



The Science of Risk Modeling and Modeling Approaches

Modeling Team

JD Ross Leahy (Presenter), Adam Byrd, Alex Suchar, Melba Salazar-Gutiérrez



Today's agenda

- 1 Background
- 2 Oil Spill Risk
- 3 Our Planned Modeling Approach
- 4 Our Rationale
- 5 Next Steps and Discussion

Discussion topics

- Feedback on the foundational model approach?
- Feedback on the schedule and sequence for model development?
- How can we best provide you information and opportunities for input?



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Legislative background

- ESHB 1578 was passed in 2019 to reduce the risk of oil spills, and protect Southern Resident Killer Whales
- Ecology's Spills Program tasked to undertake or assist with multiple policy initiatives in the bill, including the development of an oil spill risk model



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Our project team



- Adam Byrd, PhD
Database administration, Geographic Information Systems
- Alex Suchar, PhD
Statistical and mathematical modeling
- Melba Salazar-Gutierrez, PhD
Statistical and mathematical modeling
- JD Ross Leahy, Licensed Master
Maritime operations



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Research philosophy

Transparent

- Open
- Inclusive

Reproducible

- Well documented
- Methodologically sound

Credible

- Peer reviewed
- Validated



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Model development project goals

- Produce **a tool** to quantitatively assess current and potential oil spills risks from covered vessels in Washington waters
- Provide **a framework** for future oil spill risk analyses



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Defining risk

- “A hazard, a probability, a consequence, or a combination of probability and severity of consequence.”
 - National Research Council in Scientific Review of the Proposed Risk Assessment Bulletin
- “Risk is the combination of the likelihood of an event and the consequence if the event occurs.”
 - Dept of Ecology in Columbia River Vessel Traffic Evaluation and Safety Assessment (CRVTSA)



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Likelihood and consequence

- The chance that a vessel will be involved in an accident, e.g.
 - Days at sea
 - Waterway conditions where the vessel operates
- The severity of the consequences of a vessel accident, e.g.
 - Injury
 - Damage to vessel
 - Damage to other property
 - Damage to environment



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Describing oil spill risk

$$Risk = P \times C$$

$$Risk = f(S, P, C)$$

- P = probability of a vessel accident
- C = consequence of the accident
- S = various scenarios of what can go wrong in the system



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Describing oil spill risk

Scenarios

- Hazard identification: collision, allision, grounding, explosion, etc.

Probability

- How likely is each identified hazard?

Consequences

- If an accident happens, how likely is that an oil spill occurs, where it will occur, and what volume of oil will be released?



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Vessel Loss of Propulsion

CAUSES

INCIDENT

ACCIDENT

CONSEQUENCE

Equipment failure
Human error

Loss of Propulsion

Grounding

Oil Spill

Intervention

Intervention

Intervention

e.g. maintenance

e.g. tug escort

e.g. double hull



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Modeling approach

Vessel Movement Module



Encounter Module



Accident Module



Oil Outflow Module

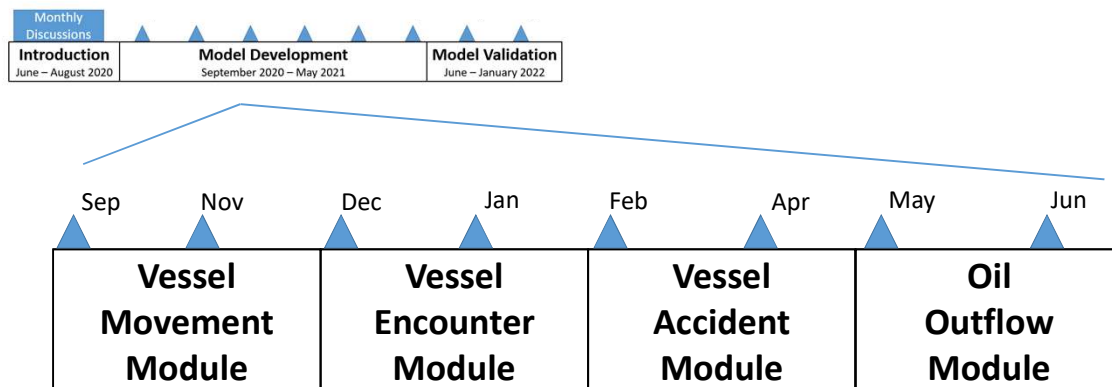


Model Outputs



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A step by step approach to building modules

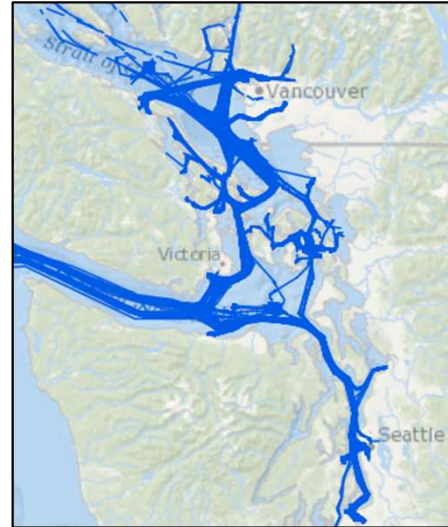
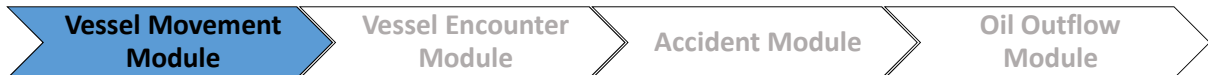


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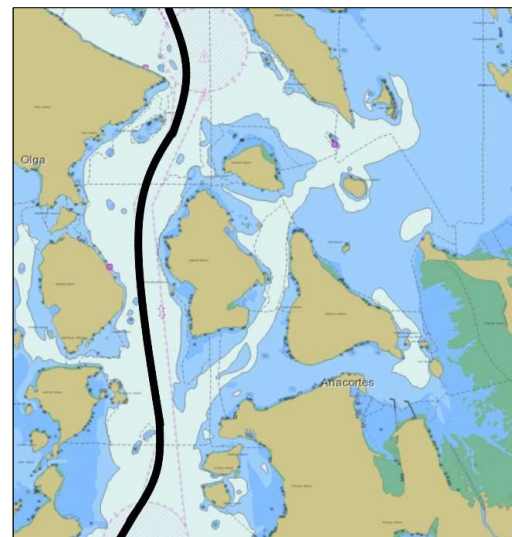
Objective

