

# Probabilistic Modeling of Aboveground Storage Tanks Under Surge and Wave Loads

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Wave Loads

Methodology

Flotation

Buckling

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Conclusions

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# Performance of aboveground storage tanks (ASTs) during past hurricane events

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# Motivation and objectives

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- Few fragility assessment studies are currently available:
  - ▶ Landucci et al. (2012): Flood/surge and very simplistic model
  - ▶ Kameshwar and Padgett (2017a,b): Wind or storm surge
- No studies have considered the hydrodynamic effects (i.e., current and waves) of the surge

## **Objective of this study:**

Develop fragility models for a typical AST subjected to both the hydrostatic and hydrodynamic effects of storm surge

Two failure modes: Flotation and buckling

# Numerical modeling of wave loads

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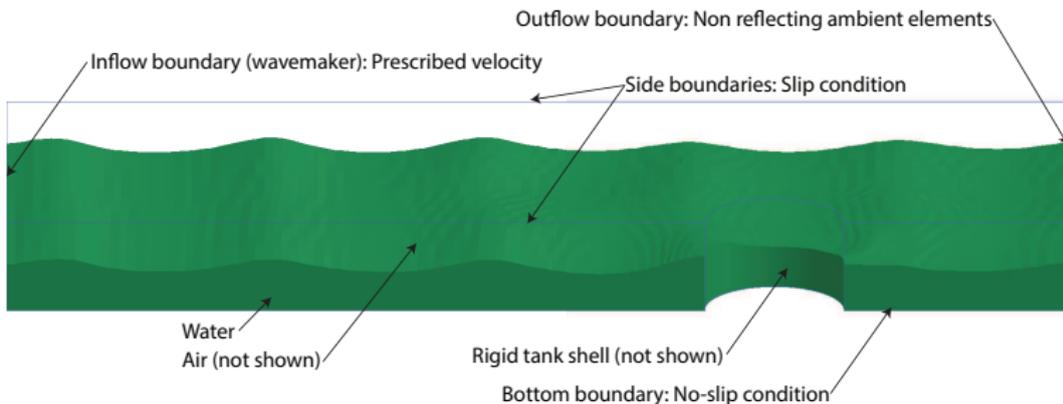
Flotation

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- Case study AST:  $D = 15$  m and  $H = 10$  m
- Overview of the numerical model:
  - ▶ Finite element (FE) model developed using the Arbitrary Lagrangian-Eulerian (ALE) method in *LS-Dyna*
  - ▶ Waves generated from Fenton's wave theory (Fenton 1988)



# Validation of the numerical model for wave loads

- Modeling assumptions validated against wave experiments performed at Oregon State University (Bernier et al. 2018)



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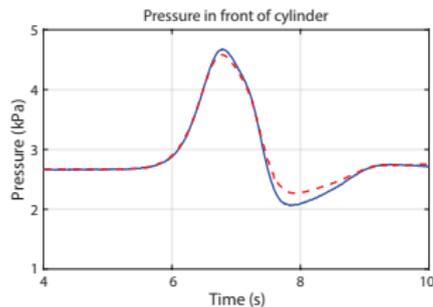
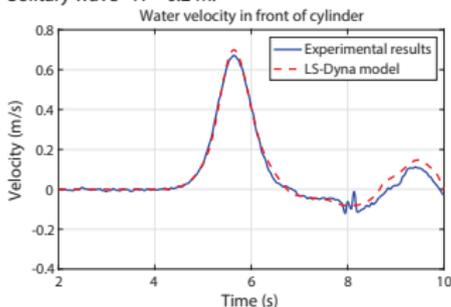
Buckling

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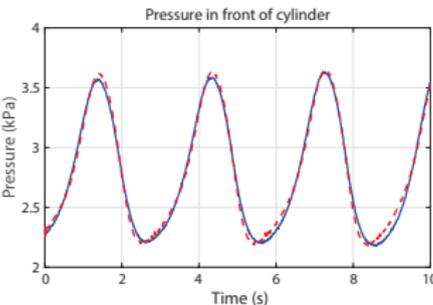
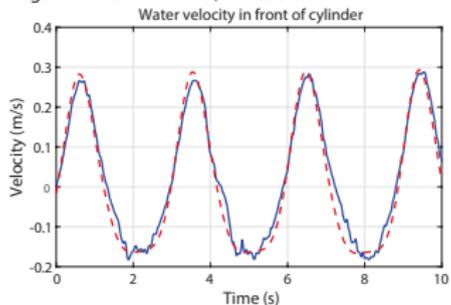
Conclusions

