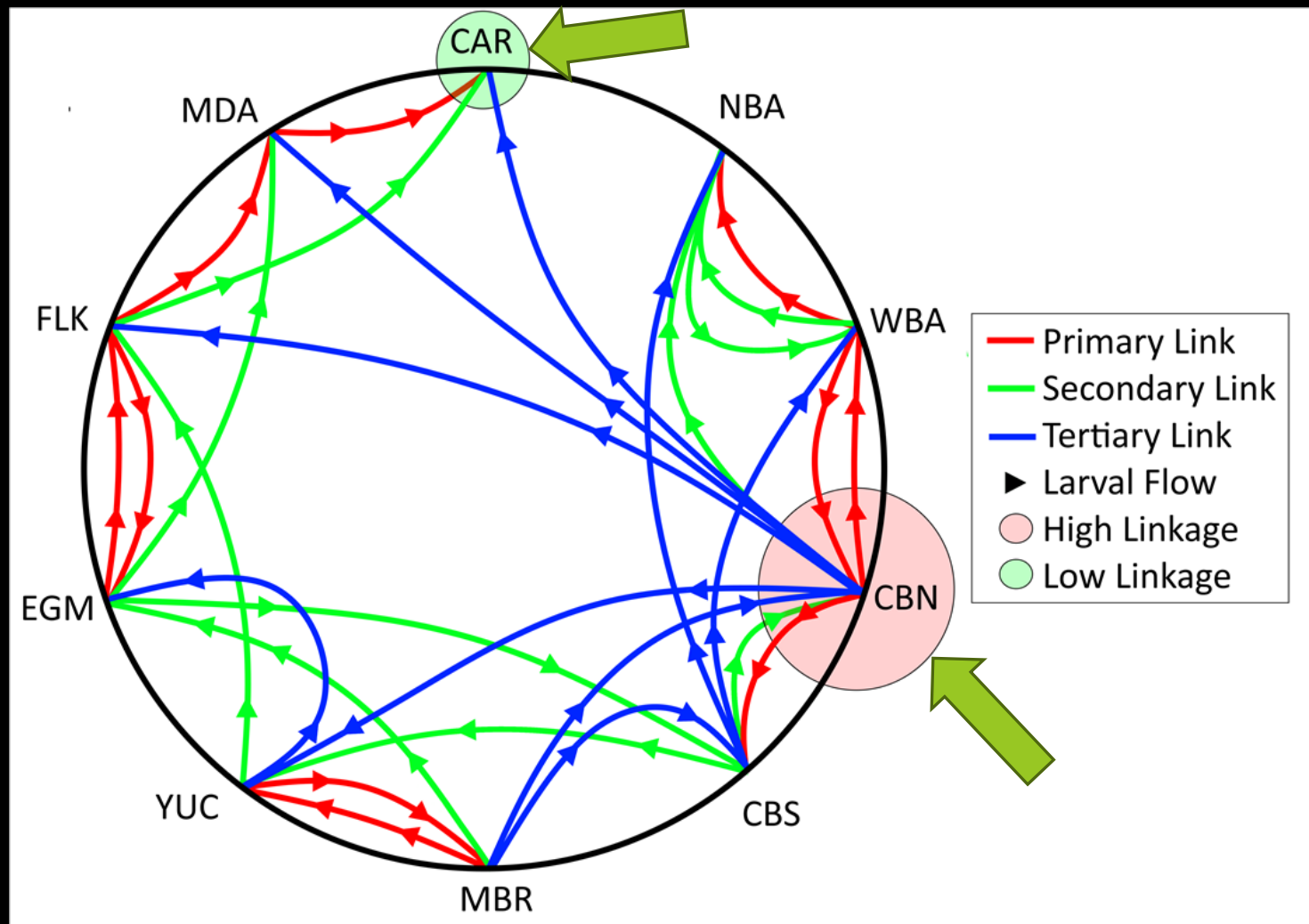
# Lionfish Removals Require a Coordinated International Effort