- Represent vessel volume and distribution
- Simulate random traffic configurations that are based on data


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Approach

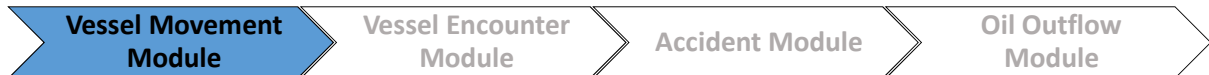
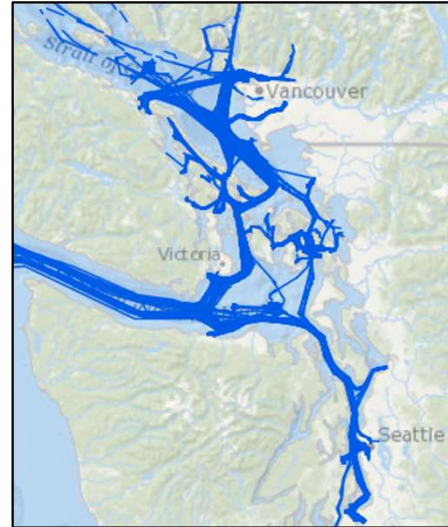
- Aggregate routes from AIS
- Populate vessels on routes
- Proceed at a given timestep.
- Organize by vessel type


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Inputs and Data

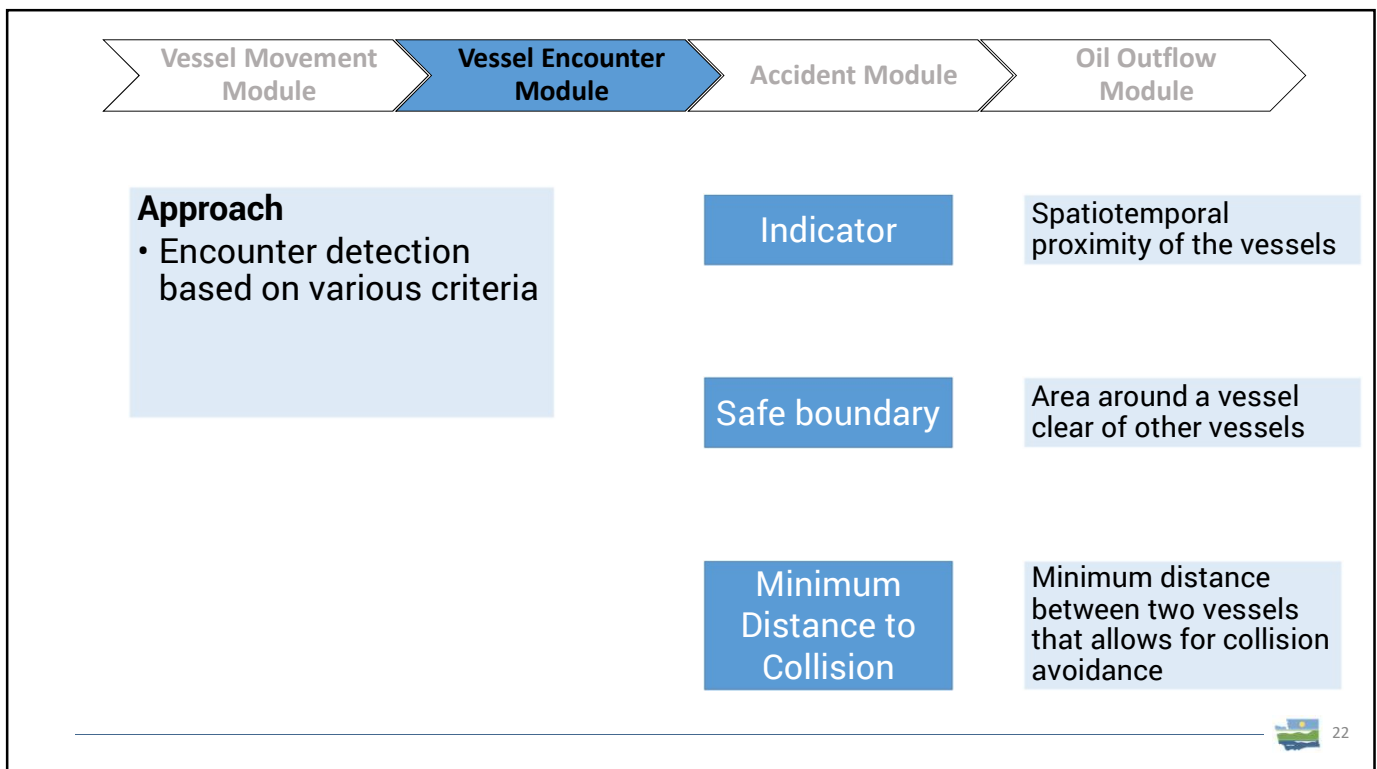
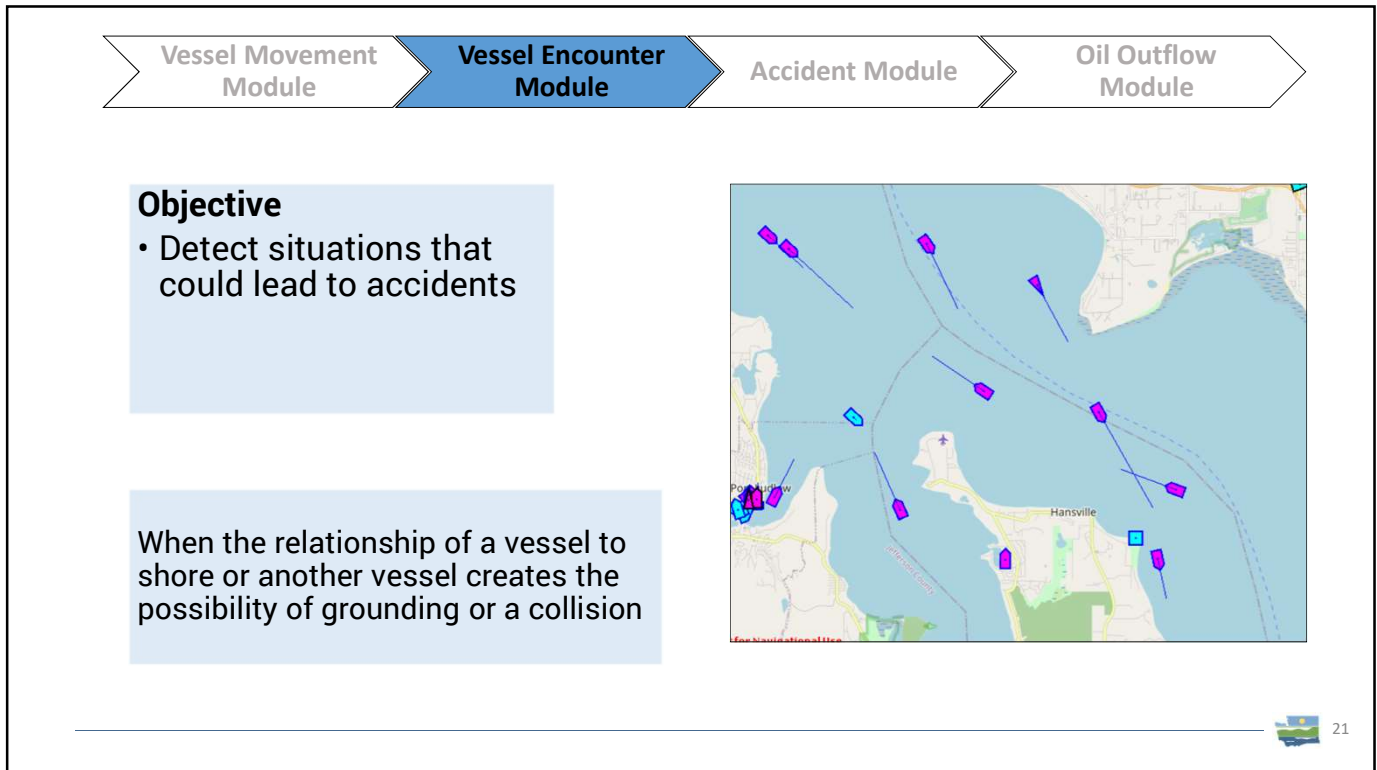
- AIS and other sources
- Common vessel routes
- Vessel characteristics
- Geographic range
- Navigational rules
- Temporal resolution
- Other factors