- Validation for solitary wave and regular wave cases:

Solitary wave -  $H = 0.2$  m:



Regular wave -  $H = 0.1$  m;  $T = 2.95$  s:



# Regression model for pressure distribution

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- Regression model to reduce the computational cost of estimating wave loads for fragility analysis
- Space filling experimental design using Latin Hypercube Sampling (LHS) with 220 FE analyses
- Ranges of surge and wave parameters obtained from simulations of historic and synthetic storms in the Houston region (*ADCIRC*):

Parameter	Parameter name	Range
$S$ (m)	Surge depth	1.0 – 7.5
$H_w$ (m)	Wave height	0.0 – 2.0
$T_w$ (s)	Wave period	3.0 – 6.0
$U$ (m/s)	Current velocity	0.0 – 1.5

# Regression model for pressure distribution

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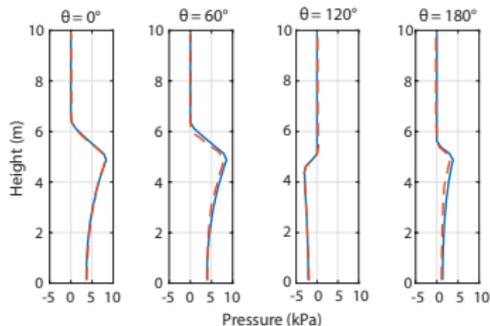
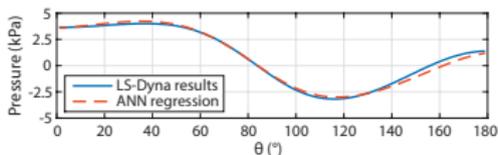
Buckling

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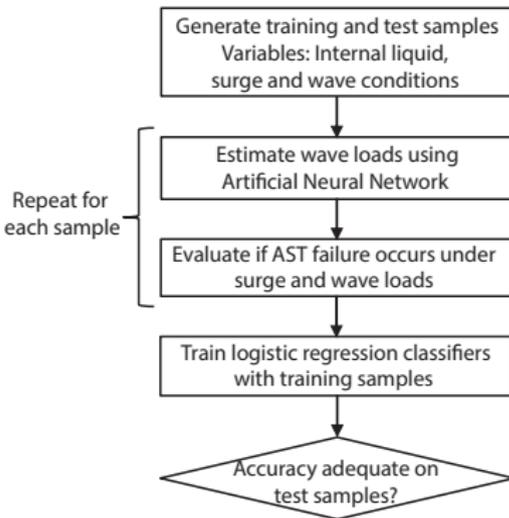
Conclusions

- Pressure distribution regression model using Artificial Neural Network (error less than 10%)

Input :  $\{S, H_w, T_w, U, \theta, h\} \mapsto$  Output :  $\{P_{hd}\}$



- Overview of methodology:



$$P(\text{Failure} \mid \mathbf{IM}; \mathbf{X}) = \frac{1}{1 + \exp(-l(\mathbf{IM}; \mathbf{X}))}$$

# Unanchored flotation fragility model

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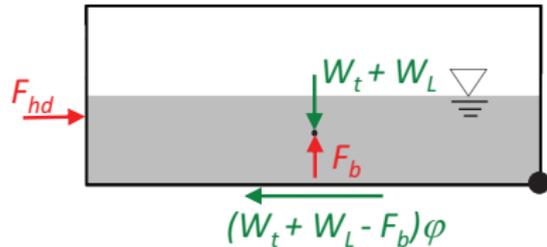
Conclusions