## Results (step 1)



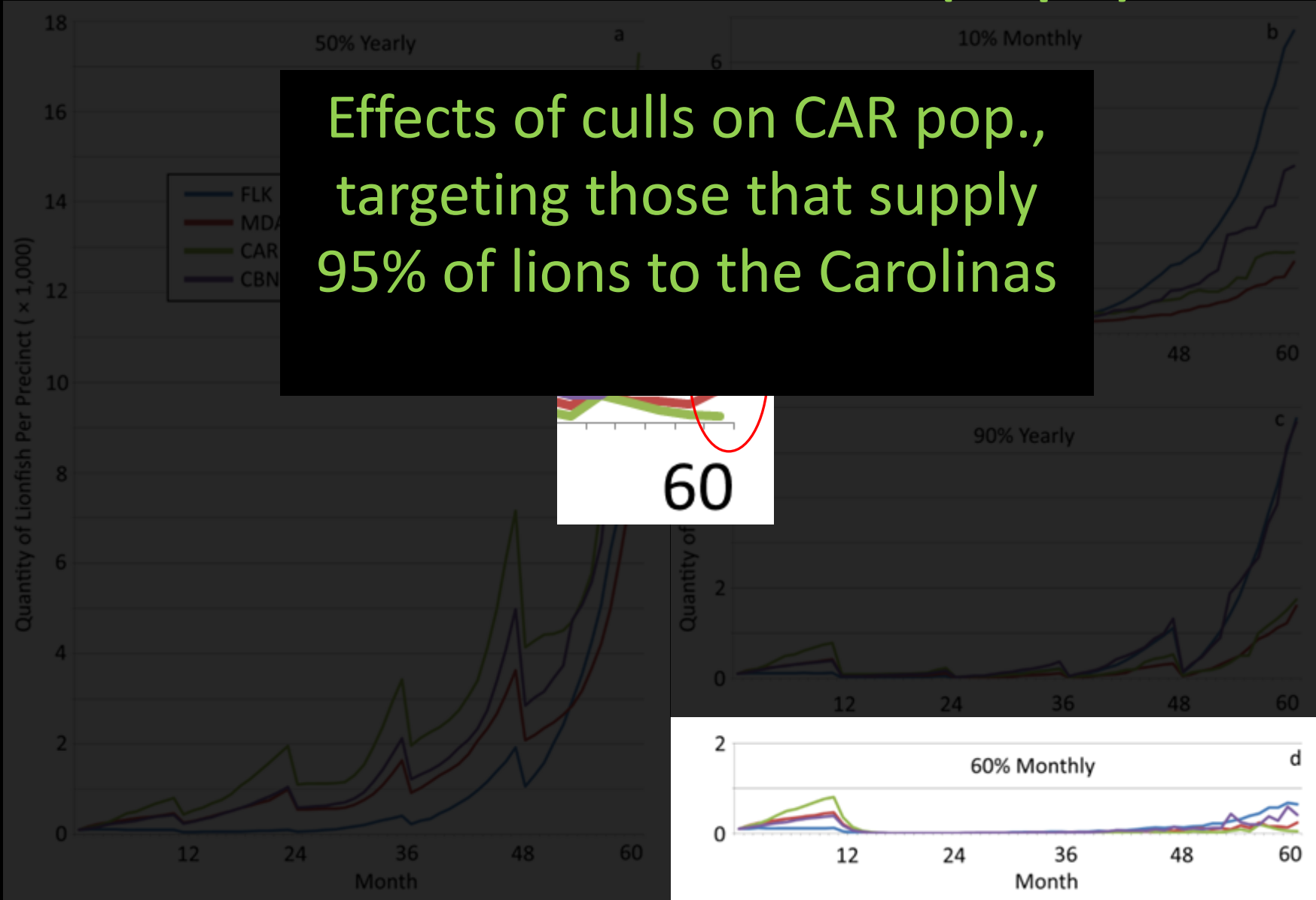
# Lionfish Removals Require a Coordinated International Effort

## Results (step 1)



- Linkages between regions
- Cuba - major exporter
- Carolinas imports almost all

# Lionfish Removals Require a Coordinated International Effort : Results (Step 2)





# Lionfish Removals Require a Coordinated International Effort • Results (Step 2)

E1

Not doing enough!

