# SBL localization based on Extended Kalman Filter

kun zhang<sup>1</sup>, Lan Zang<sup>2</sup>, Shengrong Zhang<sup>3</sup>, Yupeng Zhu<sup>3</sup>, Haifeng Wang<sup>4</sup>, and Ju Huang<sup>2</sup>

<sup>1</sup>Hainan Normal University

<sup>2</sup>State Key Laboratory of Marine Resource Utilization in South China Sea, Hainan University

<sup>3</sup>Sansha Guohai Communication Technology Development Co.Ltd.

<sup>4</sup>Key Laboratory of Island Tourism Resource Data Mining and Monitoring, Ministry of Culture and Tourism, Hainan Tropical Ocean University

October 30, 2022

# Abstract

According to the receiving array size, the underwater acoustic positioning system can be divided into three positioning systems: long baseline (LBL), short baseline (SBL) and ultra-short baseline (USBL). Acoustic detection and positioning technology based on ultra-short baseline is the most effective means to collect and transmit information, and is an effective way to solve the positioning accuracy of underwater vehicles. In this paper, the short baseline positioning and navigation system is studied deeply, and an underwater acoustic positioning algorithm based on extended Kalman filter is proposed. By fusing the information of pressure gauge, digital compass and accelerometer of the robot, the positioning accuracy is improved and the influence of underwater channel multipath effect on the system is reduced.

# SBL localization based on Extended Kalman Filter

Kun Zhang<sup>1,3,4</sup>, Lan Zang<sup>3,\*</sup>, Shengrong Zhang<sup>2</sup>, Yupeng Zhu<sup>2</sup>, Haifeng Wang<sup>4,5</sup>, Ju Huang<sup>3</sup>

<sup>1</sup>School of Information Science and Technology, Hainan Normal University, Haikou, 571158, China;

<sup>2</sup>Sansha Guohai Communication Technology Development Co.Ltd., Sansha, Hainan 570105, China

<sup>3</sup>State Key Laboratory of Marine Resource Utilization in South China Sea, Hainan University, Haikou, 570228, China;

<sup>4</sup>Key Laboratory of Island Tourism Resource Data Mining and Monitoring, Ministry of Culture and Tourism, Hainan Tropical Ocean University, Sanya, Hainan, 572022, China;

<sup>5</sup>School of Computer Science and Technology, Hainan Tropical Ocean University, Sanya, Hainan, 572022, China.

e-mail: kunzhang@hainnu.edu.cn; \*lanzang@hainanu.edu.cn; zhangshengrong@ghxtcom.com; xiaopeng@126.com; hfwang@hntou.edu.cn; huangju mail@163.com

\*The corresponding author

Abstract: According to the receiving array size, the underwater acoustic positioning system can be divided into three positioning systems: long baseline (LBL), short baseline (SBL) and ultra-short baseline (USBL). Acoustic detection and positioning technology based on ultra-short baseline is the most effective means to collect and transmit information, and is an effective way to solve the positioning accuracy of underwater vehicles. In this paper, the short baseline positioning and navigation system is studied deeply, and an underwater acoustic positioning algorithm based on extended Kalman filter is proposed. By fusing the information of pressure gauge, digital compass and accelerometer of the robot, the positioning accuracy is improved and the influence of underwater channel multipath effect on the system is reduced.

Key words:Short baseline positioning system; Extended Kalman filter; Underwater vehicle; Underwater acoustic positioning technolog;Underwater robot.

#### 1.INTRODUCTION

This section mainly introduces the positioning of underwater robots based on short baseline positioning. At this stage, underwater positioning is mostly used to locate underwater relatively stationary or stationary targets, and the positioning method is single. It can not achieve the expected positioning accuracy and positioning solution effect, so the positioning system is more rapid, simple and highprecision.

