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Experimental Identification of Decoupled Ship Dynamic Models for an Autonomous Experimental Identification of Decoupled **Catamaran Urban Cargo Vessel** *∗* **Catamaran Urban Cargo Vessel** *⋆* **Catamaran Urban Cargo Vessel** *⋆*

Yan-Yun Zhang *∗* **Jef Billet** *∗* **Peter Slaets** *∗* **Yan-Yun Zhang** *∗* **Jef Billet** *∗* **Peter Slaets** *∗* **Yan-Yun Zhang Jef Billet Peter Slaets Yan-Yun Zhang** *∗* **Jef Billet** *∗* **Peter Slaets** *∗* **Yan-Yun Zhang** *∗* **Jef Billet** *∗* **Peter Slaets** *∗*

∗ Department of Mechanical Engineering, KU Leuven, 3000 Leuven, $Belgium\ (e-mail: \\\mathit{yanyun}.\mathit{zhang@kuleuven}.\mathit{be}, \; \mathit{jef}.\mathit{billet@kuleuven}.\mathit{be},$ $\begin{array}{c} \textit{peter}.\textit{slaets@kuleuven}.\textit{be}) \end{array}$ *peter.slaets@kuleuven.be)* * Department of Mechanical Engineering, KU Leuven, 3000 Leuven, Belgium (e-mail: yanyun.zhang@kuleuven.be, jef.billet@kuleuven.be, *peter.slaets@kuleuven.be) peter.slaets@kuleuven.be) Belgium (e-mail: yanyun.zhang@kuleuven.be, jef.billet@kuleuven.be,* $peter.\textit{slaets@kuleuven.}$ be, j

Abstract: KU Leuven developed and launched the *Maverick* catamaran in 2023, designed specifically for autonomous cargo transportation in narrow urban waterways. This vessel features a distinct actuation system utilizing two 360-degrees-steerable azimuth thrusters, positioned at the bow and stern. This study proposes and experimentally identifies decoupled ship dynamic models for the *Maverick* that concentrate on surge and yaw. The models aim to predict the vessel's speed and heading, particularly when steered by a bow thruster, sailing stably around service speed along the waterway. To do so, two sets of experiments were designed, each dedicated to collecting data for the individual identification of the decoupled models. These experiments deviate from the conventional use of standard maneuvers such as zigzage or turning, which are intended for maneuverability assessment of sea-going rudder-propeller vessels. Instead, sinusoidal excitation maneuvers were employed to better suit the dynamic system of the *Maverick* with its unique actuation system and operational strategy. Finally, a comparison is made between model predictions and a manually executed waterway-following maneuver recorded for reference. The results underline the suitability of the identified models for accurate trajectory prediction during the stable sailing scenario with small external disturbance
and minor course curvature. and minor course curvature. a distinct actuation system utilizing two 360-degrees-steerable azimuth thrusters, positioned at around service speed along the waterway. To do so, two sets of experiments were designed, *peter.slaets@kuleuven.be)* **Abstract:** KU Leuven developed and launched the *Maverick* catamaran in 2023, designed *peter.slaets@kuleuven.be)* maneuver recorded for recorded for recorded for recorded for results under the suitability of the suitability of the identified models for the identified models for the identified models for the identified models for the s

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1. INTRODUCTION 1. INTRODUCTION 1. INTRODUCTION 1. INTRODUCTION

Autonomous Surface Vessels (ASVs) are extensively used Autonomous Surface Vessels (ASVs) are extensively used for different tasks, including environmental monitoring, marine resources exploitation, offshore structures management, surveillance, passenger and cargo transportation, and so on. These rapid proliferation of ASVs applications has heightened the necessity for new technologies to support these varied tasks. In response, numerous research groups around the world are designing experimental ASV platforms with novel actuation systems, moving beyond conventional rudder-propeller configurations to achieve superior maneuverability, enhanced redundancy, and other advancements. Examples sorted by actuation type, include: clude: α and inadvancements. Examples some sorted by actuation type, infor different tasks, including environmental monitoring, Autonomous Surface Vessels (ASVs) are extensively used Autonomous Surface Vessels (ASVs) are extensively used for different tasks, including environmental monitoring,
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- Aligning with this trend, KU Leuven developed the *Maver-*• Water jets: Wu et al. (2009); Machado et al. (2014). • Water jets: Wu et al. (2009) ; Machado et al. (2014) .

