

A Review of Current Research and Advances in Unmanned Surface Vehicles

Xiangen Bai¹, Bohan Li¹, Xiaofeng Xu¹ and Yingjie Xiao¹

Received: 19 March 2022 / Accepted: 12 June 2022

© Harbin Engineering University and Springer-Verlag GmbH Germany, part of Springer Nature 2022

Abstract

Following developments in artificial intelligence and big data technology, the level of intelligence in intelligent vessels has been improved. Intelligent vessels are being developed into unmanned surface vehicles (USVs), which have widely interested scholars in the shipping industry due to their safety, high efficiency, and energy-saving qualities. Considering the current development of USVs, the types of USVs and applications domestically and internationally are being investigated. USVs emerged with technological developments and their characteristics show some differences from traditional vessels, which brings some problems and advantages for their application. Certain maritime regulations are not applicable to USVs and must be changed. The key technologies in the current development of USVs are being investigated. While the level of intelligence is improving, the protection of cargo cannot be neglected. An innovative approach to the internal structure of USVs is proposed, where the inner hull can automatically recover its original state in case of outer hull tilting. Finally, we summarize the development status of USVs, which are an inevitable direction of development in the marine field.

Keywords Unmanned surface vehicle; Maritime supervision; Intelligent vessel; Ship automation level; Internal structure; Shipping industry

1 Introduction

The development of autonomous control technologies in recent years has seen scholars constantly improving the research status of unmanned control technologies in industrial

automation, ground transportation, military, air, and maritime activities. For example, unmanned ground vehicles and wheeled robots are widely used in industrial automation, warehouse management, space material detection, lunar rovers, rescue missions, intelligent transportation, and military operations (Arai et al., 2002; Farinelli et al., 2004; Yuan et al., 2007).

In terms of ships, the development of the world economy has to date resulted in the use of various levels of technologies that are gradually increasing in complexity and are constantly developing to facilitate greater specialization. Under the umbrella of big data, with the development of ship sensor technologies and other computer sciences, normal ships will eventually become intelligent unmanned surface vehicles (USVs).

Many scholars have researched the hull structures of USVs, in addition to information acquisition, independent decision-making and other aspects. However, there are some loopholes in the international regulation of USVs. A particular point of concern is the fact that there will be no sailors onboard; therefore, USVs must be stable and have a higher level of intelligent technology support to ensure its safety while under way.

In this paper, the automation level of USVs, the research status of USVs, an existing model, and key technologies of

Article Highlights

- Existing applications and models of unmanned ships are evaluated by literature review. At the moment, most of them are small and are used to measure some needed data, and large unmanned vessels are still in the development stage.
- The maritime supervision of unmanned surface vehicles (USVs) is discussed. Old regulations do not meet the profile of unmanned vessels.
- Three key technologies are reviewed, i.e., USV information collection, USV motion model and control, and USV path planning and navigation stability.
- Finally, the design trend is analyzed for USV internal structure, which enables cargo to be stored independently and ensures the stability of the cargo transported during the ship's navigation.

✉ Xiaofeng Xu
xfxu@shmtu.edu.cn

¹ Merchant Marine College, Shanghai Maritime University, Shanghai 201306, China

USVs are summarized. The gaps in the regulation of USVs are highlighted and a proposal for the internal structure design of USVs is presented.

2 USV Necessity and automation

2.1 Necessity for USV development

Following advances in the electronic and electrical industries, the information technology capabilities of ships have improved significantly. However, maritime traffic must consider more factors than land traffic when operating in their respective environments. Emergencies easily occur when ships are at sea, such as when failed electrical equipment cannot be repaired in time, the ship may not have enough power to avoid bad weather, the crew's safety may be put at risk, and the ship may suffer structural damage, all of which will cause economic losses.

The sea environment is changeable and harsh. If there is a problem in the reception of the ship's positioning signal, it is easy to deviate from the intended course and waste large quantities of fuel. This will put the ship in danger and threaten the safety of the crew, with possible economic loss.

To solve the shortage of crewed ships and promote the use of science and technology in shipping, the development of ships toward more advanced and intelligent autonomous control using independent collection of surrounding environmental information, route design, and route planning can be achieved. These ships can also be used to perform work in areas where humans cannot reach.

2.2 USV automation definitions

Both USVs and traditional ships have floating capacity, they maneuver on water, can be used for transporting persons or goods or both, and are engaged in maritime navigation (Xu et al., 2021). The USV uses a variety of sensor technologies to obtain information about the marine environment around the ship. An autonomous system is used to control the ship instead of its crew's skills. Ships' autonomous systems were defined by the International Maritime Organization (IMO) at the 99th Maritime Safety Committee Conference held in 2018 as systems that use artificial intelligence or computer programs to manage and control ship functions independently of personnel supervision and control (Sun et al., 2020). USVs were defined as ships that can operate with varying degrees of crew control.

2.3 USV automation level

Ship automation is divided into seven levels, i.e., AL0-AL6, in Wrobel's (2016) Ship Right Program Guide (Krzysztof et al., 2018; Wrobel et al., 2018). In an article published by the Norwegian Forum for Autonomous Ships,

Rødsethø (2017) divided the level of ship autonomy into four categories. A Danish Maritime Authority (DMA) report (2017) mentions four levels of autonomous control for ships, including M, R, RU, and A levels.

In 2017, the Industry Code for Design, Construction and Operation of Autonomous Maritime System was issued by the Maritime Autonomous Systems Regulatory Working Group (MASRWG), which divided ships' autonomous control into six levels in terms of control behavior ability (MASRWG, 2017). The Guidelines for Autonomous Shipping (Bureau Veritas 2017) divided autonomous control into five levels. At the 99th Maritime Safety Committee Conference, the IMO adopted the ship autonomy levels from the DMA's analysis report (Zhou et al., 2019).

The IMO made a preliminary definition of ship automation level based on mass divided into four levels: Level 1: some operations are autonomous; Level 2: remote control and partial crew control; Level 3: fully remote controlled; and Level 4: fully autonomous control.

Scholars currently mainly focus on shore-based remote control of autonomous ships by obtaining their navigation status using signal transmission data. Autonomous unmanned ships are expected to sail by themselves with the help of artificial intelligence. Further research into these two fields of interest is needed.

3 Research status of USVs

3.1 Existing USV studies

Scholars are increasingly studying USVs as a new product area. In terms of intelligent operation and maintenance, Yang (2015) analyzed USVs with ship or shore-based systems. Wu (2017) described the research status, advantages, existing problems, and technical difficulties of USVs. Liu (2021) analyzed the stability of power plants, navigation technology, automatic obstacle avoidance, and development trends, advantages, and problems.

In terms of unmanned technology, Fu (2015) combined ground unmanned technology to analyze unmanned ship systems. Gong and Ji (2016) analyzed ship identification and tracking technology and proposed requirements for functions and technologies for autonomous control. Ye (2017) analyzed the technology, advantages, and characteristics of autonomous control. Su et al. (2018) analyzed USVs' perceptive technology, supervision, and path planning.

