

# Sensor fusion<sup>\*</sup>

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## ABSTRACT

The Sensor Fusion of the Naiad AUV is done on a Beagle-Bone Black which takes care of computationally heavy calculations. Data is received from both an ethernet connection and a CAN bus. The data is received as CAN messages independently of underlying technology in the current design. For long term maintainability of the code the Sensor Fusion code is divided into seven Ada tasks where each task has a specific responsibility.

## 1. INTRODUCTION

The Sensor Fusion is divided into two parts: Software architecture and Sensor fusion calculations.

### 1.1 Software architecture

The responsibility of the Sensor fusion was from the beginning unclear. The design choices that were made had to leave room for change in responsibility. This could mean that the calculations that were supposed to be done later on would be more computationally heavy than first anticipated or perhaps, the other way around. It was also important to make sure that neither the ethernet connection nor the CAN bus connection were blocking the Sensor fusion calculations.

### 1.2 Sensor fusion calculations

The Sensor fusion calculations are aimed to calculate the attitude (yaw, pitch and roll) and the position of the AUV in x, y and z coordinates taking the starting position as the origin. Due to time and financial constraints that caused the ordering of IMU to be delayed, the Sensor fusion was never implemented. This report is meant to guide the readers in the right direction and help them avoid future mistakes.

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## 2. IMPLEMENTATION

As mentioned in Section 1, the Sensor Fusion is divided into two parts: Software architecture and Sensor fusion calculations. Sensor fusion calculations are in turn divided into attitude calculations and dead reckoning.

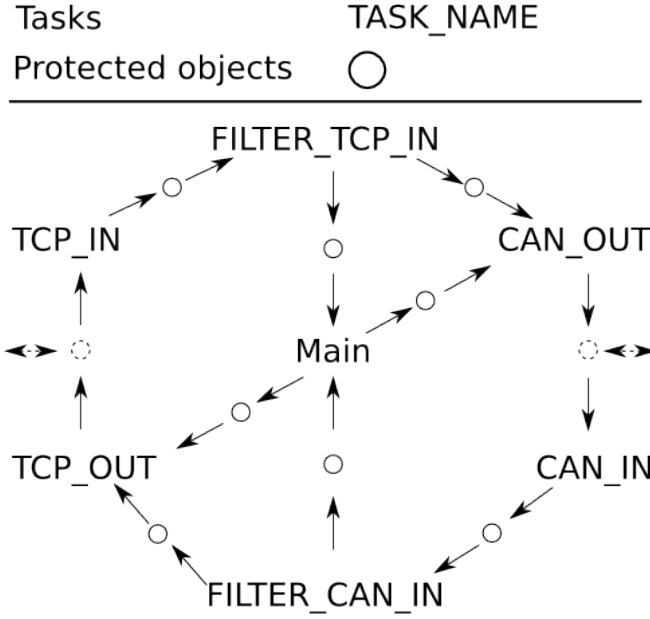
### 2.1 Software architecture

To meet the software requirements it was decided to use Ada Tasks and Ada Protected Objects. Protected objects are a special type of objects within Ada to facilitate shared memory in a type safe way. A requirement from the customer was the use of the Ada Ravenscar profile. This profile limits the use of tasks to make the program easier to verify and validate. This meant that each protected object in use was only allowed to be called from no more than two different tasks.

The common data structure within the Naiad AUV is the CAN message structure, it has a message ID and payload. These messages were modelled as objects within the Sensor fusion code and the CAN message type is the only data type that is passed around between Ada Tasks.

To manage the incoming and outgoing data two tasks were set up for each link, TCP\_IN and TCP\_OUT for the ethernet connection as well as CAN\_IN and CAN\_OUT for the CAN bus connection. Each one of these tasks had only one responsibility, which was to either send or receive CAN messages. The next task to be added was the Main task which would do all the calculations. The design in this stage had five different tasks with distinct responsibility, though one main problem left to solve was the requirement that in this design the Main task would have to do a lot of filtering of CAN messages both to and from the TCP and CAN connection. To solve this two new tasks were introduced, the TCP\_IN\_FILTER and CAN\_IN\_FILTER. The filtering tasks would be given a set of CAN message IDs on boot up that were of interest to the Main task. The Main task had now only one responsibility left and that was to do the actual sensor fusion calculations.

The final design of the software architecture is seen in Figure 1. The dashed circles on the left and right side are protected objects specific for the different hardware resources. For the CAN bus this is required because one cannot read and write at the same time, but for the TCP connection multiple connections can be done in parallel so this can be changed.