Aligning with this trend, KU Leuven developed the *Maver ick*, Zhang et al. (2023), an over-actuated ASV specifically designed for enhanced maneuverability and tailored for
designed for enhanced maneuverability and tailored for cargo transportation in small urban waterways. The May erick is equipped with two 360-degree-steerable azimuth erick is equipped with two 360-degree-steerable azimuth thrusters, one at the bow and one at the stern, rendering it over-actuated. it over-actuated. For over-actuated azimuth-propelled vessels, addressing it over-actuated. it over-actuated. thrusters, one at the bow and one at the stern, rendering the strated of $\frac{1}{2}$ ordering thrusters, one at the bow and one at the stern, rendering

For over-actuated azimuth-propelled vessels, addressing the thrust allocation problem is crucial. Solutions have been proposed using pseudo-inverse, Sørdalen (1997), dybeen proposed using pseudo-inverse, sprudaen (1997), dy-
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trollers, in turn, are typically employed in maneuvers such croners, in turn, are typicany employed in maneuvers such
as dynamic positioning, Veksler et al. (2016); or automatic docking, Bitar et al. (2020). However, *simple sailing* does not mandate the full use of available actuators. Instead, the choice of an artificially under-actuated thrust configuration. ration, i.e., neglecting certain actuator Degrees of Freedom (DoFs), may benefit the control effort of individual ac-(Dors), may be elect the control effort of multiplated alleation based allocation method. Therefore, we developed an operating philosophy for the *Maverick* that is applied when the vessel maintains a stable course along the waterway around the service for the *Maverick* that is applied when the vessel maintains a stable course along the waterway around the service a stable course along the waterway around the service a stable course along the waterway around the service as dynamic positioning, Veksler et al. (2016); or automatic tuators despite omitting an optimization-based allocation

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speed. In this scenario, the advancing speed is controlled by the stern thruster, and the steering is controlled by the bow thruster. This necessitates the modeling of its now under-actuated behavior as a bow thruster-steered vessel, which we will demonstrate in this paper. This work will present decoupled dynamic model structures for surge and yaw motions, along with their experimental identification.

The rest of this paper is organized as follows: Section 2 introduces the testing platform, which includes the vessel and the corresponding sensor setup. Subsequently, Section 3 formulates the research problem, encompassing the application scenario, operational strategy, modeling assumptions, and structures of the decoupled ship dynamic models. Next, Section 4 explains the applied methodology, including the experiment design and identification method. Section 5 presents the modeling results and a trajectory comparison between model predictions and a manually executed maneuver. Finally, Section 6 concludes this paper.

2. PLATFORM

Table 1 presents the main particulars of the *Maverick*. Fig. 1 provides illustration of its geometric shape. Fig. 2 demonstrates the actuation system configuration of the *Maverick*: two identical thrusters are placed in separate cylinder cabins under the bridge deck, one at the bow and one at the stern, aligned along the centerline. Each thruster comprises an electric 360-degrees-rotatable saildrive (SDK-ED 2.5 AC) and a propeller. Control for each thruster is achieved by a pair of identical programmable AC motor controllers (Curtis 1232E-2321) managing the azimuth angle denoted as α , and propeller revolution denoted as *n*.

Table 1. Main particulars of the *Maverick*.

The *Maverick* is designed to accommodate different sensor setups and data acquisition systems. It treats sensors as external devices rather than fixed onboard components. In this study, a mobile sensor box was deployed to acquire data. Specifically, it comprises the AsteRx-i3 D Pro+ Global Navigation Satellite System (GNSS)/Inertial Navigation System (INS) receiver with dual antennas, which was utilized to acquire the measurements for this research.

3. PROBLEM FORMULATION

This section is dedicated to formulating the research problem addressed by this study: analyzing the application scenario 3.1, devising the operational strategy 3.2, outlining the modeling assumptions 3.3, and constructing the decoupled ship dynamic models 3.4.