In terms of USVs' technical framework, Wang et al. (2018a) established the overall architecture based on e-Navigation applications and proposed a maritime cloud-based network framework. Liu (2021) designed a hardware system, a sensor-sensing module, a control system circuit, and a heading control system workflow. Lv et al. (2021) proposed a distributed model using predictive control method based on an

extended state observer to realize distributed formation tracking control for underactuated USV collision avoidance.

Sun et al. (2021) used delay compensation and normal distribution of a control set to balance the contradiction between calculation and guidance accuracies, and collision avoidance guidance and control based on adaptive sliding model control theory, which was adapted to resist the influence of strong disturbance and realize collision avoidance guidance and control of the boat.

3.2 Application and model of foreign USVs

At present, USVs are mainly underwater robots, small sub-marines, or small surface boats. USVs with higher intelligence still must be crewed. Most USVs are used for ocean information collection, sample collection, measurements, or special military missions. The lengths of small USVs are about 2–5 m and their speed in quiet water is about 40 kn. They are lightweight and can only carry a small amount of goods. The related technology is relatively mature for small USVs (United States Navy 2007). Most large USVs are still in the development, construction, or testing stages.

In 1898, Tesla registered wireless control technology and demonstrated a robot ship to the public. This was considered to be the first unmanned ship.

In 1961, the “Jin Hua Shan Wan” bulk carrier was built in Japan with centralized cabin control and remote control.

In the 20th century, the United States (US) developed USVs to realize the functions of maritime target searching and monitoring (United States Navy, 2007). Vasudevan and Baskaran (2021) used USVs to provide relevant data support for water-quality detection.

Israel, which is the second leading country in USV technologies after the US, built the Protector USV during the early 21st century and troops have now been equipped with it (Chen, 2019).

In April 2016, Finland Rawls announced that the Advanced Autonomous Waterborne Applications Initiative would be used and tested on Stella.

The Microtransat Challenge was launched in 2005, where unmanned vessels attempted to cross the Atlantic. More than 20 boats sank up during the challenge. However, an unmanned vessel named SB Met left Newfoundland, Canada on June 7th and arrived in Northern Ireland on August 26, 2018.

Campbell et al. (2012) described the Measuring Dolphin (MESSIN) developed by the University of Rostock in Germany. The Italian Institute of Intelligent Automation Systems developed an autonomous catamaran called Charlie for collecting sea surface samples (Bibuli et al., 2008). As shown in Figure 1(a), the Springer USV was built by the University of Plymouth, UK, for environmental and hydrological surveys of coastal waters.

As shown in Figure 1(b), the US placed weapons on their USVs and piloted a new unmanned antisubmarine ship which named Sea Hawk in 2016. Table 1 presents a timeline of

applications and types of foreign USVs



(a) Springer (S. Campbell et al. 2012)



(b) Sea Hawk (Cao et al. 2018)

Figure 1 USV model

Table 1 A timeline table of application and model of foreign USV

Time	Creator	Country or institution	Application or model of USV
1898	Nikola Tesla	USA	-
1961	-	Japan	Jin Hua Shan Wan
20th century	-	USA	Maritime target searching and relevant data support for water quality detection
Early 21st century	-	Israel	Protector USV
2016	-	Finland Rawls	AAWA project used on Stella USV
2016	-	USA	Sea Hawk
2018	-	Canada	SB Met
-	-	University of Rostock	Measurement dolphin
-	-	Italian institute of intelligent automation systems	Charlie USV
-	-	University of Plymouth	Springer USV

3.3 Application and model of domestic USV

Compared with China, foreign research on USVs began at an earlier stage during World War II. The technology developed rapidly during the Cold War between the US and the then Soviet Union. Although China started USV research late compared with the rest of the world, Chinese developments have gone from the conceptual phase to practical applications.

In 1985, the Hudong Shipyard built a container ship called the Berlin Express, which was equipped with automatic navigation and other intelligent systems and equipment. Yunzhou designed the first USV for environmental measurement in addition to the first stealth USV in China. Developed by Shenyang Xinguang Company, the USV Tianxiang I was used to provide meteorological information for the Qingdao Olympic Sailing events at the Beijing Olympic Games. From 2009 to 2018, the USV research group of the First Institute of Oceanography of China had developed two “Jiu Hang” series USVs (Cao and Wang, 2018). Zhao et al. (2021) used the ESM30, which is a small USV with sensors, to sample and analyze the water quality of the inland river in Zhangpu Town in Kunshan City (Figure 2). Ning (2021) used an unmanned measuring ship to measure underwater terrain in the downstream of the Fen River Reservoir in Shanxi. A timeline of applications and types of domestic USVs is presented in Table 2.



Figure 2 Esm30 USV

Considering the above USVs types, China is relatively new to USV development compared with foreign countries because most foreign developers had begun their research on technologies related to USVs considerably earlier than China.

4 Advantages and problems of USV

In the future, USVs are expected to be an important part of the ship industry. Considering hull construction, ship operations, and other businesses, the application of USVs has changed the ship industry greatly. In addition, if all classes

Table 2 A timeline table of application and model of domestic USV

Time	Creator	Country or institution	Application or model of USV
1985	-	Hudong Shipyard	Berlin Express
-	-	Yunzhou	The first USV for environmental measurement and the first stealth USV
-	-	Shenyang Xinguang Company	Tianxiang I
2009-2018	-	The First Institute of Oceanography	Jiu Hang
2021	Zhao Tongsheng	-	Water quality sampling
2021	Ning Xinlong	-	Measurement of underwater terrain

of ships were replaced by USVs, hundreds of sailors would be out of work. However, the shipping industry would experience a boom period.

4.1 USV advantages

Compared with crewed ships, USVs have obvious advantages because they are equipped with more intelligent equipment in communication, observation, perception, computing, and other aspects, and they can improve the safety and reliability of ships' navigation.

Crews are no longer required with USVs, which can save labor. Space is usually restricted on USVs; therefore, many ships cannot carry recreational facilities or have wireless networks. Crew life at sea is monotonous and it is easy to suffer from mental illness. In addition, crews cannot meet their families for a long time and staying away from land makes it difficult to recruit sailors, which is a big problem for shipping companies.

Thus, USVs solve a major problem for shipping companies because they do not need crew to work onboard, which reduces the cost of crewing ships. Unmanned ships do not need as many lounges and other cabins as crewed ships, which would not only free up space for more cargo, but can also reduce the weight of the ship, make the ship more flexible and easier to control, and reduce the fuel required for propulsion to achieve energy-saving and consumption-reduction benefits.

Intelligent route design is used to automatically plan global and local routes, where the control system automatically controls the ship according to the route planning, which reduces the energy loss resulting from human control.

Autonomous control technologies adopt sensor information fusion, which integrates the information collected by different sensors to compensate for each other's shortcom-

ings, provide more accurate information, and detect ship obstacles that may have been missed by the crew. Therefore, the safety and reliability of ship navigation is improved. When USVs encounter storms, collisions, or other unsafe events, the absence of a crew removes the risk of crew safety or losses.

The uniquely designed structures of USVs' usually do not provide pirates with opportunities to board the ship. Host computers are installed within a closed space and cannot be accessed by pirates to take control of the USVs. In the event of an attempted attack, the host computer can also automatically control the ship to slow down until surveillance ships or intervention forces arrive. The absence of a crew again reduces the risk of harm because pirates cannot take any crew members hostage.