- Three possible mechanisms:

$$W_t + W_l < F_b$$

$$(W_t + W_l - F_b) \frac{D}{2} < M_{hd}$$

$$(W_t + W_l - F_b) \varphi < F_{hd}$$

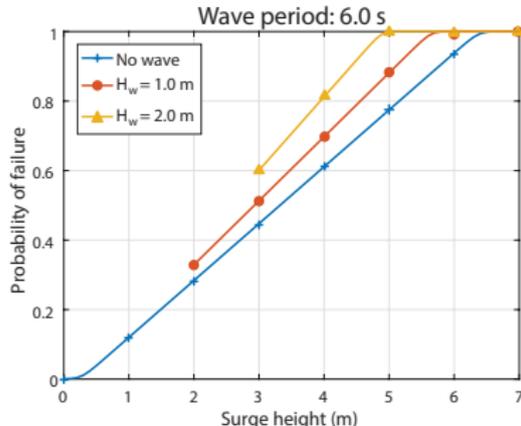
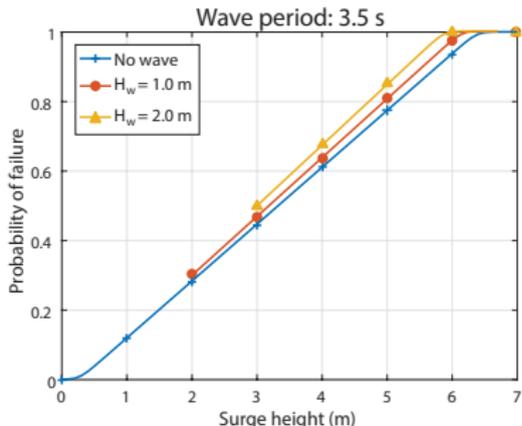


- $M_{hd}$  and  $F_{hd}$  obtained from ANN model
- Fragility model derived from 10,000 training samples
- Accuracy of 99.5% on 1,000 test samples

# Unanchored flotation fragility model

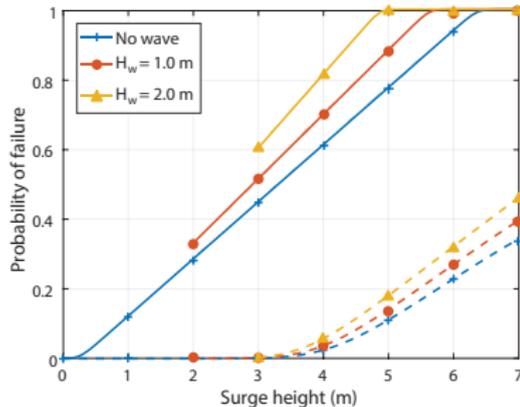
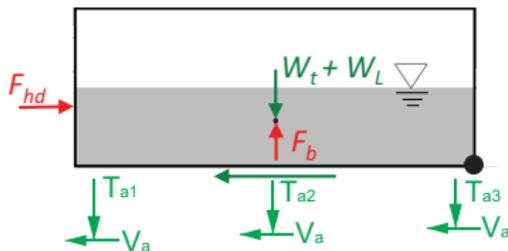
- Fragility model parameterized on:

- ▶ Internal liquid:  $\rho, L$
- ▶ Surge:  $S, U$
- ▶ Wave:  $H_w, T_w$
- ▶ Friction:  $\varphi$



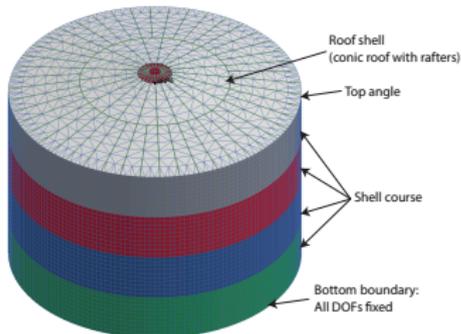
# Anchored flotation fragility model

- Add anchors tensile and shear strength to previous inequalities
- Additional parameters:
  - ▶ Anchors:  $d, s, f_y, f'_c, h_{ef}$
- Accuracy of 97.2%