3.1 Application Scenario

The transportation journey of inland cargo vessels involves various activities and considerations, which we can summarize into discrete mission phases: (i) Deberthing and

Fig. 1. 3D model representation of the *Maverick*, reproduced from Zhang et al. (2023).

Fig. 2. Actuation system configuration: (a) positions of the thrusters; (b) top view of the thruster.

departure from the port; (ii) Navigation through inland waterways; (iii) Arrival at the port and berthing. The first and third phases mainly involve port maneuvers featuring low speed and sharp turns, while the second phase mainly consists of stable sailing around service speed along the waterway. Note that, navigation through inland waterways also entails intricate maneuvering behaviors, including passing locks and bridges, encountering other vessels, following large waterway bends, and more. This study solely focuses on the stable sailing scenario of the second mission phase.

3.2 Operational Strategy

Given the actuation configuration detailed in Section 2, the *Maverick* exhibits over-actuation in its horizontal motions. While this feature enables distinctive maneuvers such as pivoting around itself or executing parallel docking, it becomes less practical during stable sailing scenario where the vessel follows a continuous path without requiring significant maneuvers. Over-actuating the *Maverick* introduces complexities, necessitating the development of a thruster allocation algorithm to fully exploit the advantages of this setup. This poses challenges related to computational complexity, numerical sensitivity, verification and validation as indicated in Johansen and Fossen (2013). Moreover, this approach may lead to increased control effort, requiring more energy and exertion from the ac-

Fig. 3. Operational strategy: advancing with the stern thruster, steering with the bow thruster.

tuators to achieve the desired maneuvers. This heightened demand could accelerate wear and tear on the actuators, potentially leading to increased maintenance costs and reduced longevity of the vessel's propulsion system. As a result, while over-actuation offers unique maneuvering capabilities, its practicality in scenarios like stable sailing may be limited by these drawbacks. Instead, an operational strategy that restricts control freedom and constrains the *Maverick* to an under-actuated state is devised, as also visually demonstrated in Fig. 3.

The azimuth angle of the stern thruster is fixed at 0° — α_s^c , while its propeller revolutions per minute (rpm), n_s , ranges from 380 to 1030; The propeller rpm of the bow thruster is maintained at $1460 - n_b^c$, while its azimuth angle, $\alpha_{\rm b}$, ranges from -90° to 90° . The stern thruster generates thrust T_s with a fixed direction and changing magnitude, regulating the speed of the *Maverick*. The bow thruster produces thrust T_b with a constant magnitude and changing direction, regulating the heading of the *Maverick*.

3.3 Modeling Assumptions

According to Fossen's robot-like vectorial model for marine craft, Fossen (2011), the maneuvering equations of motion in six DoFs can be represented as:

$$
\underbrace{M_{\text{RB}}\dot{v} + C_{\text{RB}}(v)v}_{\text{rigid-body forces}} + \underbrace{M_{\text{A}}\dot{v} + C_{\text{A}}(v)v + D(v)v}_{\text{hydrodynamic forces}}_{\text{hydrodynamic forces}} \tag{1}
$$

Here, $\boldsymbol{v} = [u, v, w, p, q, r]^T$ denotes the generalized velocity vector in 6 DoFs, where the first three components (u, v, w) are the linear velocities in surge, sway and heave and (p, q, r) are the angular velocities in roll, pitch and yaw. Meanwhile, $\boldsymbol{\eta} = [x, y, z, \phi, \theta, \psi]^T$ denotes the generalized position and orientation vector accordingly. The matrices *M*RB, *C*RB represent the rigid-body mass matrix and coriolis-centripetal matrix, respectively. The matrix *M*^A accounts for the added mass, while the matrix C_A reflects the coriolis-centripetal effects caused by M_A . The damping matrix is denoted by $\mathbf{D}(\mathbf{v})$. The vector $q(\eta)$ includes gravitational and buoyancy forces and moments, while the vector q_0 encompasses the static restoring forces and moments due to ballast systems and water tanks. Finally, *τ* represents the vector of control inputs, and $τ$ _{external} accumulates all other external environmental forces and moments acting on the vessel.