4.2 Problems caused by USV application

Although USVs use intelligent equipment, which improves the ship's intelligence level, its service efficiency, and its safety, problems may result from their operations.

For example, the relevant regulatory provisions and definitions for USVs are not suitable for existing international maritime conventions. Most international maritime conventions were established for crewed ships and cannot be applied to USVs and must be modified. Therefore, the large-scale application of USVs involves the modification of complex maritime treaties, which will be described in detail in Section 4.3.

USVs no longer need large crews, which leads to the development of the professional abilities of crew members toward integration and higher technical requirements (Liang et al., 2018; Wang et al., 2021a). By the end of 2020, China had 1.716 million seafarers on duty. If USVs replace crewed ships, most of the crew will be laid off as a result. This enormous number of redundant crew will become a serious problem and provisions must be made to employ them elsewhere.

USVs automatically collect and process information, plan paths, and transmit the data back to shore-based monitoring stations. Whether this method is safe, how the shore-based personnel find the ship when the USV signal is lost, in addition to issues such as information interaction, anti-interference, real-time data transmission problems, and communication priority strategies, must be considered.

At the same time, there is discussion on whether USVs should comply with the Convention on the International Regulations for Preventing Collisions at Sea (COLREGS). In the USV collision avoidance system, some obstacle avoidance algorithms do not consider the COLREGS. If there are no standardized rules for USVs, however, they may disturb the order of maritime navigation and bring some difficulties to the regulation and oversight of sea ship navigation.

4.3 USV maritime supervision

Both USVs and traditional ships are controlled during navigation at sea. Most developed USVs are small and managed by the operating country to which they belong (Sun and Cai, 2020). Thus, each country can develop their own management system for USVs according to their level of USV technology research and the operating USV technologies. However, if USVs sail in other countries, conflicts may occur due to regulatory differences between countries. Most international maritime conventions and domestic legislation are based on crewed ships and some clauses are contrary to the characteristics of USVs or even lack provisions for certain USV-specific aspects.

Xu and Zhang (2017) analyzed the oversight problems brought by the application of USVs to maritime authorities and pointed out that the legal regulations for USVs are lagging behind the rate of USV technology development. In terms of legislation, Xu and Zhang (2017) suggest that the experience of unmanned cars and unmanned aerial vehicles (UAVs) can be referenced to revise or add new legal regulations for ship crews, collision avoidance, ship structures, and other international conventions. Cooperation between countries should simultaneously be strengthened and matching conventions should be formulated as early as possible, which is a necessary requirement for the effective regulation of USVs.

Zhang et al. (2020) analyzed the issue of whether USVs can be considered as ships and their links with the flag state by combining the United Nations Convention on the Law of the Sea (UNCLOS), Considering the Safety of Life at Sea Convention (SOLAS), and the Convention on Standards of Training, Certification and Watchkeeping for Seafarers. However, this paper analyzes whether legal regulations on ship construction, lifesaving equipment, navigation, crews, and training among others are applicable to USVs. The findings show that the current conventions are also applicable to USVs and corresponding adjustments to the existing convention framework can be made according to the characteristics of USVs.

SOLAS stipulates that "each flag State shall furnish a ship with qualified crew according to its own minimum manning requirements," which is obviously contrary to USV features. In normal mode, a low-grade unmanned ship has no crew to work (Tasikas, 2004). Fully autonomous ships are completely controlled by their own intelligent computers. To some extent, the SOLAS Convention does not apply to USVs, and some clauses must be modified. However, Chapters II-1 and II-2 can be applied to USVs, where the monitoring, sensing alarms, and safety operating systems are located in the shore-based control center, which is referred to as the ships' cab. Chapter III of the Convention should be changed to reduce the use of unnecessary USV lifesaving equipment and increase the availability of rescue equip-

ment. In Articles 4, 9, 12, and 13 of Chapter V, the supply and technical modes of ship service must be transformed into automatic and intelligent modes. Considering the requirements for crew safety mentioned in Chapter V, the IMO considered a minimum crew level related to the ship's level of automation and the degree of shore-based assistance for the ship. Corresponding provisions should be made by USV development status associations and other organizations.

Most international shipping regulations currently only apply to ships with a gross tonnage of at least 500 tons (McLaughlin, 2004). Comité Maritime International issued a questionnaire on whether a USV is a ship, including an unmanned cargo ship with a gross tonnage of more than 500 tons, which constitutes a ship in domestic law. The analysis of the collected results shows that the UNCLOS and the domestic laws and regulations of most countries do not deny that USVs are classed as ships.

If USVs are not identified as ships, they are not bound by international shipping laws and regulations, and could then sail freely at sea, which will cause interference to ships sailing in a standard way and their operators may have difficulties related to IMO participation and international oversight (Fraser, 2011). In particular, when a USV sails in narrow waters, and if the existing regulations cannot be strictly observed, it is easy to disrupt the normal navigation order, which will pose a risk to the safety of other ships that sail in the same waters.

Most marine accidents are caused by human factors. In theory, adopting unmanned technology could reduce accidents by two-thirds. However, the number of traffic accidents involving unmanned cars make people doubt the maturity of unmanned technology. In addition, criminals may attempt to control an unmanned ship by hacking the ship's computer systems and using the ship to transport prohibited substances.

Hence, SOLAS and other conventions may be incompatible with USVs because of the following:

- 1) Different countries have achieved different levels of USV research and development; therefore, it is difficult to set uniform regulations.
- 2) The automation levels of ships sailing at sea differ.
- 3) USV technology is developing and is updated rapidly.
- 4) Many regulations and conventions must be modified, which may take a long time to accomplish.

USVs are currently not excluded from the definition of ships in SOLAS, COLREGS, and other international treaties. However, there are challenges for USVs based on the crew-related requirements (Li et al., 2019). There is no doubt that the transformation of crewed ships into USVs is a large transition with significant differences in the features of the different ships. As a result, conventions established by referring to crewed ships must largely be revised.

5 Key USV technologies

5.1 Automatic collection of environmental information

Ships sail in a complicated and changeable ocean environment; therefore, it is very important that their surrounding environmental information be obtained and identified, including not only the weather, other ships, large marine garbage, islands, underwater reefs, suspended marine garbage under the water surface and other obstacles, but also channel water levels, ship traffic volumes, and other information. Yin et al. (2020) proposed building a monitoring tower to establish a wired fiber backbone network for the whole waterway to obtain water levels and equipment status.

Information collection previously used a single sensor to obtain information about objects on the surface or underwater. Marine radar is the most common device used for navigation and obstacle avoidance of ships because it can obtain information over a large distance. Based on visual water surface target detection, Yang et al. (2015) designed a water surface target detection, recognition, and tracking system using deep learning and segmentation detection. However, the visual sensor's recognition performance is significantly reduced in bad weather, such as heavy rain.