h

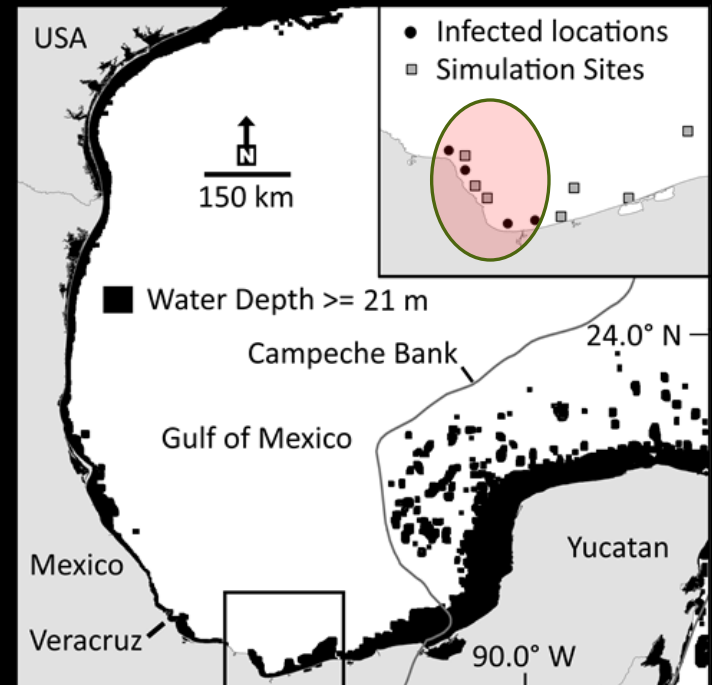
Are we causing more damage (i.e. recruitment compensation) – just “pruning the trees” ??

## Needed:

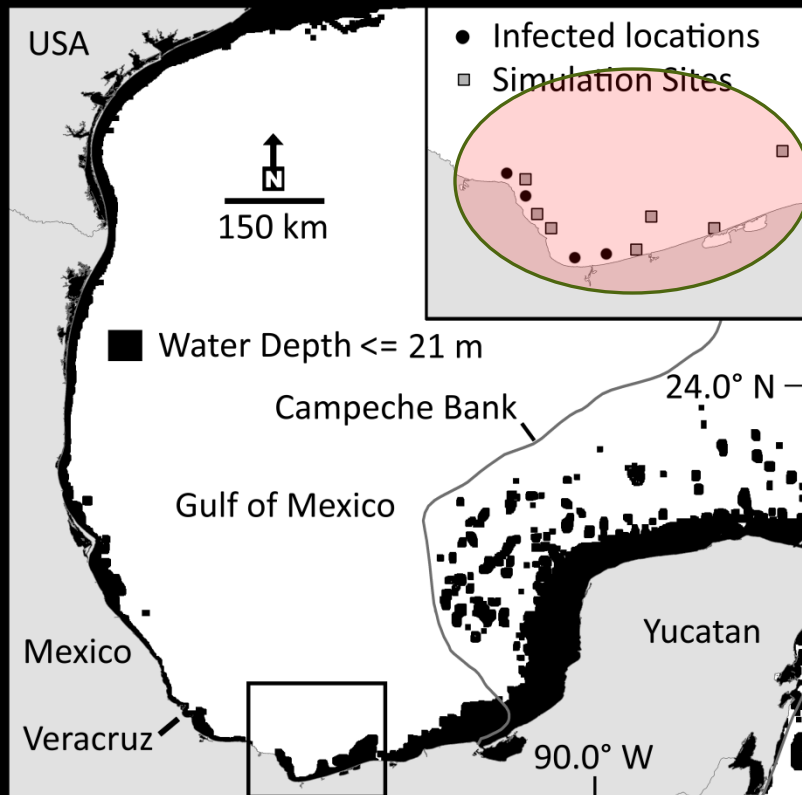
1. Monthly culls
2. Basin wide
3. Target 20% of the entire population
  - 25% remnant populations
  - 20% basin-wide/monthly

# Royal Damsel (*Neopomacentrus cyanomos*) in the Southern Gulf of Mexico

- First sighted in 2012 near Veracruz
- Common to aquaria, widespread
- Found in large numbers
- Non-predatory
  - Competition with native damsels
- Shallow  $\leq 21$  m
- Pelagic larvae