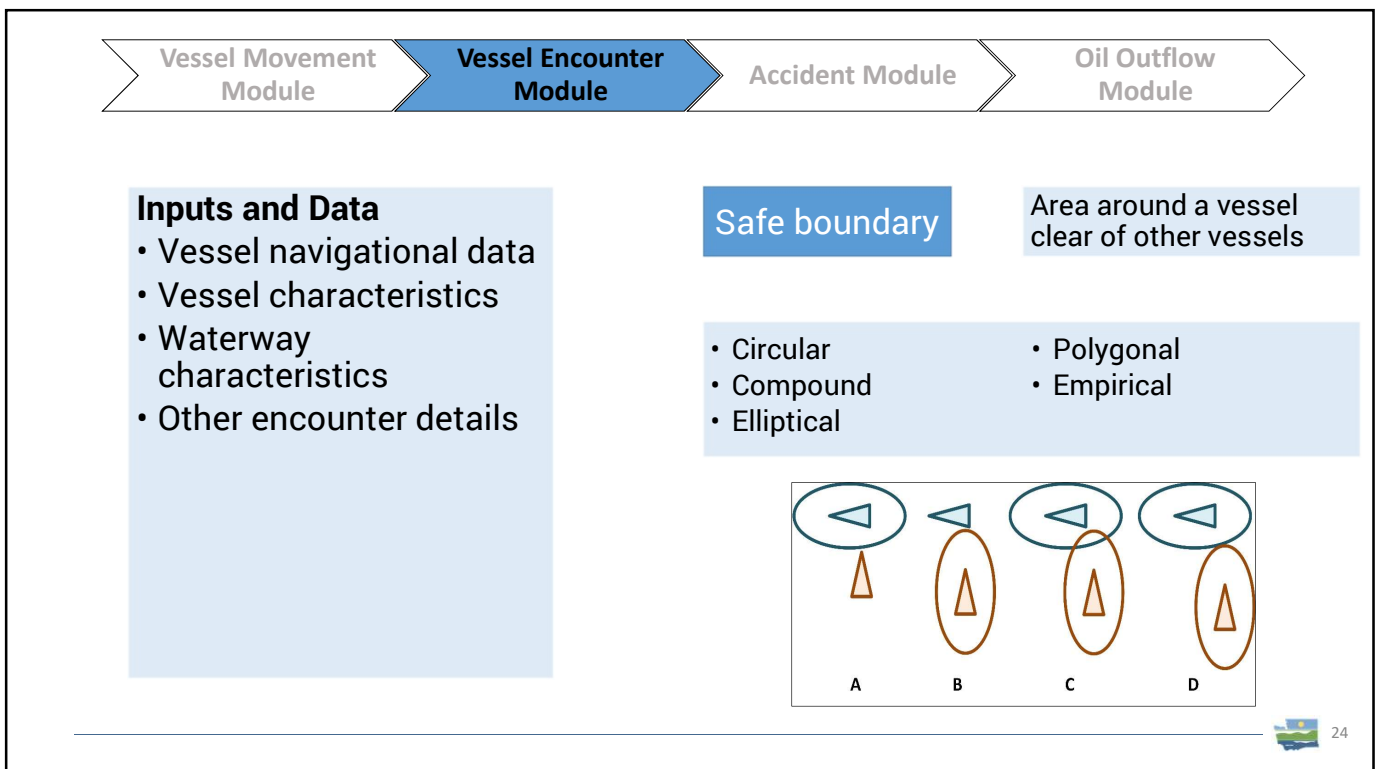
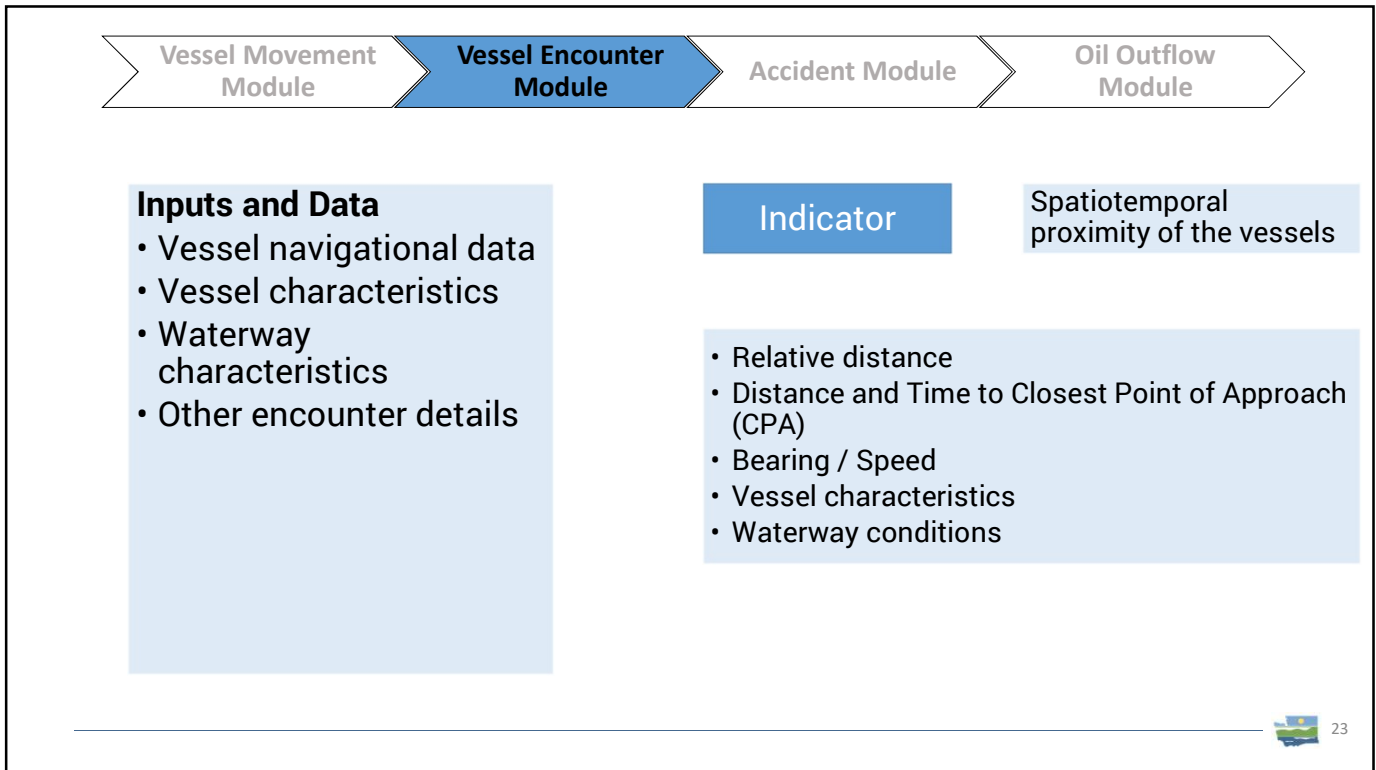