The following assumptions were made to model the decoupled dynamic motions for the *Maverick* in this study:

- (1) The longitudinal position of the vessel's center of gravity is approximable to midship, given the symmetric shape of the hull.
- (2) The study considers maneuvering motions in the horizontal plane, neglecting pitch, roll, and heave motions. Sway motion is disregarded, considering the vessel sails mostly straight in a stable sailing scenario. Therefore, the investigated motions include surge and yaw, treated as decoupled from each other.
- (3) The dynamic behavior of the thrusters is neglected, assuming that the thrust magnitude is solely related to *n*.
- (4) As the experiments were conducted under calm weather conditions, all environmental forces and moments are excluded.

3.4 Decoupled Ship Dynamic Models

Given the modeling assumptions discussed in Section 3.3, equation (1) can be simplified to:

$$
(M_{\rm RB} + M_{\rm A})\dot{v} + D(v)v = \tau\,,\tag{2}
$$

where v is reduced to $[u, r]^T$. The expression of each matrix can be further written as:

$$
\mathbf{M}_{\rm RB} = \begin{bmatrix} m & 0 \\ 0 & I_z \end{bmatrix}, \ \mathbf{D}(\mathbf{v}) = \begin{bmatrix} -X_{uu}u & 0 \\ 0 & -N_r \end{bmatrix},
$$

$$
\mathbf{M}_{\rm A} = \begin{bmatrix} m_x & 0 \\ 0 & J_z \end{bmatrix}, \quad \boldsymbol{\tau} = \begin{bmatrix} T_{\rm s} + T_{\rm b} \cos(\alpha_{\rm b}) \\ T_{\rm s} \sin(\alpha_{\rm b}) x_{\rm b} \end{bmatrix} \tag{3}
$$

$$
= \begin{bmatrix} T_{nn}^{\rm s} n_{\rm s}^2 + T_{nn}^{\rm b} n_{\rm b}^{\rm c2} \cos(\alpha_{\rm b}) \\ T_{nn}^{\rm b} n_{\rm b}^{\rm c2} \sin(\alpha_{\rm b}) x_{\rm b} \end{bmatrix}.
$$

Here, *m* denotes the mass of the ship, while m_x represents the added mass in surge. The moment of inertia is denoted as *Iz*, and *J^z* represents the added moment of inertia. The coefficient for surge damping force is X_{uu} , and N_r denotes the coefficient for yaw damping moment. Coefficients associated with the thrusts generated by the stern and bow thrusters are represented by T_{nn}^s and T_{nn}^b , respectively. Additionally, x_b is the longitudinal coordinate of bow thruster position.

Separating the components, the speed model can be written as:

$$
(m + m_x)\dot{u} = X_{uu}u^2 + T_{nn}^s n_s^2 + T_{nn}^b n_b^c^2 \cos(\alpha_b), \quad (4)
$$

while the heading model can be written as:

$$
(I_z + J_z)\dot{r} = N_r r + T_{nn}^{\rm b} n_{\rm b}^{\rm c}{}^2 \sin(\alpha_{\rm b}) x_{\rm b} \,. \tag{5}
$$

By consolidating the unknown coefficients and known constants, equation (4) and equation (5) can be reorganized as:

$$
\dot{u} = k_1 u^2 + k_2 n_s^2 + k_3 \cos(\alpha_b), \qquad (6)
$$

$$
\dot{r} = k_4 r + k_5 \sin(\alpha_b),\tag{7}
$$

where,

$$
k_1 = X_{uu}/(m + m_x), k_2 = T_{nn}^s/(m + m_x),
$$

\n
$$
k_3 = T_{nn}^b n_b^{c^2}/(m + m_x),
$$

\n
$$
k_4 = N_r/(I_z + J_z), k_5 = T_{nn}^s n_b^{c^2} x_b/(I_z + J_z).
$$
\n(8)

Here, k has subscripts ranging from 1 to 5 denoting the unknown coefficients that need to be identified.