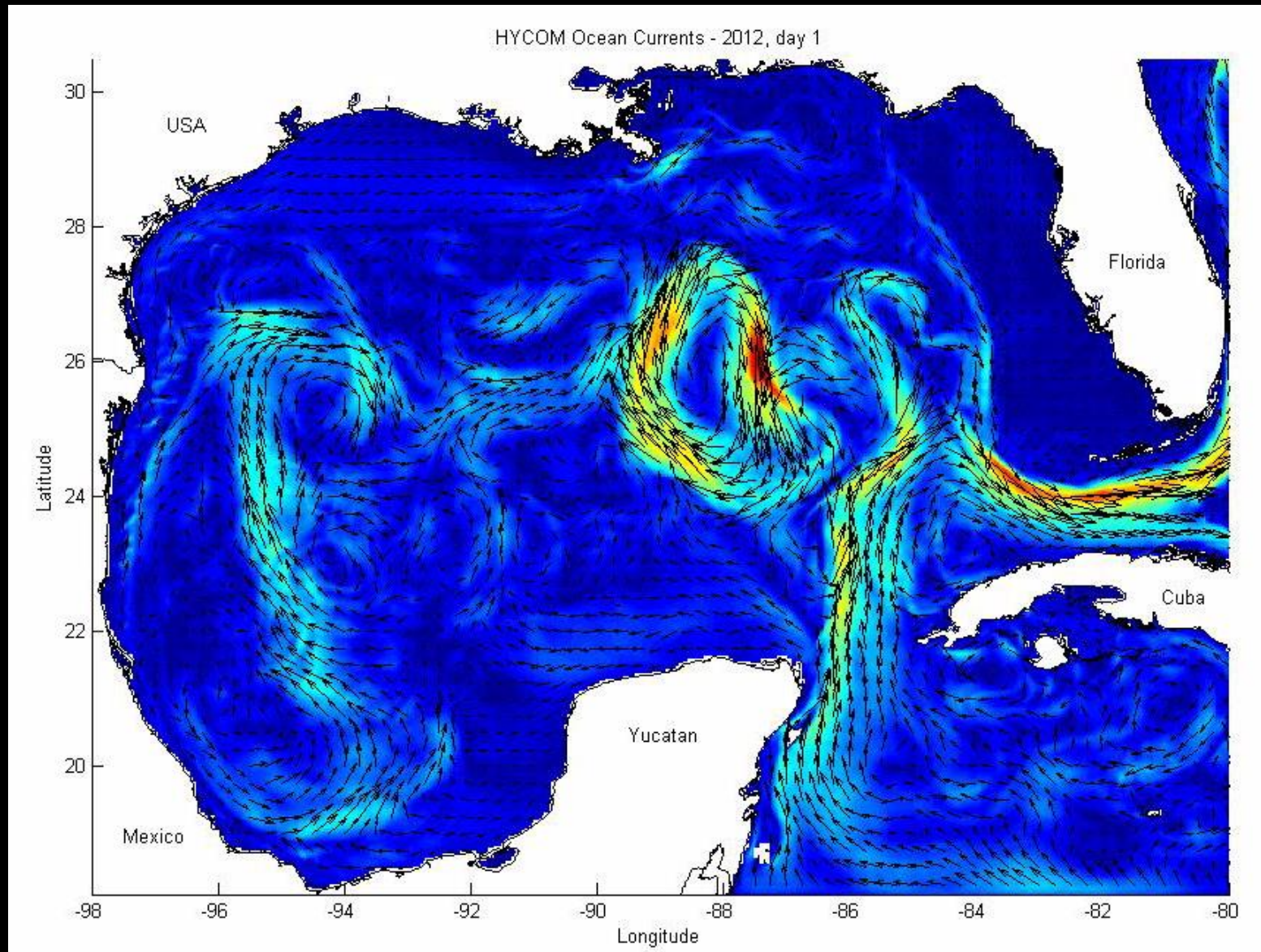


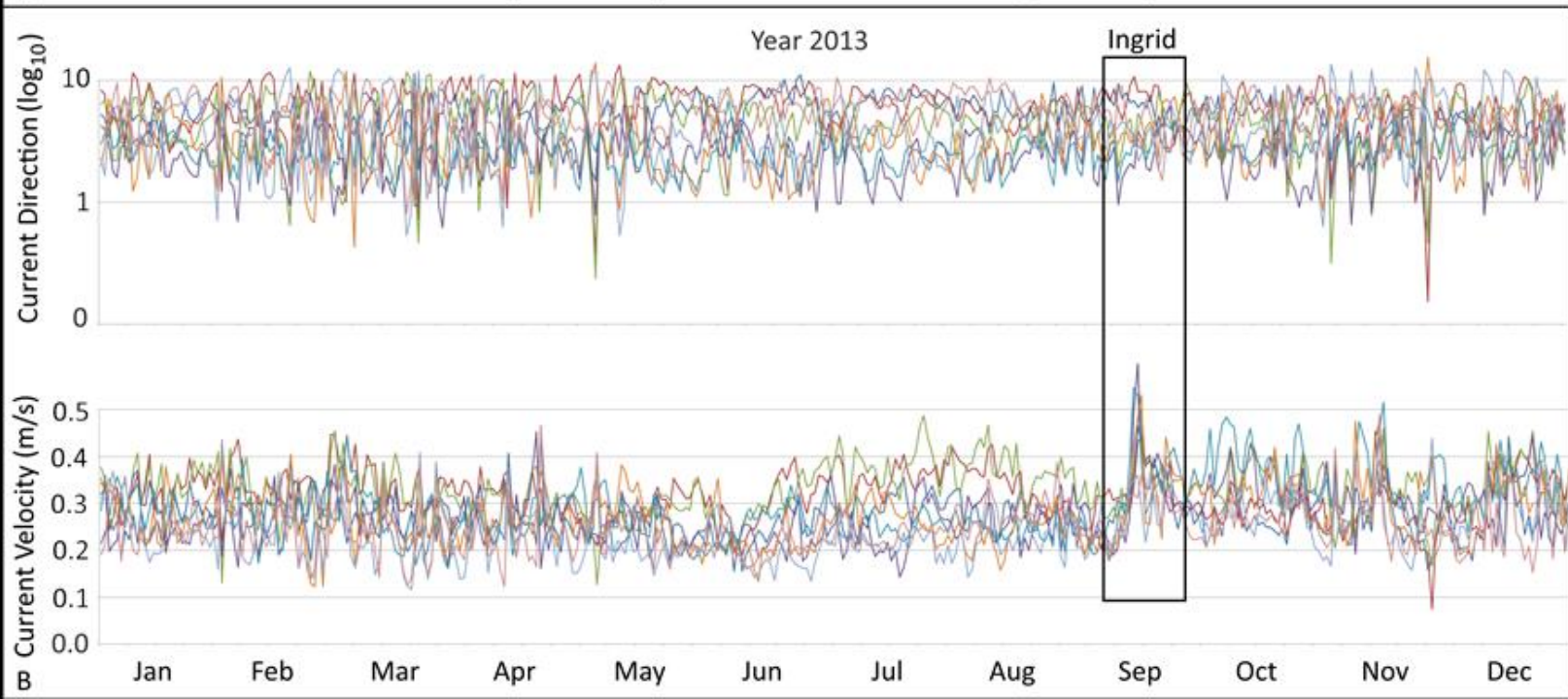