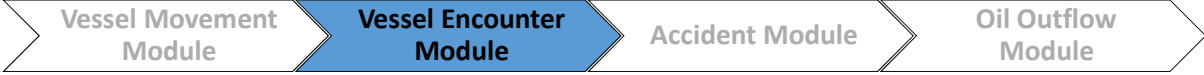
Challenges

- Noisy AIS dataset
- AIS provided vessel types not sufficient
- Smaller vessels and barges don't have AIS











A horizontal process flow diagram with four chevron-shaped boxes. From left to right: 'Vessel Movement Module', 'Vessel Encounter Module' (highlighted in blue), 'Accident Module', and 'Oil Outflow Module'.

Challenges

- Vessel behavior limited to AIS inputs
- Many approaches




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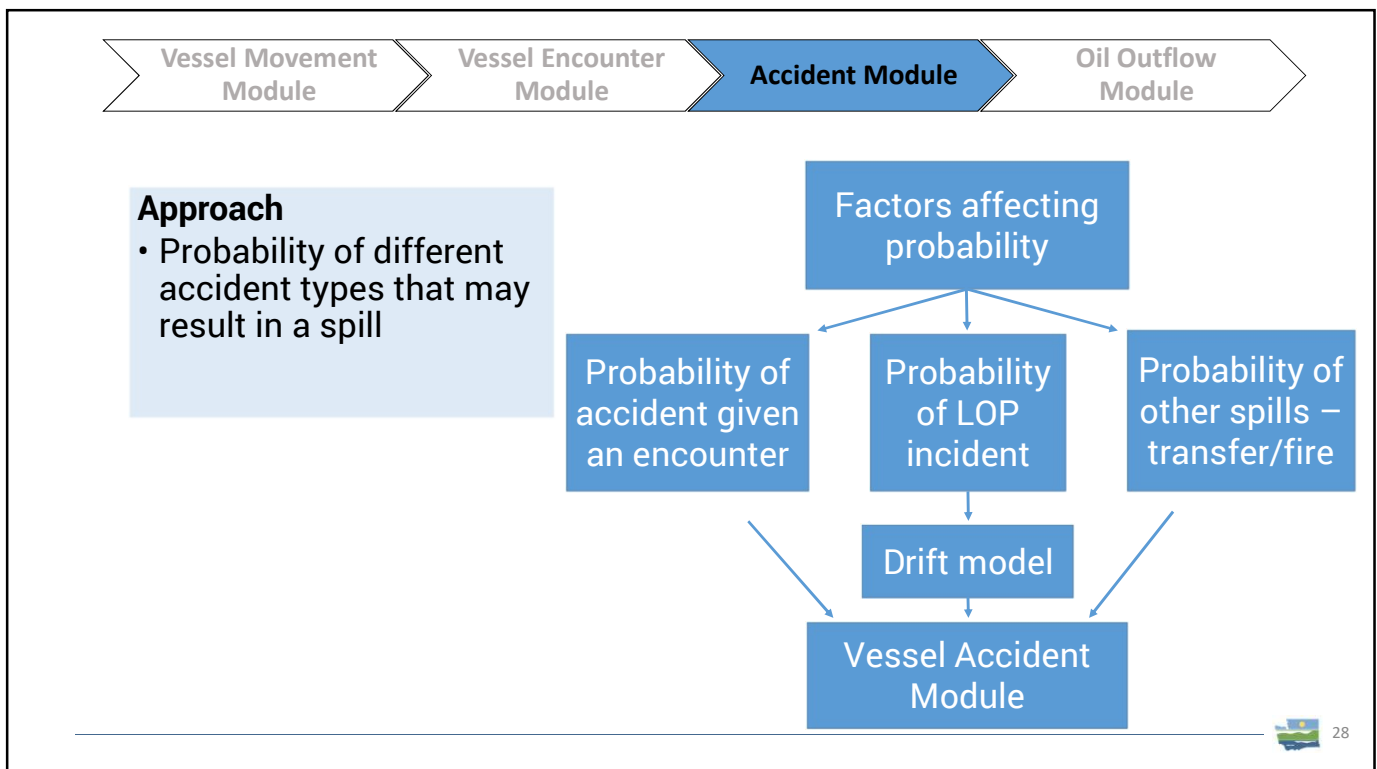
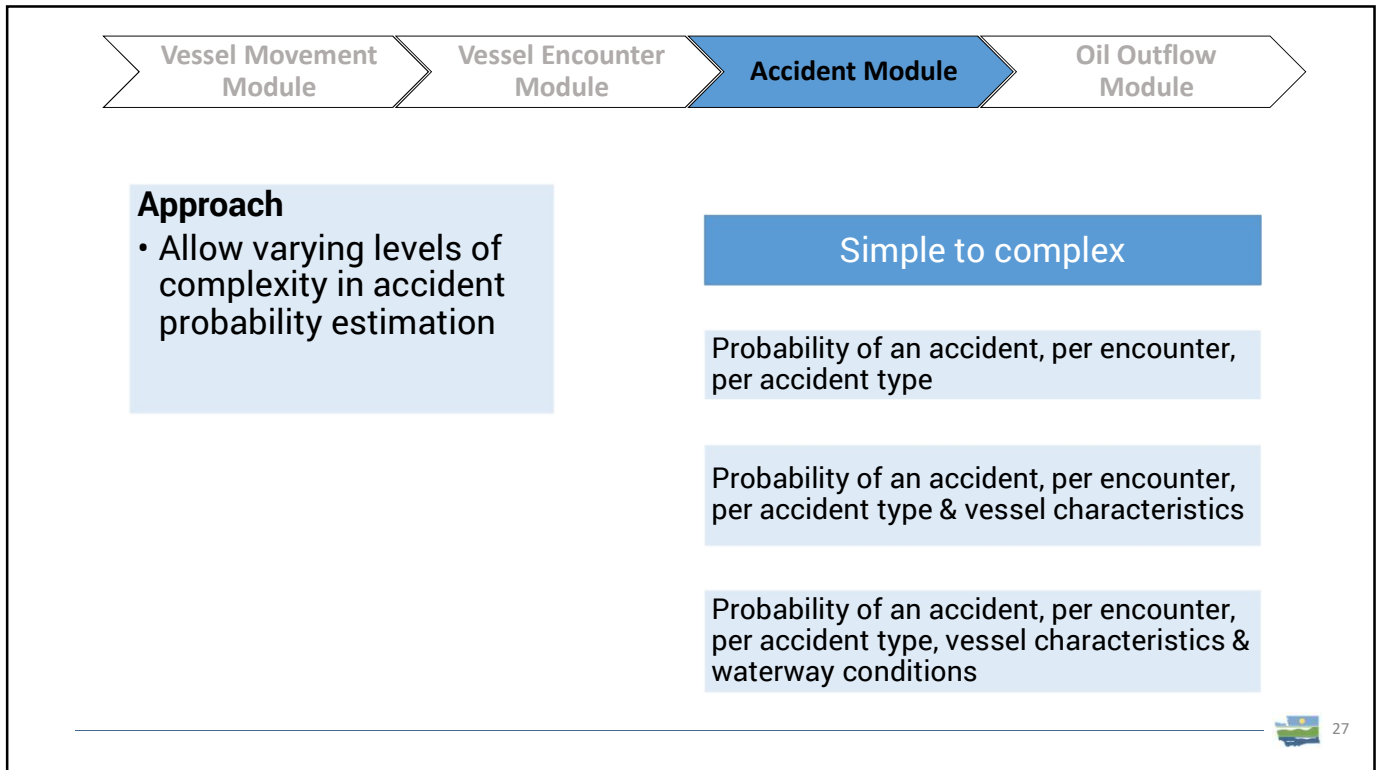
A horizontal process flow diagram with four chevron-shaped boxes. From left to right: 'Vessel Movement Module', 'Vessel Encounter Module', 'Accident Module' (highlighted in blue), and 'Oil Outflow Module'.

Objective

- Determine likelihood of vessel accidents/spills for simulated scenarios
- Simulated scenarios include the following:
 - Groundings/Allisions
 - Collisions
 - Transfer Spills
 - Fire/explosion
 - Sinking



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Inputs and Data

- USCG MISLE database
- USCG accident reports
- IHS Markit (Lloyd’s)
- Transportation Safety Board (Canada)
- National Transportation Safety Board (US)
- Ecology incident data

InitialEvent	SummaryOfEvents	ShipType&	Consequences& GrossTo
Fire or explosion	Presence of high level Drilling Rig, semi	Loss of life,Ship	991
Fire or explosion	The vessel was	Asphalt/Bitumen Tanker	1037