This paper mainly studies the marine enviroment analysis of underwater acoustic positioning.Use MTALAB analysis Extended Kalman filter of underwater vehicle based on short baseline positioning. The main methods are comparison, induction, analysis of data, combination of numbers and shapes, and induction and comparison in statistics. After fusing the information of the robot's own pressure gauge, digital compass and accelerometer, the positioning result is obtained. These measurement results have better positioning results than using SBL solution alone. The utilization and exploration of marine internal resources often need to explore underwater targets such as underwater robots and underwater detectors with new technologies. Compared with the traditional single positioning system, the accuracy of the new measurement is improved, and the requirements and ability of underwater target positioning settlement are also improved. At present, the research is only aimed at the variablespeed circular motion of underwater targets, and other underwater related fields are still under discussion.Underwater not only contains a large number of natural resources, the utilization and development of underwater resources is the guarantee for the sustainable development of national economy, and the sea and other waters also play an important role in military affairs[1]. The 18th CPC National Congress clearly proposed to "improve the ability to develop marine resources, develop the marine economy, protect the ecological environment,

resolutely safeguard China's marine rights and interests and build a marine power.[3]" The research of underwater positioning technology is of great significance to improve the utilization of marine resources[5]. In the early 20th century, the United States invented the first echo sounder based on underwater acoustic technology equipment[6-7]. However, in the 1950s, more countries used underwater acoustics to locate and navigate underwater vehicles[8]. In 2000, the pilot short baseline positioning system of American desert star series was widely used in civil product level, mainly in shore terminals and ships[9].

This paper mainly studies the MATLAB simulation analysis of Extended Kalman filter of underwater vehicle based on short baseline positioning. The positioning results are obtained by fusing the information of the robot's own pressure gauge, digital compass and accelerometer. These measurement results have better positioning results than using SBL solution alone. SBL is widely used because of its small array size. It is composed of more than three elements[24]. The length of SBL baseline is usually several meters to tens of meters, which is arranged on the bottom or side of the ship. It is calculated by calculating the propagation time of acoustic signal between the element and the target, and the azimuth and distance information of underwater target are calculated and displayed in the form of coordinates. Compared with the long baseline, the system is simpler and easy to move and operate[25].Compared with ultra short baseline, it has higher positioning accuracy and does not need installation error calibration. The disadvantage of SBL is that the tracking range is small, and the tracking range needs to be expanded by increasing the number of arrays[26].

#### II. System experimental results

In order to compare the effect of single SBL and LBL test with the positioning results of the test data in this paper, the test is specially selected under the same test conditions. Finally, make a comparison.In this chapter, we continuously test 800-1000 times at a certain point through simulation, count three groups of data from the statistical analysis theory, and evaluate the performance of the positioning system. First, the short baseline positioning test is carried out, and then the circular motion simulation of the robot is carried out.

#### A.Short baseline positioning accuracy test

In this experiment, the accuracy of the underwater acoustic positioning system of the detection robot is tested to simulate the near water area. The position array enters the water vertically to ensure that the array plane is facing the robot and perpendicular to the water surface.



#### Fig.6. Horizontal scatter diagram

It can be seen from the Figure 6 that LBL is on the left and SBL is on the right. Obviously, SBL positioning accuracy is more accurate.Horizon scatter diagram that the probability of scatter distribution of positioning measurement value within the error range of 0.5% is 99%, 98% and 80% respectively. The concentrated area where the measuring points fall is between 0.78m and 0.84M in the X direction and between 6.72m and 6.78m in the Y direction.The concentration area where the measuring points fall is between 3.8m and 3.95MAll or most of the three measurement results are better than the preset value (positioning error 0.5%).



Fig.7. Depth scatter of single system

As can be seen from the Figure7 that in the depth direction, the concentration area of the measuring point is between 3.7 and 3.75m. It can be seen from the chart that the probability of scattered point distribution of positioning measurement value within the error range of 0.5% is 80% respectively. It can be seen from the table that the error of the test results increases with the increase of distance.