Because each sensor has certain deficiencies, a variety of sensor information fusion technologies were proposed, which use the information from sensors in different external effective environments and optimizes it using information processing technologies to obtain a more accurate and reliable result (Xu, 2020; Yang, 2020). Bar-Shalom, Willett, and other foreign teams, such as Qin Yongyuan from North-western Polytechnical University and Deng Zili from Heilongjiang University in China, made significant contributions to information fusion technology and promoted the development of relevant technologies (Peng et al., 2013; Yang et al., 2015). Jiang and Mekonnen (2013) used a federated Kalman filter to complete the information fusion.

Tuan et al. (2018) analyzed the feasibility of accurate positioning in cities by using closely coupled integration of information from GPS/BDS/GLONASS RTK/INS, and proposed strategies of AR and Kalman waves, to solve unusual values in the measured information. However, with long power outages, it is difficult for GNSS to reach centimeter-level accuracy and there is no acceptable solution for multipath errors.

Dai (2019) used clustering and Gauss-Kruger projection to find spatiotemporally identical data for AIS and radar. A fuzzy mathematics algorithm is used to find the required data for the target ship and a weighted fusion algorithm is used to assign weights for two kinds of data to achieve the purpose of data fusion. Zuo and Zhong (2017) solved the asynchronous multirate problem in fusion technology by using a multiscale system modeling method. M.J. García-Ligero et al. (2015) proposed a fusion algorithm of a distributed

weighted robust Kalman filter, and a sequential fusion algorithm proposed by Lin and Sun (2016), which solved the problem of noise correlation that is easily ignored in information fusion (Lu et al., 2017).

Following the continuous research on information fusion technology, this technology has moved from theoretical research to practical application and has been applied to small USVs to collect information about their surroundings. The relevant multi-sensor technology is currently relatively mature.

5.2 Ship motion model and control

The motion control of a USV is a technical challenge because the marine environment is complex and ships are prone to be troubled by environmental factors such as waves, strong winds, and ocean currents when operating at sea. Wide swings, large angle rolls, and other situations lead to large yaw disturbances. In addition, unstable headings also present challenges. Large swings could lead to ships capsizing (Pu et al. 2020). Therefore, it is necessary to build a more comprehensive and accurate ship kinematics model to achieve ship motion prediction and compensation in advance.

A ship kinematics model is divided into linear global response and nonlinear separation models (Wang et al., 2021b). Do et al. (2004) established a six degrees of freedom (DOF) USV motion mathematical model for waves, swaying, and yawing motion, which ignores wave, wind, and ocean current effects. The 6-DOF model of ship motion is shown in Figure 3. In the sea, the roll, pitch, and heave are usually neglected. Nan et al. (2022) analyzed the vessel 3-DOF and its mathematical model can be expressed as follows:

$$\begin{cases} \dot{p} = R_{\psi}(\psi) v_r + V_c \\ \dot{\psi} = r \end{cases}$$

The R_{ψ} is a rotation matrix, which is expressed as follows:

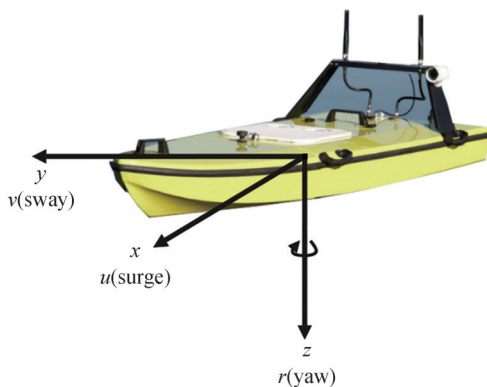


Figure 3 Definition of surge, sway and yaw modes of motion

$$R_{\psi}(\psi) = \begin{bmatrix} \cos\psi & -\sin\psi \\ \sin\psi & \cos\psi \end{bmatrix}$$

Based on this model, the control objectives for autonomous mobile vehicle (AMV) paths moving on a two-dimensional plane were set and the guiding method to be followed for single and multiple AMVs were described. McCue (2016) and Fossen (2011) added environmental factors outside the ship into the 6-DOF motion and constructed a nonlinear motion model. Based on a 3-DOF vessel model, Nan et al. (2022) described two estimation methods for achieving high-performance motion control, that is, disturbance observers and extended state observers, and analyzed the applications of the above two estimation methods for trajectory tracking, path following, and formation control of fully actuated AMVs.

Li et al. (2022) designed a position control law and stabilized attitude errors using an attitude controller, which is based on the 3-DOF model of UAVs and the 6-DOF model of USVs. From these two methods, a robust adaptive neural cooperative control algorithm was proposed to realize the cooperative motion of UAVs and USVs.

Zhang et al. (2021) presented a robust adaptive neural control algorithm for wing-sail-assisted vehicles. By adopting multiport event-triggering, the computing load and the occupancy of the channel from the sensor to the controller was reduced. Two learning parameters were designed to compensate for uncertainty in the gain function. Compared with the existing algorithms, the control and adaptive laws were triggered when the state error event-triggered rule was satisfied. The algorithm is comparable with the traditional RBF-NNS. Although it can improve the simplicity and reduce the burden, it is not a simple task to compress information about weights into a norm-based parameter. Li et al. (2021) used a proportional integral sliding mode manifold to stabilize the state errors calculated according to the heading and yaw subsystems.

Considering the uncertainty resolving system and the influence caused by external disturbances, an event-triggered mechanism was designed in addition to a hyperbolic tangent function to make the input change smooth and satisfy the input saturation constraint. Based on these functions, an event-triggered robust adaptive control law was designed. Through the established kinematic model, the ship's real-time roll, pitch, speed, and other information are obtained. Combined with the size and direction of wind, waves, and current, the ships restore torque, resistance, and their own characteristics are used to predict the ships' possible motion. Following calculations, motion compensation is performed in advance to ensure that USVs will not stall and buckle when sailing at sea.

A multi-degree-of-freedom mathematical model benefits more accurate path planning because it results in path planning that is closer to the actual situation. The control of un-

manned ships is currently developing from controlling a single ship to controlling multiple ships. Peng et al. (2021) described the structure and method of motion coordination control for multiple autonomous surface vehicles (ASVs) and the latest progress of motion coordination control in the Tactical Air Command Center.

5.3 Independent planning of ship route

Route planning is a very important research topic in USVs. The curves or sequence points between the starting point and destination can be regarded as the path and path planning is the strategic method to formulate routes for navigation (Xie et al., 2020). Autonomous robot path planning is similar to route planning for USVs. However, due to the characteristics of the marine environment and the ship itself, the existing robot path algorithm must be improved to be applied to USVs (Zhou, 2020).

Considering local paths, Lee et al. (2004) improved the artificial potential field using fuzzy reasoning and realized obstacle avoidance path planning with COLREGS under typical ship meeting situations. Based on COLREGS, Cheon et al. (2018) realized an optimal path-planning method that used variable space search and a fuzzy reasoning algorithm. Wei et al. (2018) used sensing parameters to determine the direction of obstacle avoidance and designed a forward prediction method for USVs' local obstacle avoidance based on vector field histograms.