Collision	On May 31, 2018	Container Ship (Fully Cellular)	1812
Missing: assumed k	On 13 March 2018 at Bulk Carrier		5271
Stranding / groundi	On August 25, 2017	Drilling Ship	1427
Fatal injury	On 20 August 2017,	General Cargo S	Loss of life 2047
Sinking	The ship sank whilst i	Research Survey	Total loss of the 25
Stranding / groundi	The boat was strand	Tug	Pollution 33
Collision	The boat was in colli	Tug	Pollution 27
Stranding / groundi	The tug was strand	Tug	Pollution 15
Stranding / groundi	The ship was strand	Fishing Vessel	Total loss of the 22
Sinking	The boat sank in the	Fishing Vessel	Loss of life 25
Collision	On 8th December 20	Container Ship (Fully Cellular)	7575
Foundering	Sank off Dutch Harb	Fishing Vessel	Loss of life,Total 18
Fire or explosion	El buque Aframax Rh	Crude Oil Tanker	Ship rendered un 5794
Capsizing / listing	The ship capsized wh	Fishing Vessel	Pollution 14
Fire or explosion	The tug caught fire o	Tug	Loss of life 12
Foundering	Merchant ships resc	Fishing Vessel	Total loss of the 165
Sinking	The ship sustained ur	Fishing Vessel	Total loss of the 13
Collision	At approximately 12:	Container Ship (F	Ship rendered un 5348
Stranding / groundi	The ship was strand	Fishing Vessel	Total loss of the 10
Fire or explosion	On 14th December	LPG Tanker	1720
Contact	On September 20,	Drilling Ship	Loss of life,Serio 6053
Contact	The bulk carrier Glob	Bulk Carrier	Pollution 2115