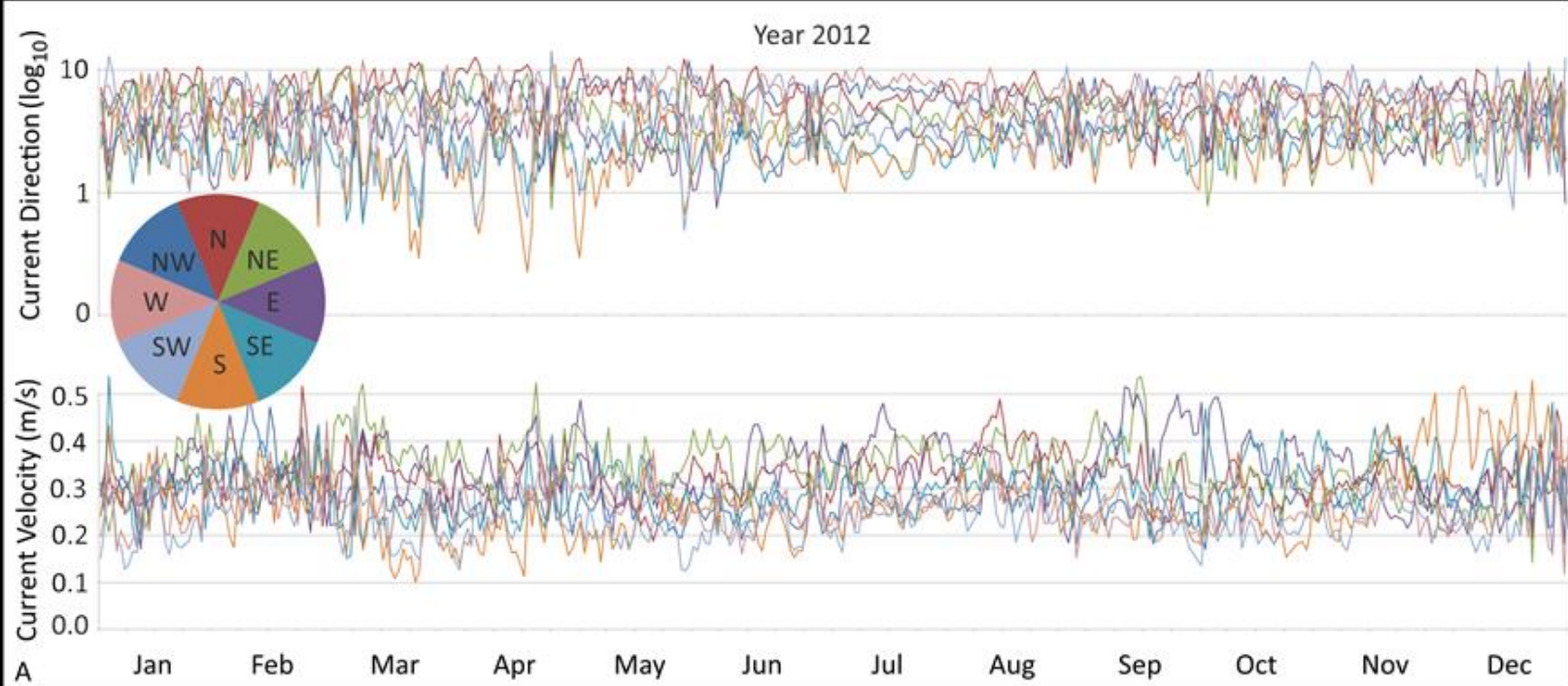
# Royal Damsel (*Neopomacentrus cyanomos*) in the Southern Gulf of Mexico