As can be seen from the Figure8 that SBL is more accuraty. The reason for the difference between the third test results and the first two is that the channel environment is different due to the change of position, but the three results basically meet the system requirements, the accuracy is within 0.5%, and the test results are stable and reliable. It can be seen from the chart that the probability of scattered point distribution of positioning measurement value within the error range of 0.5% is 98% respectively.



**Fig.8.** Depth scatter of single system of SBL

### B.EKF filter test

In this experiment, the test and Simulation of two position variable speed circular motion of underwater acoustic positioning system of exploration robot are carried out to simulate the far sea area. The fusion simulation of positioning data and efk positioning data is carried out. It is assumed that the robot runs in a two-dimensional plane within the specified depth. It is evaluated from the aspects of robot trajectory, short baseline positioning solution, different acoustic array trajectory and EKF estimated position. The heading angle direction, heading angular velocity and heading angular acceleration of the underwater vehicle are measured respectively. The multi-path effect caused by underwater target movement on the system, the distance ambiguity caused by high data refresh rate, and the distance effect caused by different distances between different targets and the receiving array in multi-target positioning are tested.





As shown in the Figure9, it can be seen that the position of SBL solution in the green part coincides with the position estimated by efk by 90%. The angle represents the beacon position, and the asterisk represents the starting point of calculation. It can be seen that the position information calculated by SBL is more inclined to the uncertain divergence mode, and the position information calculated by efk is more inclined to the determined trajectory. The fusion of the two

verifies the improvement of the accuracy and optimization effect of the algorithm.



Fig.10. Under different measurement accuracy conditions

The Figure10 shows that the slope data is sampled into the data of the specified rate, the sampling interval of the measured value of the inclined distance is calculated, which is directly solved by SBL, and the efk is used for filtering estimation. It can be seen that under the conditions of three different measured values of the press, the addition of Gaussian white noise under three actual conditions, and the accuracy of three digital compasses. The trend of oblique distance of the three is basically the same.



Fig.11. Robot heading parameters of Kalman

As shown in the Figure11, it shows the curve of heading, heading angular velocity and heading angular acceleration of underwater vehicle. It can be seen from the figure that efk is more accurate and detailed than the original heading angle and efk heading angle, and the two curves are just fused, which further verifies the accuracy of efk. The heading angular velocity presents a regular wavy chart and presents a gradual increasing mode. It shows that the robot adopts variable speed acceleration. The heading angular acceleration shows a decreasing mode.





The Figure12 shows us the speed and acceleration of the robot in different coordinate systems. As you can see, The figure shows us the speed and acceleration of the robot in different coordinate systems. It shows that the robot does the corresponding motion in the twodimensional plane. The other two curves show that the robot does twodimensional variable speed circular motion. The acceleration of the robot in different coordinate systems presents regular waves At the same time, it also verifies the authenticity of its horizontal operation. The acceleration in other directions is also within the sampling interval, which shows that the simulated motion effect of the underwater vehicle reaches the expectation



The above experimental results and data show that the improved method can effectively deal with the state of underwater target movement. And the positioning accuracy is improved, so compared with other single systems, this method is more practical. This paper mainly uses the marine environment for testing and data recording. Through the MATLAB analysis of Extended Kalman filter of underwater vehicle based on short baseline positioning. The positioning results are obtained by fusing the information of the robot's own pressure gauge, digital compass and accelerometer. It is proved that the positioning accuracy of underwater target is improved under the optimization of EKF fusion SBL algorithm.Compared with the original SBL solution, the EKF fusion SBL algorithm is more practical and accurate. At the same time, it explains that the SBL algorithm based on EKF algorithm has greatly improved in terms of the impact of multi-path effect on the system caused by underwater target movement, the distance ambiguity caused by high data refresh rate, and the distance effect caused by different distances between different targets and the receiving array. Based on the review of the development history, current situation and application of underwater positioning and tracking system, a high-speed target trajectory measurement system based on short baseline is designed. However, it is still necessary to continue to improve the hardware processing level of the system and the optimization of the algorithm in the future work, so that the target trajectory can be given in real time with a higher refresh rate.