Example accident data



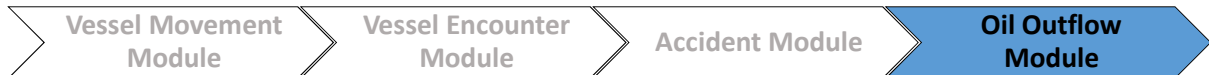
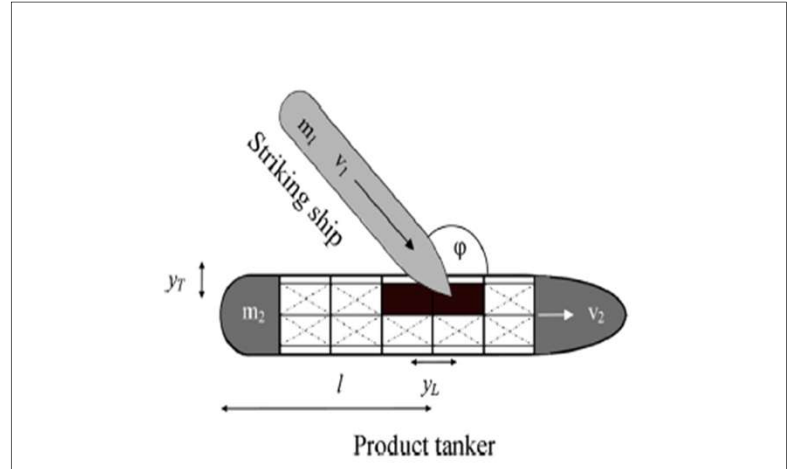
Challenges

- Data availability
- Process uncertainty



Objective

- Estimate the amount of oil that is spilled to water from a simulated accident



Approach

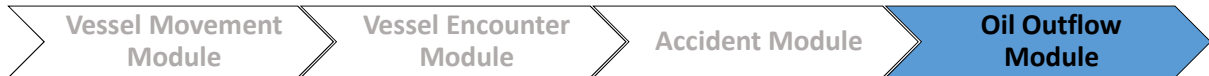
- Estimate the amount of oil that is spilled to water from a simulated accident

Simple to complex

Statistical estimation of oil spill rates

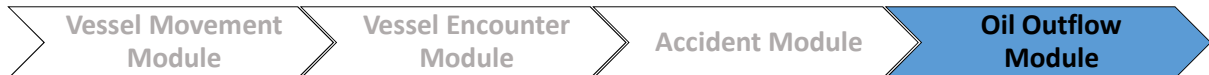
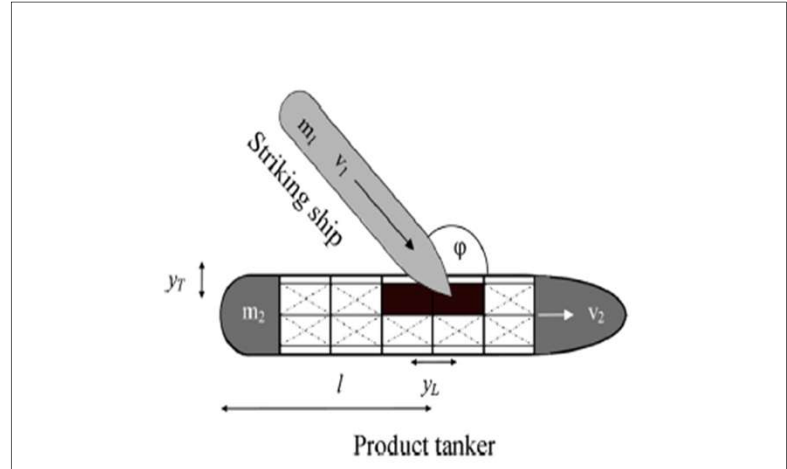
Mechanistic models of oil spills

Combination of both approaches



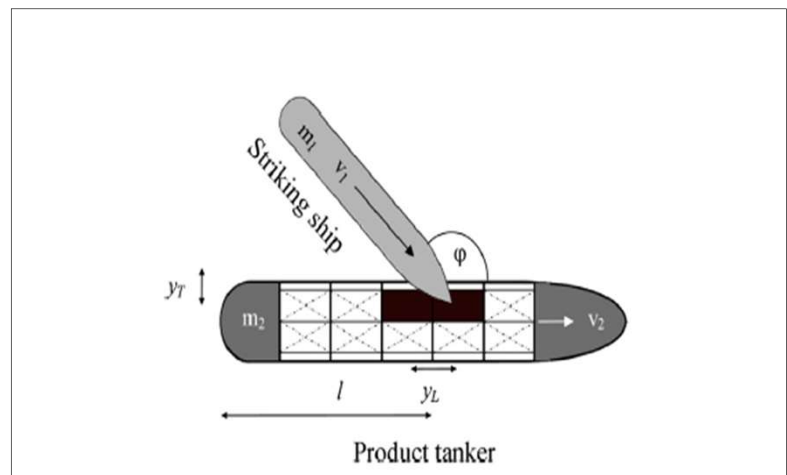
Data and Inputs

- Vessel construction
- Tank location
- Amount of oil (cargo)
- Amount of oil (fuel)
- Oil type
- Accident details