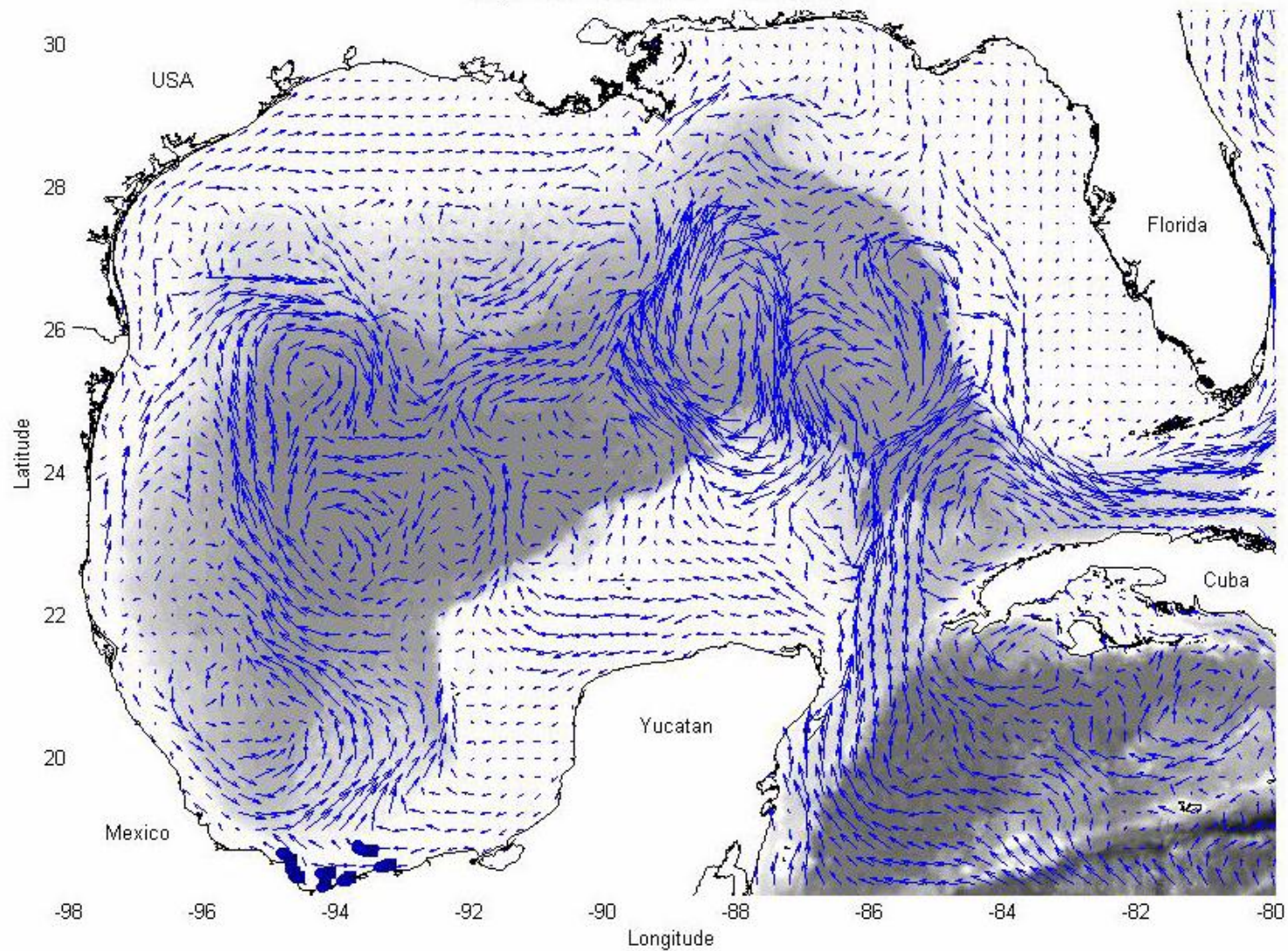
- Rapid risk assessment
- Create simulations for 5 years
- 8 Random founder populations
- Literature values for fecundity/habitat preferences
- Daily 1/25° HYCOM, 2010 - 2014
- Analyze ocean current trends

