#### Technical University of Denmark



#### **GPU-Boosted Camera-Only Indoor Localization**

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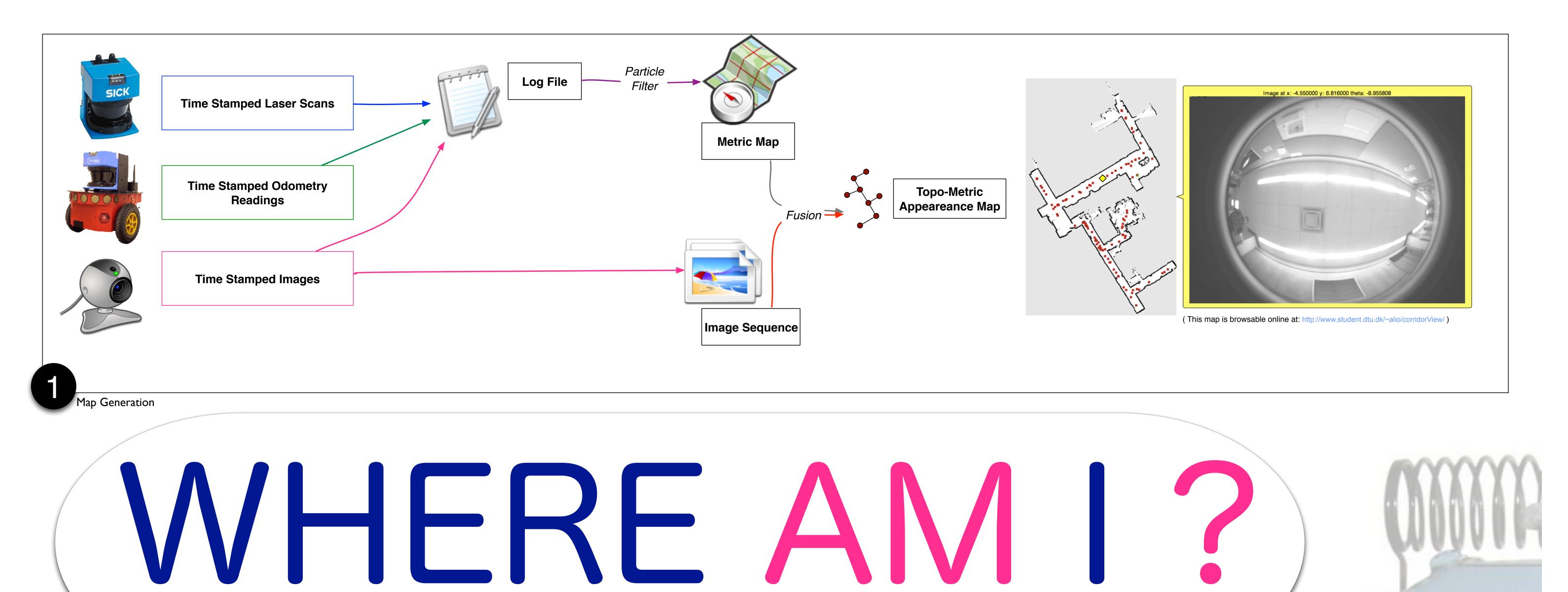
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# **GPU-BOOSTED CAMERA-ONLY LOCALIZATION FOR MOBILE ROBOTS**

### Abstract

Localization can be defined as the process of estimating the pose of an *agent*, given a representation of the environment and sensor input. In this work, we use Topo-metric Appearance Maps to represent the environment, and introduce a new method for localization using only a camera. The method relies on local image features detection, description and matching; by parallelizing these computationally intensive tasks on the graphical processing unit (GPU), it is possible to do online localization using a Topometric Appearance Map. The method is developed as an integral part of a mobile service robot system [1], and empirically evaluated using a real robot in a typical indoor environment.