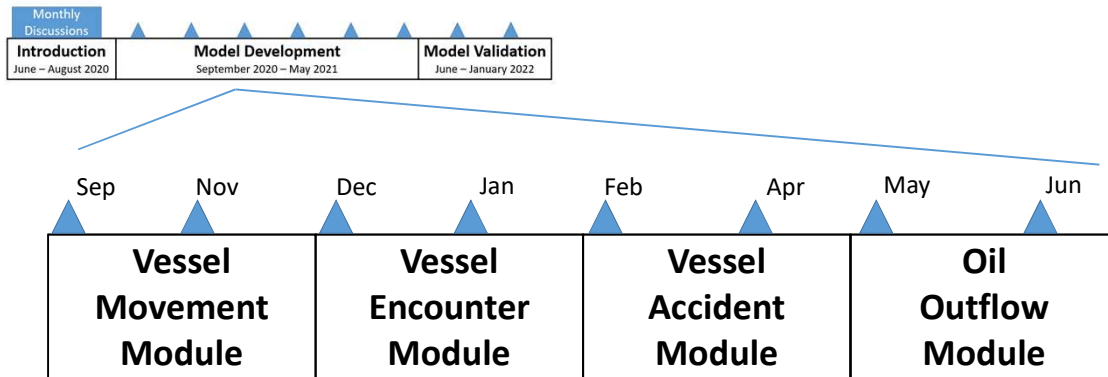


Challenges

- Data availability for vessel characteristics
- Accurately simulating amount and type of onboard oil



A step by step approach to building modules



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Running the model

- **Integrated modeling approach**
 - Both mathematical and statistical
- **Stochastic simulation**
 - Each model run will have unique outputs



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Requirements for the model

Quantitative

- Measurable & numerical results

Covered vessels

- Vessel type specific

Tribe and stakeholder involvement

- Ongoing outreach and transparent approach

Account for changes in traffic

- Explicit modeling of vessel traffic

Evaluate risk reduction measures

- Explicit modeling of accident causes

Updatable

- Based on data



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A flexible framework

Requests

Consider USCG data on number and size of spills from oil barges

Deal with challenge of a lack of incidents to calibrate on

Use engineering analysis to consider force needed to cause oil outflow

Model Structure

Uses historical data

Uses stochastic simulation

Includes oil outflow module



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A flexible framework

Requests

Consider the natural distribution of other tugs besides an ERTV

Consider distribution of ships transiting in irregular patterns

Differentiate between laden/unladen transits

Include separate transit lines for tugs

Model Structure

The simulator pulls from the historical distribution

The simulator pulls from the historical distribution

Simulated vessels are uniquely represented

Vessel typology allows for this

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A flexible framework

Requests

Include fate, transport, and effects of a spill

Compatibility with other models

More robust treatment of spill consequence and impact

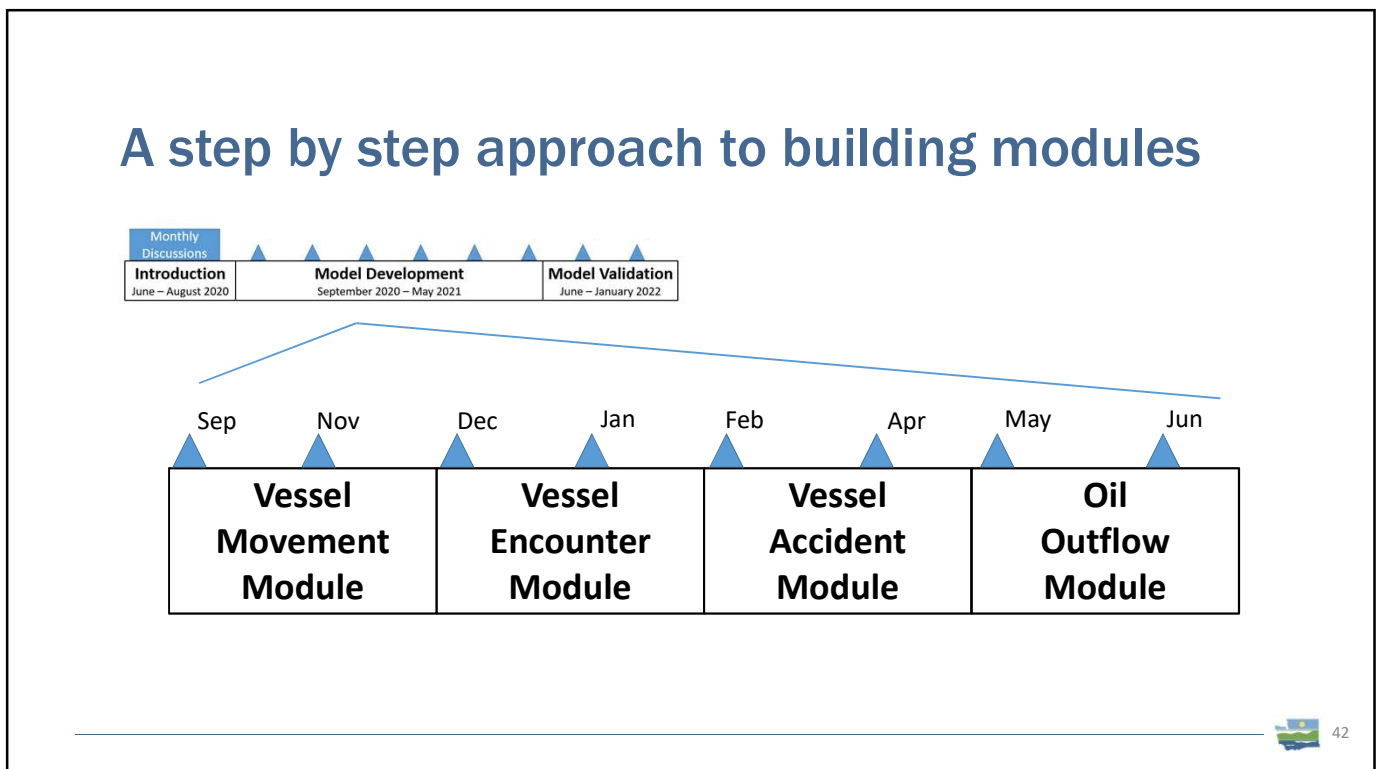
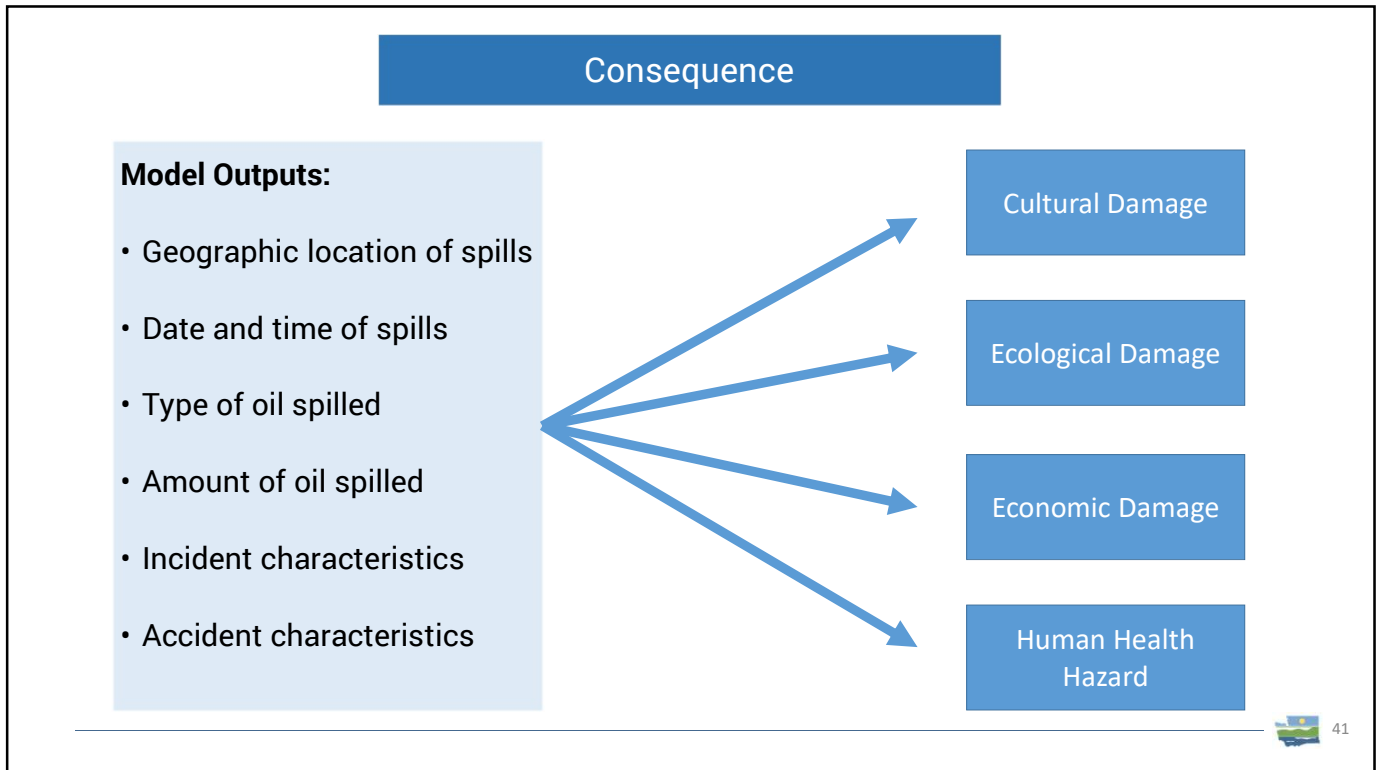
Model Structure