# Buckling under surge and wave loads

- Buckling strength is assessed via finite element (FE) analysis
- Overview of FE model (*LS-Dyna*):
  - ▶ AST designed per API 650 standard

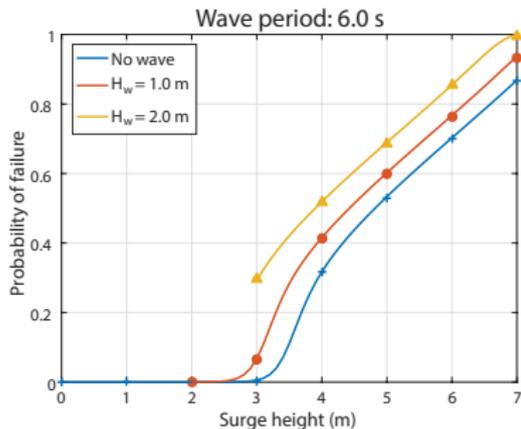
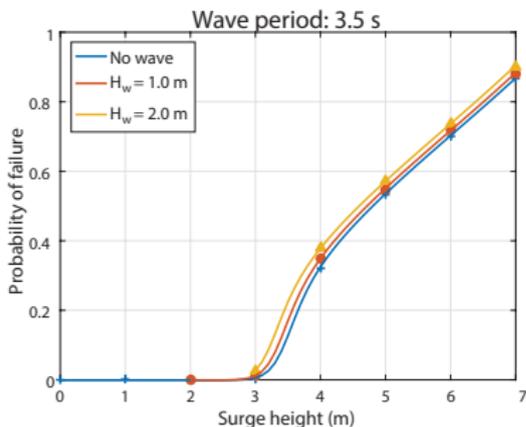


- Loads applied on FE model are obtained from ANN
- Fragility model derived from 2,000 buckling analyses
- Accuracy of 97.5% on 200 test samples

# Buckling fragility model

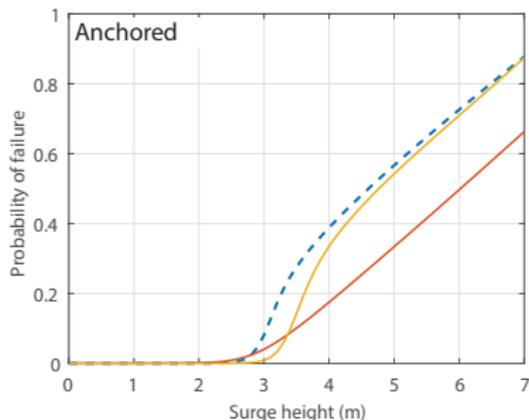
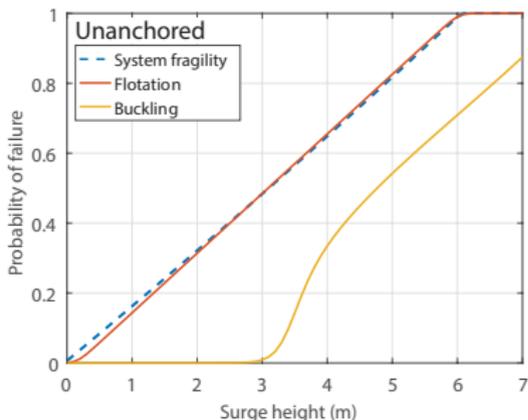
- Fragility model parameterized on:

- ▶ Internal liquid:  $\rho, L$
- ▶ Surge:  $S, U$
- ▶ Wave:  $H_w, T_w$



- Both failure modes using series system assumption

$$P(\text{Failure}) = P(\text{Flotation} \cup \text{Buckling})$$



# Conclusions and future work

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- Developed numerical model and regression model to easily estimate wave loads
- Provided better understanding of failure mechanisms under surge and wave loads
- Developed the first fragility models for an AST subjected to surge and wave loads
  - ▶ Importance of waves to adequately estimate probability of failure
  - ▶ Flotation is the failure mode of interest for unanchored ASTs
  - ▶ Buckling is the failure mode of interest for anchored ASTs
- Future work:
  - ▶ Fragility models parameterized on AST geometry
  - ▶ Risk assessment framework

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