## Map Generation

Building a Topo-metric Appearance map is an offline process, and it requires a 'capable' robot; which is equipped with wheel encoders to estimate the path of the robot, a range sensor to detect objects in the environment and to correct the path estimation, and a camera to capture appearances. The path estimated by wheel encoders are prone to system noise and integration errors, and it needs to be corrected using a particle filter [2]. This process is usually referred as *Simultaneous* Localization and Mapping (SLAM), and it has two outputs: A metric grid-map and the corrected path.

Using the corrected path and the metric map of the robot, it is possible to select a sparse set of *appearances* from the dataset of collected images; and correlate them to metric poses based on their timestamps. The final result of this process is the Topometric Appearance Map; a sparse set of appearances with known positions and orientations.

## Signature Generation **2**

A signature is the quantitative characteristics of an appearance; whereas an appearance is a representative image of a scene in the environment. One way of creating a *signature* is to use local image features. In this work, we adopted *Scale* Invariant Feature Transform (SIFT) [3] for detecting and describing features in appearances.

At the end of this stage, a vector of *signatures* is obtained, which correspond to the features of *all* images in the Appearance map.

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Having the topo-metric appearance map and the signatures vector; it is possible to do pose estimation, using a 'less capable' system; which only uses a camera as the only sensor. The system simply compares every taken image to the images in the appearance map.

In the majority of applications, localization has to be an online process. Conventional methods for feature detection and matching are computationally intensive and timeconsuming; rendering this method impractical. However, they are also massively parallel; which are suitable to run on graphical processing units (GPU) to achieve significant speed-ups over conventional (CPU based) approaches.

This method relies on a GPU-based approach [4]; live camera frame is transferred to GPU, it's signature is computed, and matched against the signatures vector of appearances. Finally, the pointer to the best match(es) is returned from the GPU, and the pose is estimated according to the *topo-metric appearance map*.