**Figure 1: Sensor fusion software architecture.** Showing the different tasks and how they interact with each other through several different protected objects.

## 2.2 Sensor fusion calculations

The Sensor fusion calculations consist of two parts, attitude calculations and dead reckoning.

## 2.3 Attitude Calculations

The Vectornav VN100 IMU (Inertial Measurement Unit) [2] used in the Naiad AUV gets the yaw, pitch and roll values by integrating over the angular velocities. However even when the IMU is kept still it still has some residual angular velocities which causes the yaw, pitch and roll to drift over time and hence need to be corrected. The IMU corrects its roll and pitch values using its accelerometer readings which give the direction of gravity. Once roll and pitch are corrected, the magnetometer reading is used to correct the yaw value.

The Vectornav VN100 IMU has a Kalman filter implemented which provides us with the compensated yaw, pitch and roll values. However according to the requirements the magnetic fields cannot be trusted in some competitions. This leads to the yaw values being unreliable. Thus to correct yaw, a Fiber Optic Gyroscope (FOG) [1] is used.

A fiber optic gyroscope uses a laser interferometer to calculate the angular speed of the gyroscope. The challenge is to integrate the readings obtained from the FOG to the readings obtained from the IMU. If one integrates the angular velocity from FOG one can get the yaw value, this value tells the angle the AUV rotates in the z axis attached to the AUV. The idea is that this is the yaw angle that should be applied to the AUV after the roll and pitch is done, that is the yaw should be the last operation to reach from one state to other.

The IMU can output the yaw, pitch and roll in body frame of reference. To use the FOG value it should be converted to roll, pitch and yaw order. After that the yaw value of IMU can be replaced with the yaw from the FOG. The following two methods were proposed to change the angle order from yaw, pitch and roll to roll, pitch and yaw:

1. The idea is that for small changes in yaw, pitch and roll angles, the order in which the rotations are applied does not matter upto first degree of accuracy. So changes to yaw pitch and roll are calculated for IMU and the yaw change for FOG at each time step. If it is assumed that the AUV moves slowly and that the samples are taken fast enough, the changes to the angles will be small. Thus the rotation matrix from the previous step is multiplied with the rotation matrix obtained by combining the yaw from FOG and roll and pitch from IMU to get a new rotation matrix.
2. VN100 IMU can also output the Directional Cosine Matrix (DCM). The other method is to get the DCM and compare it to the rotation matrix obtained by applying rotations in roll, pitch and yaw order. Then one can derive formulas for the roll, pitch and yaw in terms of DCM matrix elements.

## 2.4 Dead Reckoning

Dead reckoning is the name of the method used to calculate the x, y and z coordinates of the AUV with the starting position as the origin. The simplest way to do this is to integrate the accelerometer values twice to get the position. However this can lead to large amounts of errors because a small error in accelerometer increases exponentially with time as it is multiplied with time squared. To avoid this the plan was to use front and down facing cameras, which have stereo vision, and calculate the velocity of the AUV. Then the velocity and acceleration can be combined using Kalman filter to get a better estimate of the position.

## 3. CONCLUSION

The conclusions of this report are divided into Software architecture and Sensor fusion calculations.

### 3.1 Software architecture

The software design of Sensor fusion meets the requirements set out in the beginning and make room for future improvements with the use of Ada Tasks in a modular way. It is also easy to change the actual algorithm used for the sensor fusion calculation as it's placed in one single Main task. The one main issue that can be improved with regard to the software architecture is how the filtering tasks filter the CAN messages by ID, at the moment it's just an if-statement for specific IDs and should be improved.

### 3.2 Sensor fusion calculations

The Sensor fusion calculations never reached the implementation stage because of the delay in arrival of IMU and FOG. However a lot of brainstorming was done in reaching the solutions to the problems presented. This report serves the purpose to point the people interested in the project in the right direction.

#### **4. REFERENCES**

- [1] The fiber optic gyro (fog) product sheet. [http://www.saabgroup.com/Global/Documents%20and%20Images/Land/Weapon%20Systems/FOG/000-112\\_RevB\\_web.pdf](http://www.saabgroup.com/Global/Documents%20and%20Images/Land/Weapon%20Systems/FOG/000-112_RevB_web.pdf). Accessed 2013-12-28.
- [2] Vn-100 user manual. <http://www.vectornav.com/Downloads/Support/UM001.pdf>. Accessed 2013-12-28.