Discrete model outputs

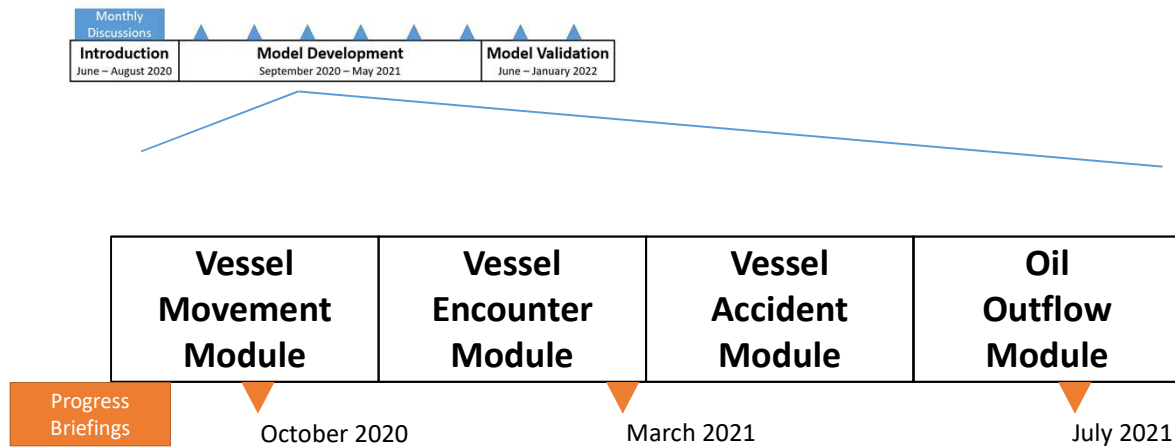
Discrete model outputs

Initial description of consequence

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Opportunities for updates



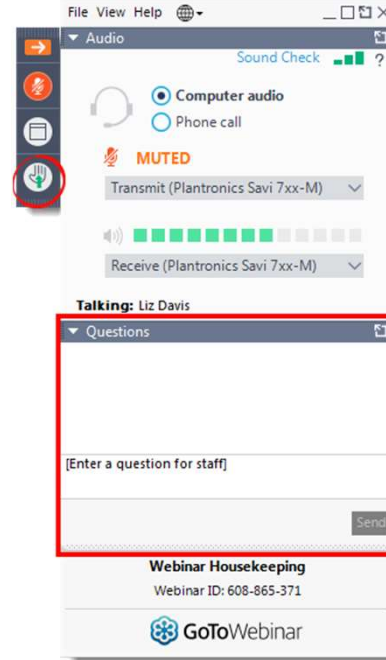
Upcoming event



September 16th, 2020 – 1 pm to 3 pm

- Vessel Movement Module

Discussion logistics



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Discussion topics

- Feedback on the foundational model approach?
- Feedback on the schedule and sequence for module development?
- How can we best provide you information and opportunities for input?



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Contact Info

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References

- **Slide 10:** National Research Council, NRC. 2007. Scientific Review of the Proposed Risk Assessment Bulletin from the Office of Management and Budget. Washington, D.C.: National Academies Press.
- **Slide 31:** Goerlandt F, Montewka J. A probabilistic model for accidental cargo oil outflow from product tankers in a ship-ship collision. *Mar Pollut Bull.* 2014;79(1-2):130-144.