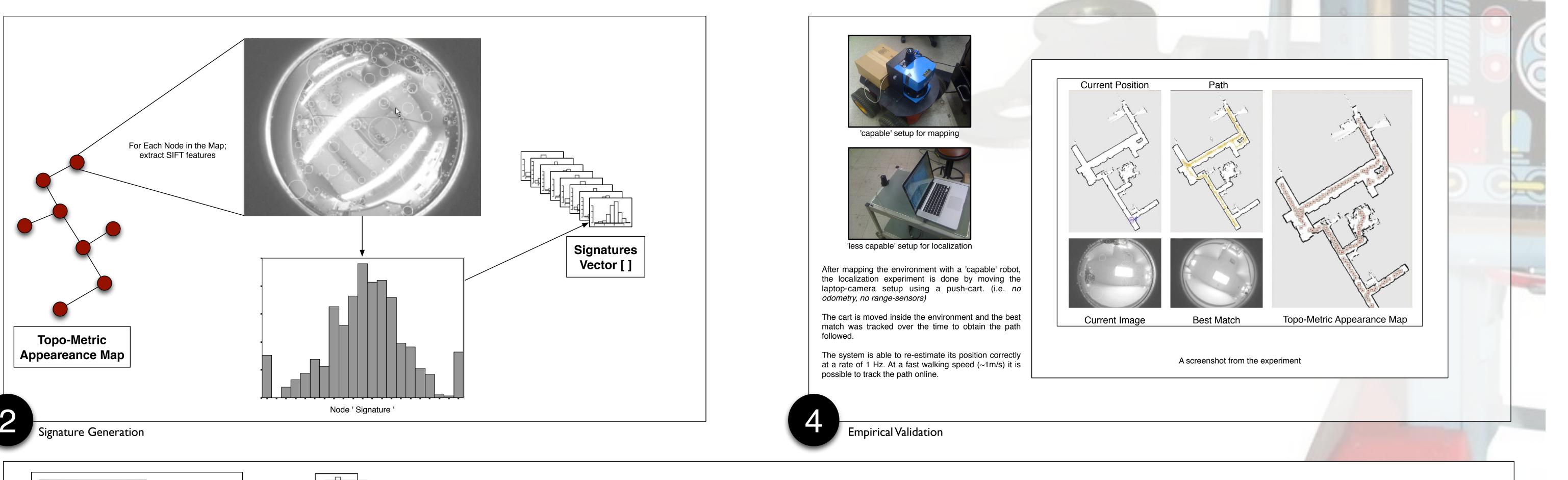
## Empirical Validation 4

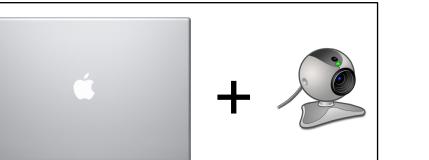
The method is implemented on a mobile platform, and it is evaluated in a typical indoor environment for it's online performance. The 'capable' robot consists of a Pioneer 3-AT robot base, SICK-LMS200 laser range finder, a USB camera and a netbook computer. The robot is manually guided in an indoor environment (~30x40 meters), and the collected data is post-processed to obtain the topo-metric appearance map, which consist of 204 images (out of 915 collected).

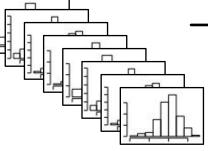
Localization performance is evaluated using a 'less capable' setup; which simply consisted of a USB camera connected to a MacbookPro laptop with discrete Nvidia graphics chipset (gt-9600). The setup is placed on a wheeled push cart, and manually moved inside the environment with fast walking speed (~1m/s). Best five matches from the appearance map was tracked, and it was observed that the system was able to consistently estimate its correct position in the map at a speed of ~1Hz, despite the changes in illumination, partial occlusions and elevation of the camera.

## Conclusion

Localization is an essential requirement for the majority of mobile robot applications, and in this work, we introduce a gpu-boosted camera-only method for online localization and evaluate it in real-life settings. With much room for improvement, the potential of the method is eminent. Eliminating the need for additional sensors (such as laser range-finders) for localization can significantly decrease costs, power needs and mechanical/electrical complexities of autonomous robots.

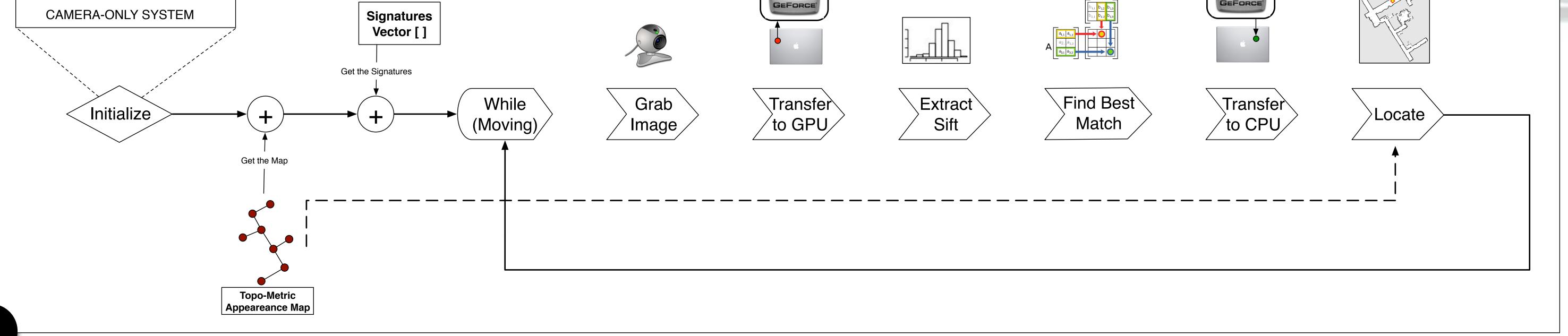












## Camera-only Localization



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<sup>1]</sup> A. Ozkil et.al, Service robots for hospitals: A case study of transportation tasks in a hospital. In proceedings of International Conference on Robotics and Applications, 2009 [2] G. Grisetti, et.al., Fast and Accurate Slam with Rao-Blackwellized Partocle Filters, Robotics and Autonomous Systems, 2007