# ACKNOWLEDGEMENTS

This paper was supported by the National Natural Science Foundation of China (No. 61861015); the Hainan Province Science and Technology Special Fund (No.ZDKJ2021022, No.ZDKJ2021023, No.ZDYF2020017, ZDYF2022GXJS012, ZDYF2022GXJS012, No.ZDYF2021GXJS032, No.ZDYF2021GXJS213); the Open Fund Project of State Key Laboratory of Marine Resources Utilization in South China Sea (No. MRUKF2021032).

#### References

1. Jingbo Wu, Shuping Cheng, Pengduo Zhao. Towed target positioning technology based on long baseline and ultra-short baseline combination[J]. Zhongguo Jianchuan Yanjiu, 2019, 14(1): 156-161.

2. Bikramaditya Das, Bidyadhar Subudhi, Bibhuti Bhusan Pati. Formation control of underwater vehicles using Multi Agent System[J]. Bulletin of the Polish Academy of Sciences-Technical Sciences-Archives of Control Sciences, 2020, 20(2):365-384.

3. Xin Liu, Hao Zhang. Design and Implementation of Preprocessing Unit of FPGA-based Ultra-short Baseline Positioning System[J]. 2021 OES China Ocean Acoustics (COA), 2021, 694-697.

4. Grażyna Grelowska, Eugeniusz Kozaczka. Underwater Acoustic Imaging of the Sea[J]. Bulletin of the Polish Academy of Sciences-Technical Science-Archives of Acoustics, 2014, 39(4):439-452.

5. Eric Wolbrecht, David Pick, John Canning and Dean Edwards. Improving AUV Localization Accuracy by Combining Ultra-Short-Baseline and Long-Baseline Measurements Systems in a Post-Processing Extended Kalman Filter[C].OCEANS 2019 MTS/IEEE SEATTLE, 2019, 1-7.

6. David Pick, Eric Wolbrecht, Michael Anderson, Dean Edwards and John Canning. Uncertainty Analysis of Ultra-Short- and Long-Baseline Localization Systems for Autonomous Underwater Vehicles[C]. OCEANS 2018 MTS/IEEE Charleston, 2018, 1-6.

7. Xuyan Liu, Nan Zou, Yifeng Zhang. Methods of unwrapping phase ambiguity and selecting direct sounds in an ultra short baseline positioning system[J]. The Journal of the Acoustical Society of America, 2017,142(4): 2731-2731.

8. Fupeng Qiu, Hongjie Wan, Xuewei Wang. A Design for Water Surface Communication System of Ultra Short Base Line Positioning System[J]. Advanced Materials Research, 2013, 2534(756-759) : 2184-2187.

9. Jucheng Zhang, Dajun Sun, Yunfeng Han. A Novel Method for Azimuth Estimate of Ultra Short Base Line Positioning System[J]. Applied Mechanics and Materials, 2013, 2490(333-335): 343-347.

10. Dajun Sun, Jie Ding, Cuie Zheng, Weimin Huang. Angular misalignment calibration method for ultra-short baseline positioning system based on matrix decomposition[J]. IET Radar, Sonar & Navigation, 2019, 13(3): 456-463.

11. Radar and Sonar Research; Reports from Harbin Engineering University Advance Knowledge in Radar and Sonar Research (Angular Misalignment Calibration Method for Ultra-short Baseline Positioning System Based On Matrix Decomposition)[J]. Science Letter, 2019.

12. Geraint West, Ed Ceurstemont. Optimising Performance of a Long Range Ultra Short BaseLine Tracking and Telemetry System[C].OCEANS 2018 MTS/IEEE Charleston, 2018, 1-6.

13. Kun Zhang, Chong Shen\*, Hanwen Li. Design of Robot System for Hospital Infection Prevention and Control Based on UWB Technology[J] Basic & Clinical Pharmacology & Toxicology, 2020,126(1): 68-69.