Wang et al. (2018b) established an action space containing eight discrete actions, established a nonlinear incentive function with the ship distance from the target point and the obstacle point as the threshold, and adopted strategy to assign selected probabilities for actions with different reward values. A path-planning algorithm based on Q-learning reinforcement learning was also proposed, which considers fewer ship discrete actions and has a slower convergence speed and more iterations.

Wu et al. (2012) aimed at the difficult design of state and action spaces in dynamic environments, and the traditional deep Q-network (DQN) algorithms, which exploit the situation of overestimating the Q value, and established a dueling Q-network autonomous navigation and obstacle avoidance (ANOA) algorithm based on the DQN algorithm. Using a constructed 6-DOF model of the ship, ANOA establishes state-value and action dominance functions to evaluate the Q value and reduce the DQN coupling. The ANOA algorithm was specifically used to deal with path planning in a dynamic environment. However, the influences of wind speed and direction on the planned path were not considered. Yang and Zhao (2018) reduced the degree of collision risk and loss function values by improving the simulated annealing algorithm.

In global path planning, Xue et al. (2018) used a particle swarm optimization algorithm to solve path nodes in the face of static obstacles. Based on the improvement of the genet-

ic algorithm, Sun (2016) used the Bézier curve to optimize the path turning points and established a global path-planning algorithm. Meanwhile, a local path-planning algorithm based on velocity resolution was used for dynamic obstacle avoidance, but the interface between global and local path planning in the simulation process, as well as in some qualifications, such as vessel speed and acceleration, must be optimized further.

Hu et al. (2017) used a multi-objective optimization method based on risk discrimination to realize global and local ship path planning that conformed to COLREGS requirements.

Lin (2020) proposed the D* algorithm, which adopted the ship domain model by Fujii Ra to realize path planning in static and dynamic environments. Liu (2014) combined methods using a potential field and dynamic raster to create a potential field dynamic raster method with a simple structure that was easy to realize. The dynamic refinement of the raster accurately modeled environmental information using an improved potential field method with reduced path fold processing, reduced path nodes, and reduced computational complexity to achieve better global planning results. However, this paper does not consider the influence of hydrometeorological factors, such as wind and wave flow, on path planning when modeling.

Yan et al. (2021) established an USVs ANOA (UAN-NOA) algorithm with 13 discrete actions. The UANNOA algorithm established reward functions in terms of collision occurrence, relative position to the target point, and roaming. Based on a double DQN, the algorithm incorporated a gated recurrent unit network to increase the memory capacity of previously perceived information. This algorithm achieved path planning for dynamic and static obstacles, but only considered the rudder angle and did not consider propulsion changes.

There is more dependence on the known environmental information in global path planning, which cannot start in time when facing dynamic obstacles. Most local path-planning methods consider DCPA, TCPA, or data collected by sensors, such as laser radar, to determine whether USVs must avoid obstacles. However, using local path planning alone will easily lead to ships being unable to restore their routes; therefore, path-planning algorithms generally adopt a combination of global and local paths.

Ship path-planning algorithms favor machine learning, reinforcement learning, and deep reinforcement learning, among other algorithms, which have a higher accuracy than the traditional algorithms because they can learn by themselves and search for an accurate path faster when facing a real situation. Most learning algorithms applied in the field of ship path planning currently set the ships' speed to a fixed value and do not consider the influence of wind, waves, and currents on the path planning. Therefore, path-planning algorithms cannot be applied to actual navigation. In addition, the paths created by many algorithms are not rounded

enough and lack a certain continuity, which is not in line with vessel motion trajectories. Future research will focus on these points in vessel path planning.

5.4 Navigation stability

The stability of USVs sailing at sea includes aspects, such as signal strength, power units, and equipment self-tests. USVs adopt unmanned design concepts; therefore, the security of signal transmission is an important problem. USVs use specific signals to transmit all data to prevent being intercepted by pirates while navigating. Accessible signal information would enable interceptions of USVs by calculating the relevant information and sending error guidance information to USVs.

Unmanned USVs are not crewed; therefore, a highly stable propulsion system is essential for USVs to keep sailing in contrast to land traffic where continuity of security can be provided. In the marine environment, the nature of ocean transportation is such that when a ship's power plant fails at sea, it will be difficult to provide maintenance in a reasonable time. Therefore, it is important to inspect USVs before beginning the navigation to ensure the stability of the equipment during navigation.

6 USV internal design outlook

Although USVs' intelligent systems are updated constantly, the protection of cargo has not changed much. USVs' cargo holds are not under constant surveillance and if one section of the cargo hold has leaked, caught fire, or suffered some other type of damage, it is likely that other cargo sections and the vessel's navigation will also be affected. In addition, bad weather at sea may tilt ships and their cargo may be affected by accidents.

Large USVs are generally used for international cargo transport; hence, their routes are characterized by long distances and long voyage times, and the cargo should not move or be handled during the voyage. Based on these characteristics, a raster design is generally used for the hold of a large cargo ship, such as an inner hull grid structure. For different types of cargo carriers, different clapboards are used for each compartment, such as fire and anticorrosion barriers. Hence, if the cargo in one compartment spontaneously combusts or suffers leakage, it will not interfere with the other cargo because they are in separate compartments. If a fire occurs, a closed cargo hold helps to extinguish the fire.

Enclosed compartments can protect the cargo from corrosion by the elements, such as high salinity in the sea air. Fixtures can also be provided in the cargo holds, which can automatically activate to secure the cargo when the cargo hold is closed to prevent the goods from colliding within the cargo hold when the ship sails in strong winds, high waves,

or other bad environmental effects that may lead to the hull shaking violently. Figures 4 and 5 show longitudinal and traverse hull sections, respectively.

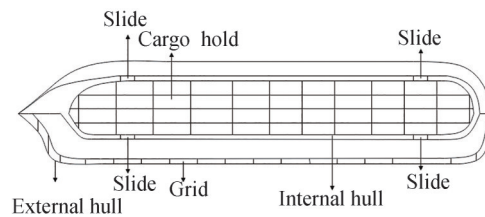


Figure 4 Ideal USV longitudinal section

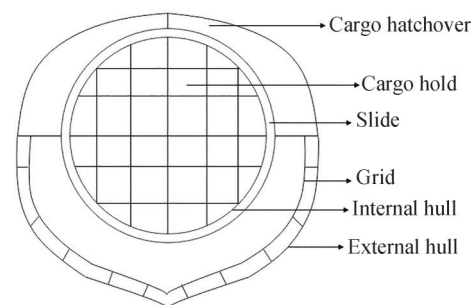


Figure 5 Ideal USV cross section

The hull of USVs can be designed as an internal and external double hull structure, where the outer hull can be a lattice so that when a hull collision does occur, only the damaged part of the grid is flooded, which will enable USVs to still have enough buoyancy to keep sailing.