4. METHODOLOGY

The methodology is divided into Section 4.1, which explains the design of the experiments committed to collect data for identification, and Section 4.2, which introduces the identification method utilized for the experiment.

4.1 Experiment Design

To achieve high identification modeling accuracy, experiments must be carefully designed to appropriately excite the model. The performance of the identified model heavily depends on whether the excitation signal contains enough information of the system, as suggested in Zhang et al. (2022). Standard maneuvers such as $20^{\circ}/20^{\circ}$ and $10^{\circ}/10^{\circ}$ zigzag maneuvers, and 35° turning circle maneuver have been widely used in literature. However, it is important to note that these maneuvers were originally proposed to evaluate ship maneuverability of conventional rudderpropeller vessels, rather than providing data for identification modeling vessels with atypical actuation layouts.

Given the operational strategy detailed in Section 3.2, there are two controllable system inputs: n_s ranging from 380 rpm to 1030 rpm and α_b ranging from –90° to 90°. Two sets of experiments were designed with the aim of isolating each control input, studying how the system responds to variations in one control input while keeping the other one fixed:

Fig. 4. *Experiment I*: (a) n_s changing sinusoidally, α_b setting at neutral helm; (b) corresponding response of *u*.

- Fig. 5. *Experiment II***:** (a) α_b changing sinusoidally, n_s setting at 710 rpm; (b) corresponding response of *u*; (c) corresponding response of *r*.
- (1) **Experiment I**: Applying a sinusoidal input of n_s , while keeping $\alpha_{\rm b}$ constant at the neutral helm position, as depicted in Fig. 4(a). It is important to note that (i) α_b is not completely constant in order to keep the heading angle to 0° , and (ii) neutral helm is not set at 0°, due to the asymmetric steering behavior, as reported in Zhang et al. (2023). Fig. 4(b) shows the corresponding response of *u*.
- (2) **Experiment II**: Applying a sinusoidal input of $\alpha_{\rm b}$, while giving a constant n_s command, as shown in Fig. 5(a). Note that the measured n_b exhibits fluctuations along with the changing $\alpha_{\rm b}$, even with a constant command. Fig. $5(b)$ and Fig. $5(c)$ show the corresponding response of *u* and *r* respectively.

A bias can be observed in the response of *r* due to the asymmetric steering characteristic of the *Maverick*, as shown in Fig. $5(c)$. Equation (7) is modified accordingly by adding a bias term k_6 :

$$
\dot{r} = k_4 r + k_5 \sin(\alpha_b) + k_6. \tag{9}
$$

The heading model is only excited by $\alpha_{\rm b}$, whereas the speed model is excited by both of the control inputs. I.e., *Experiment II* is sufficient for the heading model construction while both *Experiment I* and *Experiment II* are needed for the speed model identification.

4.2 Identification Method

The unknown parameters in the decoupled models were identified using a bounded nonlinear least squares algorithm implemented with the *SciPy* package, Virtanen et al. (2020). The trust-region reflective method is used to solve the bound-constrained minimization problem, as formulated in Branch et al. (1999). The algorithm iteratively solves trust-region sub-problems augmented by a diagonal quadratic term and with the trust-region shape determined by the distance from the bounds and the direction of the gradient. The cost functions $E_{\hat{u}}(\theta_{\hat{u}})$ and $E_{\hat{r}}(\theta_{\hat{r}}, \beta_{\hat{r}})$ can be written as:

$$
E_{\dot{u}}(\theta_{\dot{u}}) = \sum_{i=1}^{i=\ell} E_{\dot{u}_i}(\theta_{\dot{u}})
$$
(10)

$$
= \sum_{i=1}^{i=\ell} \left(\dot{u}_i - \hat{u}_i (u_i, n_{s_i}, \alpha_{b_i}, \theta_{\dot{u}}) \right)^2,
$$

$$
E_{\dot{r}}(\theta_{\dot{r}}, \beta_{\dot{r}}) = \sum_{i=1}^{i=\ell} E_{\dot{r}_i}(\theta_{\dot{r}}, \beta_{\dot{r}})
$$
(11)

$$
= \sum_{i=1}^{i=\ell} \left(\dot{r}_i - \hat{r}_i (r_i, \alpha_{b_i}, \theta_{\dot{r}}, \beta_{\dot{r}}) \right)^2.
$$