14. Rafał Miętkiewicz. Possibilities of underwater gas line connection B8 source – Władysławowo monitoring using the Polish Naval forces[J]. Bulletin of the Polish Academy of Sciences-Technical Sciences-Zeszyty Naukowe Instytutu Gospodarki Surowcami Mineralnymi Polskiej Akademii Nauk, 2018, 107: 33-46.

15. Keliu Long, Chong Shen, Chuan Tian, Kun Zhang, Uzair Aslam Bhatti , Nsalo Kong Darryl Franck, Shuo Feng, Hesen Cheng. Single UWB Anchor Aided PDR Heading and Step Length Correcting Indoor Localization System [J]. IEEE Access, 2021, 9:11511-11522.

16. Sensor Research; Reports from INESC Technology and Science Add New Study Findings to Research in Sensor Research (Underwater Localization System Combining iUSBL with Dynamic SBL in Trials)[J]. Journal of Technology, 2020.

17. Kun Zhang, Chong Shen, Mengxing Huang, Haifeng Wang, Hanwen Li, Qian Gao. Interrupt Protection Control of Anti-Interference Nodes in Network Based on Band Sampling Decision Filter Modulation [J]. Cluster Computing - The Journal of Networks Software Tools and Applications, 2019, 22(3): 7569-7576.

18. Yingqiang Wang, Ruoyu Hu, S. H. Huang, Zhikun Wang, Peizhou Du, Wencheng Yang, Ying Chen. Passive Inverted Ultra-Short Baseline Positioning for a Disc-Shaped Autonomous Underwater Vehicle: Design and Field Experiments[J].IEEE Robotics and Automation Letters, 2022, 7(3): 6942-6949.

19. Jingxin Luo, Hak-Lim Ko. UKF-Based Inverted Ultra-Short Baseline SLAM With Current Compensation[J]. IEEE Access, 2022, 10: 67329-67337.

20. Liang Zhang, Tao Zhang, Hongyu Wei.A Novel Robust Inertial and Ultra-Short Baseline Integrated Navigation Strategy Under the Influence of Motion Effect[J]. IEEE Transactions on Intelligent Transportation Systems, 2022, 1 - 12.

21. Yingqiang Wang, S. H. Huang, Mingyue Feng, Ying Chen. Simultaneous Subsea Gas Plumes Detection and Positioning Using a Transceiver of an Ultra-Short Baseline System[J]. IEEE Sensors Journal, 2022,22(6): 5778-5786.

22. Tongwei Zhang, Baohua Liu, Yeyao Liu. Positioning Systems for Jiaolong Deep-Sea Manned Submersible: Sea Trial and Application[J]. IEEE Access, 2018, 6:71644-71650.

23. Shaohua Pan, Xiaosu Xu, Liang Zhang, Yiqing Yao. A Novel SINS/USBL Tightly Integrated Navigation Strategy Based on Improved ANFIS[J]. IEEE Sensors Journal, 2022, 22(10): 9763-9777.

24. Jia Guo, Dongyu Li, Bo He. Intelligent Collaborative Navigation and Control for AUV Tracking[J]. IEEE Transactions on Industrial Informatics, 2021, 17(3): 1732-1741.

25. Maodong Xia, Tao Zhang, Jian Wang, Liang Zhang, Yongyun Zhu, Lin Guo. The Fine Calibration of the Ultra-Short Baseline System With Inaccurate Measurement Noise Covariance Matrix[J]. IEEE Transactions on Instrumentation and Measurement, 2022 71: 1-8.

26. Øystein Sture, Petter Norgren, Martin Ludvigsen. Trajectory Planning for Navigation Aiding of Autonomous Underwater Vehicles[J]. IEEE Access, 2020, 8: 116586-116604.

27. Yulin Xu, Wenqian Liu, Xin Ding, Pengfei Lv, Chen Feng, Bo He, Tianhong Yan. USBL Positioning System Based Adaptive Kalman Filter in AUV[C]. 2018 OCEANS - MTS/IEEE Kobe Techno-Oceans (OTO), 2018, 1-4.