A further design concept is the adoption of a slide contact between the interior and exterior of the ship's hull. Considering the internal hull, enough weight is put on the lower part so that the center of gravity of the inner hull is closer to the lower part, thereby increasing the stability of the hull. The hull tilts when it is disturbed by strong winds, high waves, and other environmental effects; therefore, the location of the internal hull's center of gravity designed to not be in its center, which produces a restoring torque. This is achieved by relying on the slide and the characteristic of its low center of gravity to restore the inner hull to its original state within the outer hull. In Figure 6, the ship tilts 20 degrees to the right while the center of gravity of the internal hull is on the left side of the internal hull rather than in

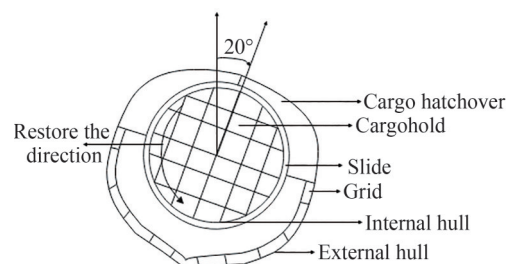


Figure 6 USV under rolling condition

a vertical direction. Gravity generates a torque, which makes the internal hull rotate back to its original position using the slide. Figure 7 shows the final state. The closed hull design simultaneously makes the hull form a closed space, which will not be invaded by sea water, even if the ship capsizes.

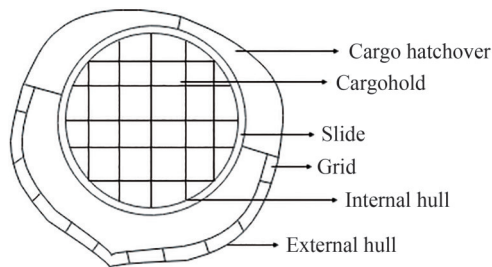


Figure 7 Ideal USV under rolling condition

7 Conclusions

Intelligent systems are products of technology development. The marine industry among others is inevitably developing in this direction because intelligent systems refer to the thinking process of the human brain and have the ability to think by themselves and complete tasks without relying on human involvement.

The technology of small USVs is relatively mature and unmanned ships are developing toward large transport vessels. This paper describes the types of USVs that have been developed and their applications. The advantages of USVs, the incompatibility of the characteristics of USVs with the existing legal regulations, the large-scale unemployment of sailors, and other problems were analyzed. In addition, four key technologies in the current USV research field were also analyzed.

Most current research on intelligent vessels is focused on systems, but few studies explore the security of cargo on USVs. Therefore, this paper proposes an inner hull grid structure, where the grid design enables cargo to be stored independently so that, even if one cargo section catches fire, leaks, or is otherwise damaged, it will not affect the cargo in other sections or the USVs' navigation. Moreover, this hull structure can generate a recovery torque by using the different characteristics between the left and right ends when the ship is tilted and using a slide and recovery torque to restore the inner hull to its original position. To some extent, this ensures the stability of the cargo transported during the ship's navigation.

However, this proposed design is still at a theoretical stage and has not yet been tested in the real world. The proposed hull design should consider the inclusion of rescue rooms and other spatial demands, which may affect the amount of cargo that can be loaded and the installation of facilities and equipment. In the future, these aspects will be studied in

greater depth to complete the transformation of the design from theoretical to practical stages.

Funding Shanghai High-level Local University Innovation Team (Maritime Safety & Technical Support) and the National Natural Science Foundation of China (Grant No. 42176217).

References

- Arai T, Pagello E, Parker, LE (2002) Advances in Multirobot Systems. *IEEE Transactions on Robotics & Automation* 18(5): 655-661. <https://doi.org/10.1109/TRA.2002.806024>
- Bibuli M, Bruzzone G, Caccia M, Indiveri G, Zizzari AA (2008) Line following guidance control: Application to the Charlie unmanned surface vehicle. *IEEE/RSJ International Conference on Intelligent Robots & Systems*
- Bureau Veritas (2017) *Guidelines for Autonomous Shipping*. Paris: Bureau Veritas
- Campbell S, Naeem W, Irwin GW (2012) A review on improving the autonomy of unmanned surface vehicles through intelligent collision avoidance manoeuvres. *Annual Reviews in Control* 36(2). <https://doi.org/10.1016/j.arcontrol.2012.09.008>
- Cao Juan, Wang Xuesong (2018) Development status and future prospects of USV at home and abroad. *China Ship Survey* (5):4. <https://doi.org/CNKI:SUN:ZGCJ.0.2018-05-026>
- Chen Yingbin (2019) Overview of USV development status and key technologies. *Scientific and Technological Innovation* (2):2. <https://doi.org/CNKI:SUN:HLKX.0.2019-02-036>
- Cheon YH, Lee SG, Kim M, Kim HO, Lee SI (2018) The Association of Disease Activity, Pro-Inflammatory Cytokines, and Neurotrophic Factors with Depression in Patients with Rheumatoid Arthritis. *Brain Behavior and Immunity*, 73. <https://doi.org/10.1016/j.bbi.2018.05.012>
- Dai Guangshu (2019) Data fusion application technology in marine unmanned driver technology. *Ship Science and Technology* 41(14): 55-57. <https://doi.org/10.3404/j.issn.1672-7649.2019.7A.019>
- Danish Maritime Authority (2017) *Analysis of regulatory barriers to the use of autonomous ships*. Korsør: Danish Maritime Authority
- Do KD, Jiang ZP, Pan J (2004) Robust adaptive path following of underactuated ships. *Automatica* 40(6): 929-944. <https://doi.org/10.1016/j.automatica.2004.01.021>
- Farinelli Alessandro, Iocchi Luca, Nardi Daniele (2004) Multirobot systems: a classification focused on coordination. *IEEE transactions on systems, man, and cybernetics. Part B, Cybernetics: a publication of the IEEE Systems, Man, and Cybernetics Society* 34(5): 2015-2028. <https://doi.org/10.1109/TSMCB.2004.832155>
- Fossen TI (2011) *Handbook of Marine Craft Hydrodynamics and Motion Control*. <https://doi.org/10.1002/9781119994138.ch4>
- Fraser KC (2011) *Ship: 5000 Years of Maritime Adventure*. Reference Reviews 25(3)
- Fu Jun (2015) Analysis of ship unmanned system. *Information Technology and Informatization* (04):140-141. <https://doi.org/10.3969/j.issn.1672-9528.2015.4.61>
- García-Ligero MJ, Hermoso-Carazo A, Linares-Pérez J (2015) Distributed fusion estimation in networked systems with uncertain observations and Markovian random delays. *Signal Processing* 106:114-122. <https://doi.org/10.1016/j.sigpro.2014.07.003>
- Gong Ruiliang, Ji Yuguan (2016) Intelligent ship technology and unmanned navigation technology[J]. *Ship & Boat* 27(05): 82-87. <https://doi.org/10.19423/j.cnki.31-1561/u.2016.05.082>