# Royal Damsel (*Neopomacentrus cyanomos*) in the Southern Gulf of Mexico

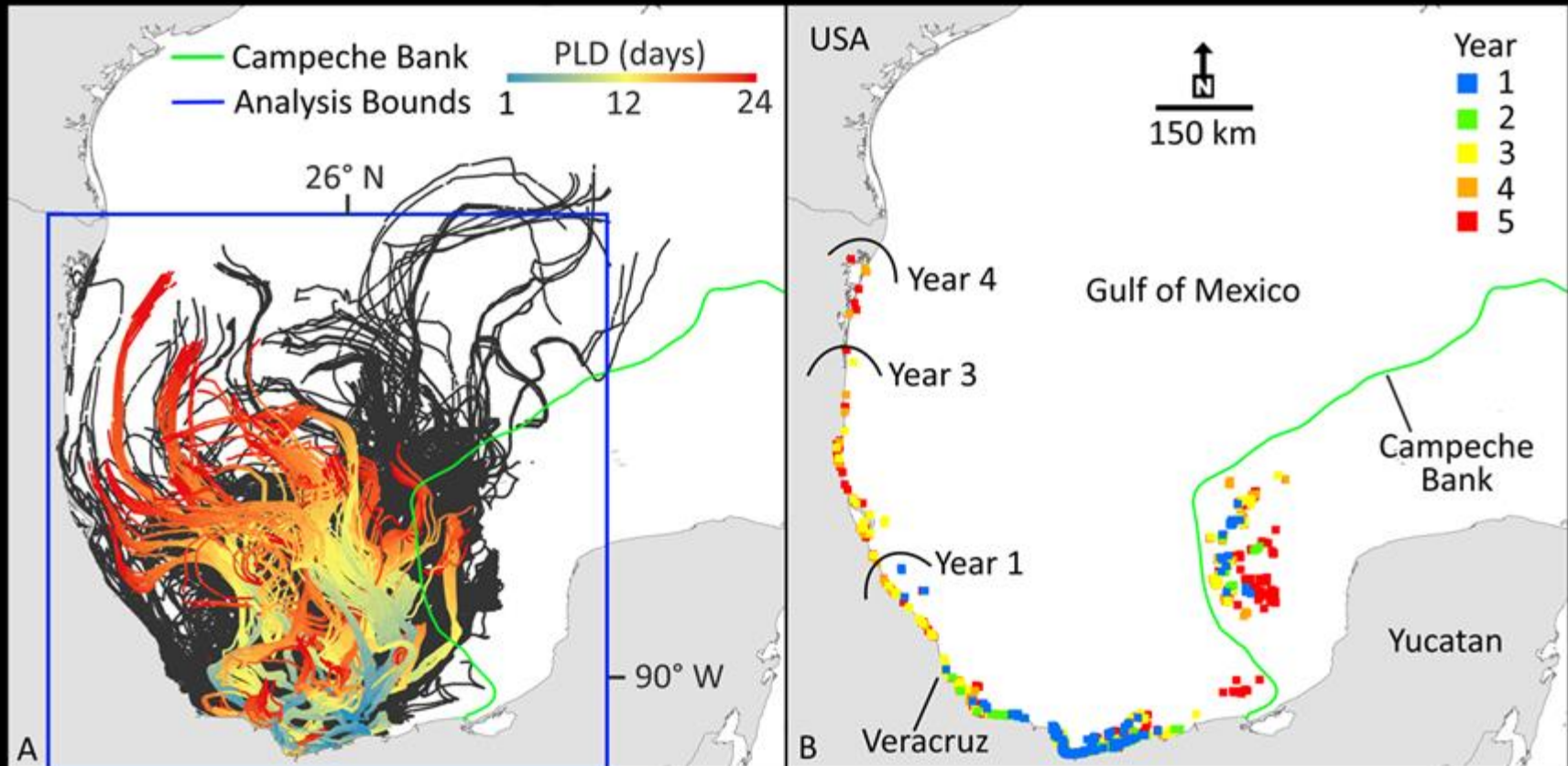




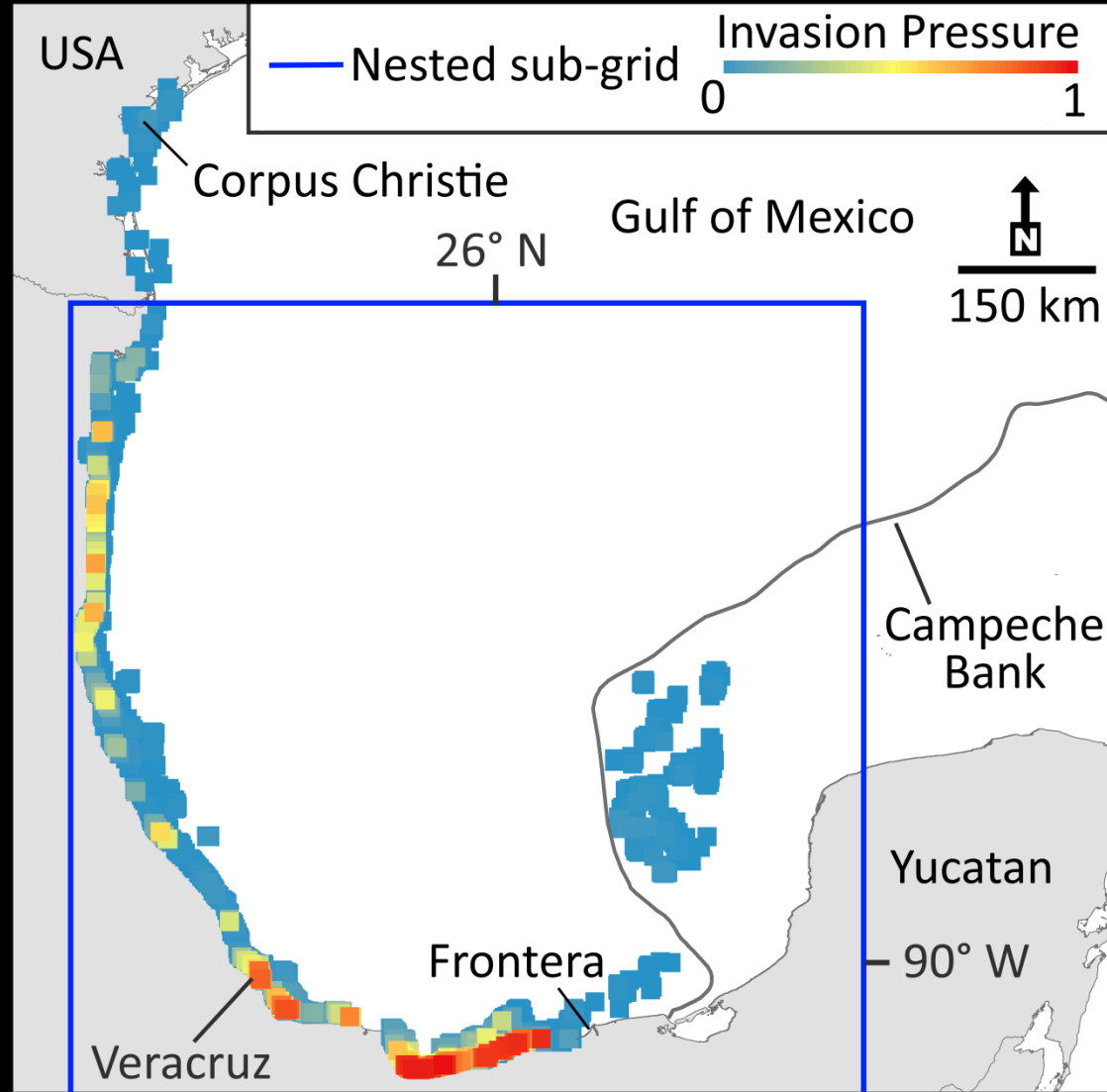
Regal Damsel Recruitment - Year: 1, Day: 1



# Royal Damsel (*Neopomacentrus cyanomos*) in the Southern Gulf of Mexico



- Limited spread over 5 years
- Connectivity break from greater GOM



- Low invasion risk over 5 – 15 years
- Control efforts should be focused near Veracruz extending to the western Campeche Bank and Mexican Shoreline



# Thank you!

More information: <http://www.mattspace.com>