Here, $\boldsymbol{\theta}_{\hat{\boldsymbol{u}}} = [k_1, k_2, k_3]^T$ and $\boldsymbol{\theta}_{\hat{\boldsymbol{r}}} = [k_4, k_5]^T$ denote the parameter vector of the speed model and heading model, respectively. The bias term of the heading model is denoted by $\beta_{\dot{r}} = k_6$, and ℓ represents the number of data samples.

5. EXPERIMENTAL IDENTIFICATION RESULTS

This section presents the modeling results of this study. Table 2 summarizes the identified model parameters.

Table 2. Identified model parameters.

Speed model		Heading model	
Parameters	Values	Parameters	$\rm Values$
k_{1}	-0.153	k_4	-0.52
k2	8e—8	k_5	0.085
k_{3}	0.23	k_{6}	0.009

With the identified models, predictions on surge speed and yaw rate can be generated by considering a given initial state and a continuous stream of control inputs:

$$
\dot{\boldsymbol{x}}(t) = \boldsymbol{f}(\boldsymbol{x}(t), \boldsymbol{c}(t)), \n\boldsymbol{x}(t+h) = h\dot{\boldsymbol{x}}(t) + \boldsymbol{x}(t).
$$
\n(12)

Here, $\boldsymbol{x}(t)=[u(t), r(t)]^T$ is the state vector and $\boldsymbol{c}(t)$ = $[n_{s}(t), \alpha_{b}(t)]^{T}$ is the control vector at the current time step. The function $f(\cdot)$ composes the right-hand side of (6) and (9). The state vector at the next time step, $x(t+h)$, is determined using the Euler Forward method with a time step length of $h = 0.1$ s. Furthermore, predictions on vessel position and heading at each time step can be calculated using:

Fig. 6. Control inputs of the manually executed waterwayfollowing maneuver.

Fig. 7. Model verification results: Comparisons between measurements and 20-second-ahead model predictions over a 100-second timescale for (a) u ; (b) r ; (c) trajectory of the vessel.

$$
\begin{aligned} \dot{x}(t) &= u(t)\cos(\theta(t)), \ \dot{y}(t) = u(t)\sin(\theta(t)), \\ \dot{\theta}(t) &= r(t). \end{aligned} \tag{13}
$$

Finally, to verify the model performance under both of the control inputs, a manually executed waterway-following maneuver was recorded as the data source for comparison. During this maneuver, n_s and α_b changed simultaneously, as shown in Fig. 6, creating an arbitrary combination of excitation for both surge and yaw motions. Fig. 7 presents the comparisons between measurements and 20-secondahead model predictions over a 100-second timescale. We can observe that the identified models accurately predict the motion responses induced by the control inputs. Regarding the trajectory prediction shown in Fig. $7(c)$, the 10-second-ahead prediction demonstrates high accuracy. However, beyond the 10-second mark, the accumulated error becomes more noticeable, leading to slight deviations from the measurements. The results underscore that, within the previously defined stable sailing application scenario, the minor sway motion can be reasonably neglected without significantly impacting the accuracy of trajectory prediction.

6. CONCLUSIONS

This paper models the surge and yaw motions of the *Maverick* within the stable sailing scenario, adhering to the operational philosophy of using the stern thruster for advancement and the bow thruster for steering. Accordingly, modeling assumptions and decoupled model structures are specified. Furthermore, to identify the unknown parameters, two sets of sinusoidal excitation maneuvers, each isolating a control input, were conducted to collect data. The identification process is performed using a bounded nonlinear least squares algorithm. The identified models are validated on the sinusoidal excitation maneuvers first and then verified on a manually executed waterway-following maneuver. The modeling results demonstrate that the proposed models are capable of predicting the vessel trajectory accurately. The reasonable modeling simplifications we made, together with the informative experiment design for data collection, contribute to a pragmatic solution for *simple sailing* of the *Maverick*.

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