- Hu L, Naeem W, Rajabally E, Watson G, Mills T, Bhuiyan Z, Salter I (2017) COLREGs-Compliant Path Planning for Autonomous Surface Vehicles: A Multiobjective Optimization Approach. *IFAC PapersOnLine* 50(1):13662-13667. <https://doi.org/10.1016/j.ifacol.2017.08.2525>
- Jiang D, Mekonnen TM (2013) INS/GPS/ MNS Integrated Navigation System with Federated Kalman Filtering. *Advanced Materials Research*. <https://doi.org/10.4028/www.scientific.net/AMR.718-720.1207>
- Krzysztof W, Jakub M, Pentti K (2018) Towards the development of a system theoretic model for safety assessment of autonomous merchant vessels. *Reliability Engineering? System Safety* 178(Oct.): 209-224. <https://doi.org/10.1016/j.ress.2018.05.019>
- Lee SM, Kwon KY, Joh J (2004) A fuzzy logic for autonomous navigation of marine vehicle satisfying COLR- EG guidelines. *International Journal of Control Automation & Systems* 2(2):171-181. <https://doi.org/10.1007/s00170-003-1782-z>
- Liang Mincang, Liu Hu, Ai Wanzheng, Dong Hongcang (2018) Development countermeasures of high-quality crew under the background of ship intelligence. *Shipping Management* 40(12):26-30. <https://doi.org/10.13340/j.jsm.2018.12.010>
- Li Jiqiang, Zhang Guoqing, Li Bo (2022) Robust Adaptive Neural Cooperative Control for the USV-UAV Based on the LVS-LVA Guidance Principle. *Journal of Marine Science and Engineering*. <https://doi.org/10.3390/jmse10010051>
- Li Jiqiang, Zhang Guoqing, Zhang Xianku, Zhang Weidong (2021) Event-triggered robust adaptive control for path following of the URS in presence of the marine practice. *OCEAN ENGINEERING*. <https://doi.org/10.1016/j.ocean-eng.2021.110139>
- Li Rui, Li Jiaxin, Zeng Yan (2019) On the legal status of unmanned ships. *China Oceans Law Review* (04): 149-190
- Lin H, Sun S (2016) Optimal estimator for a class of non-uniform sampling systems with missing measurements. 2016 35th Chinese Control Conference (CCC). <https://doi.org/10.1109/ChiCC.2016.7553675>
- Lin Xu (2020) Dynamic Path Planning for Collision Avoidance of USV based on D* Algorithm. *International Core Journal of Engineering*, 6(5):73-83. [https://doi.org/10.6919/ICJE.202005_6\(5\).0013](https://doi.org/10.6919/ICJE.202005_6(5).0013)
- Liu Chunyang (2021) Research on ship navigation automation and navigation intelligence. *Marine Equipment Materials & Marketing* 29(5): 65-66. <https://doi.org/10.19727/j.cnki.cbwzysc.2021.05.025>
- Liu Jian (2014) Research on path planning technology of unmanned surface vehicles. Jiangsu University of Science and Technology.
- Liu Zuopung (2021) The application of intelligent technology and unmanned driving technology in ship design. *Ship Science and Technology* 43(4): 7-9
- Lu J, Yan L, Xia Y, Qiao G, Fu M, Lu K (2017) Asynchronous multi-rate multisensor data fusion over unreliable measurements with correlated noise. *IEEE Transactions on Aerospace & Electronic Systems* 53(99): 2427-2437. <https://doi.org/10.1109/taes.2017.2697598>
- Lv Guanghao, Peng Zhouhua, Wang Haoliang, Liu Lu, Wang Dan, Li Tieshan (2021) Extended-state-observer-based distributed model predictive formation control of under-actuated unmanned surface vehicles with collision avoidance. *Ocean Engineering* 238. <https://doi.org/10.1016/j.oceaneng.2021.109587>
- Masrwg (2017) Maritime autonomous surface ships UK code of practice. Southampton: MASRWG
- Mccue L (2016) Handbook of marine craft hydrodynamics and motion control. *IEEE Control Systems* 36(1):78-79. <https://doi.org/10.1109/MCS.2015.2495095>
- McLaughlin R (2004) Unmanned naval vehicles at sea: USVs, UUVs, and the adequacy of the law. *Journal of Law Information & Science* 21(2). <https://doi.org/10.5778/JLIS.2011.21.McLaughlin.1>
- Nan Gu, Dan Wang, Zhouhua Peng, Jun Wang, Qing-Long Han (2022) Disturbance observers and extended state observers for marine vehicles: A survey. *Control Engineering Practice* 123:0967-0661. <https://doi.org/10.1109/TSMC.2022.3162862>
- Ning Xinlong (2021) Brief analysis on the application prospect of unmanned survey ship in underwater topographic survey. *Water Conservancy Construction and Management* 41(3): 4. <https://doi.org/10.16616/j.cnki.11-4446/TV.2021.03.12>
- Peng Z, Qi W, Deng Z (2013) Centralized Fusion Steady-State Robust Kalman Filter for Uncertain Multisensor Systems. *Lecture Notes in Electrical Engineering* 255: 219-226. https://doi.org/10.1007/978-3-642-38460-8_25
- Peng Z, Wang J, Wang D, Han QL (2021) An Overview of Recent Advances in Coordinated Control of Multiple Autonomous Surface Vehicles. *IEEE Transactions on Industrial Informatics* 17(02):732-745. <https://doi.org/10.1109/TII.2020.3004343>
- Pu Jinjing, Liu Han, Jiang Yunhua, Huang Jian, Kuang Guangshen, Bruce Lee (2020) Summary of the Status and Development Trends of Unmanned Surface Vehicle. *Marine Information* 35(1): 6-11. <https://doi.org/CNKI:SUN:HTXX.0.2020-01-002>
- Rødsethø J, Nordahl H (2017) Definitions for autonomous merchant ships. Trondheim: Norwegian Forum for Autonomous Ships. <https://doi.org/10.13140/RG.2.2.22209.17760>
- Sun Xiaojie (2016) Research on Real-time Path Planning System for Unmanned Surface Vessel. Dalian Maritime University
- Sun Xiaojie, Wang Guofeng, Fan Yunsheng (2021) Collision avoidance guidance and control scheme for vector propulsion unmanned surface vehicle with disturbance. *Applied Ocean Research* 115. <https://doi.org/10.1016/j.apor.2021.102799>
- Sun Xu, Cai Yuliang (2020) Ship technology: from automation to autonomy. *China Ship Survey* (5): 46-48. <https://doi.org/CNKI:SUN:ZGCJ.0.2020-05-016>
- Su Shibin, Liu Yingce, Lin Hongshan, Wu Ronghui, Zhou Xiaoying (2018) Development and Key Technologies of Unmanned Transport Ship. *Ship & Ocean Engineering* 47 (05): 56-59. <https://doi.org/10.3963/j.issn.1671-7953.2018.05.013>
- Tasikas V (2004) Unmanned aerial vehicles and the doctrine of hot pursuit: A new era of coast guard maritime law enforcement operations. *Tulane Maritime Law Journal* (29):59-80
- Tuan L, Hongping Z, Zhouzheng G, Qijin C, Xiaoji N (2018) High-Accuracy Positioning in Urban Environments Using Single-Frequency Multi-GNSS RTK/MEMS-IMU Integration. *Remote Sensing* 10 (2): 205. <https://doi.org/10.3390/rs10020205>
- United States Navy (2007) The Navy Unmanned Surface Vehicle (USV) Master Plan
- Vasudevan Shriram K, Baskaran Balraj (2021) An improved real-time water quality monitoring embedded system with IoT on unmanned surface vehicle. *Ecological Informatics* 65. <https://doi.org/10.1016/j.ecoinf.2021.101421>
- Wang Chengbo, Zhang Xinyu, Li Junjie (2018a) Development ideas of unmanned ship navigation technology based on e-navigation. *Journal of Jimei University (Natural Science)* 23(5): 354-359. <https://doi.org/10.19715/j.jmuzzr.2018.05.006>
- Wang Chengbo, Zhang Xinyu, Zou Zhiqiang, Wang Shaobo (2018b) On path planning of unmanned ship based on Q-learning. *Ship & Ocean Engineering* 47(5): 168-171. <https://doi.org/10.3963/j.issn.1671-7953.2018.05.038>
- Wang Yunhui, Chen Yuao, Liang Mincang (2021a) Research on the impact of the development of USV on Seafarers' career and its countermeasures. *Shipping Management* 43(8):41-44. <https://doi.org/10.3340/j.jsm.2021.08.015>

- Wang Yuanyuan, Liu Jialun, Ma Feng, Wang Xingping, Yan Xinping (2021b) Review and prospect of remote control intelligent ships. *Chinese Journal of Ship Research* 16 (1): 18-31. <https://doi.org/10.19693/j.issn.16733185.01939>
- Wei Xinyong, Huang Yesheng, Hong Xiaobin (2018) Local obstacle avoidance method for unmanned surface vehicle based on VFH* algorithm. *China Measurement & Test* 44(12): 39-45. <https://doi.org/10.11857/j.issn.1674-5124.2018.12.007>
- Wrobel K, Montewka J, Kujala P (2018) System-theoretic approach to safety of remotely-controlled merchant vessel. *Ocean Engineering* 152:334-345. <https://doi.org/10.1016/j.oceaneng.2018.01.020>
- Wu X, Chen HL, Chen CG, Zhong MY, Xie SR, Guo YK, Fujita H (2012) The autonomous navigation and obstacle avoidance for USVs with ANOA deep reinforcement learning method. *Knowledge-Based Systems* 196. <https://doi.org/10.1016/j.knsys.2019.105201>
- Wu Zhaolin (2017) Ship automatic navigation and navigation intelligence. *China Maritime Safety* (08):16-19. <https://doi.org/10.16831/j.cnki.issn1673-2278.2017.08.007>
- Xie Boyu, Li Maoqing, Yue Lili (2020) Research on Route Real-Time Planning of UAV-Intelligent Platoons Cooperative Systems. *Computer Engineering and Applications* 56(20):8. <https://doi.org/10.3778/j.issn.1002-8331.2002-0038>
- Xu Chunsong, Zhang Renping (2017) Thoughts on the development of unmanned ships and the revision of maritime conventions. *World shipping* 40 (03):20-22. <https://doi.org/10.16176/j.cnki.21-1284.2017.03.004>
- Xu Daguang (2020) Research on Object Detection Technology of USV based on Information Fusion Technology. *Jimei University*, (5): 4-51. <https://doi.org/10.27720/d.cnki.gjmdx.2020.000252>
- Xue Min, Xu Haicheng, Wang Shuo (2018) Path planning of unmanned craft based on particle swarm optimization algorithm. *China Science and Technology Information* (24): 69-70. <https://doi.org/10.3969/j.issn.1001-8972.2018.24.025>
- Xu Xiaofeng, Xiao Yingjie, Zhang Xuelai (2021) A Review on Optimization of Unmanned Ship Path Based on Collision Avoidance Rules. *Journal of Transport Information and Safety* 39 (02): 1-8. <https://doi.org/10.3963/j.jssn.1674-4861.2021.02.001>
- Yan N, Huang S, Kong C (2021) Reinforcement Learning-Based Autonomous Navigation and Obstacle Avoidance for USVs under Partially Observable Conditions. *Hindawi*. <https://doi.org/10.1155/2021/5519033>
- Yang Baicheng, Zhao Zhilei (2018) Multi-ship encounter collision avoidance decisions based on improved simulated annealing algorithm. *Journal of Dalian Maritime University* 44(02): 22-26. <https://doi.org/10.16411/j.cnki.issn1006-7736.2018.02.004>
- Yang Bo (2015) Intelligent ship operation and maintenance technology. *Maritime China* (12): 68-69. <https://doi.org/10.3969/j.issn.1673-6664.2015.12.022>
- Yang C, Yang Z, Deng Z (2015) Guaranteed cost robust weighted measurement fusion steady-state Kalman predictors with uncertain noise variances. *Aerospace Science and Technology* 46(Oct. - Nov.): 459-470. <https://doi.org/10.1016/j.ast.2015.08.014>
- Yang J, Xiao Y, Fang Z, Zhang N, Wang L, Li T (2015) An object detection and tracking system for unmanned surface vehicles. *Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series*. Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series
- Yang Yi (2020) Information fusion of an unmanned surface vehicle integrated navigation system. *Dalian Maritime University* <https://doi.org/10.26989/d.cnki.gdlhu.2020.00038>
- Ye Qiang (2017) Research on intelligent ship technology and unmanned technology. *Shandong Industrial Technology* (15): 106. <https://doi.org/10.16640/j.cnki.37-1222/t.2017.15.098>
- Yin Qun, Liu Tian, Mao Wenqiang (2020) Some thoughts on Key Technologies of intelligent ship. *Marine Equipment/Materials & Marketing* (10):5-6. <https://doi.org/10.19727/j.cnki.cbwzysc.2020.10.003>
- Yuan Kui, Li Yuan, Fang Lixin (2007) Recent researches and development on multirobot system. *Journal of Automation*, 33(8): 785-794
- Zhang Guoqing, Li Jiqiang, Jin Xu, Liu Cheng (2021) Robust adaptive neural control for wing-sail-assisted vehicle via the multiport event-triggered approach. *IEEE Transactions on Cybernetics*, 2168-2267. <https://doi.org/10.1109/TCYB.2021.3091580>
- Zhang Weipeng, Zhang Zhimin (2020) Research on the legal applicability of the requirement of maritime safety governance and navigation guarantee service on unmanned ships and associated countermeasures. *China Maritime Safety* (9): 31-34. <https://doi.org/10.16831/j.cnki.issn1673-2278.2020.09.012>
- Zhao Tongqiang, Han Chao, Xu Yuliang (2021) Application of unmanned surface vehicle in urban river water quality monitoring. *China Water & Wastewater* 37(7): 7. <https://doi.org/10.19853/j.zgjsps.1000-4602.2021.07.010>
- Zhou X, Cheng L, Li W, Zhang C, Li M (2020) A comprehensive path planning framework for patrolling marine environment. *Applied Ocean Research* 100:1021-55. <https://doi.org/10.1016/j.apor.2020.102155>
- Zhou Xiangyu, Wu Zhaolin, Wang Fengwu, Liu Zhengjiang (2019) Definition of autonomous ship and its autonomous level. *Journal of Traffic and Transportation Engineering* 19(06): 149-162. <https://doi.org/CNKI:SUN:JYGC.0.2019-06-016>
- Zuo J, Zhong X (2017) Particle filter for nonlinear systems with multi-sensor asynchronous random delays. *Journal of Systems Engineering and Electronics*. <https://doi.org/10.21629/JSEE.2017.06.04>