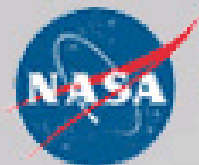


# Real-time Landing Point Tracking and Relative Landing Point Vector Generation for Unmanned Aerial Vehicle Rooftop Landing Procedure Utilizing Computer Vision Methods

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**Mentor:** Roland Brockers



Jet Propulsion Laboratory  
California Institute of Technology

# About Me

- University of Illinois at Urbana-Champaign



- Aerospace Engineering Undergrad

- Interests

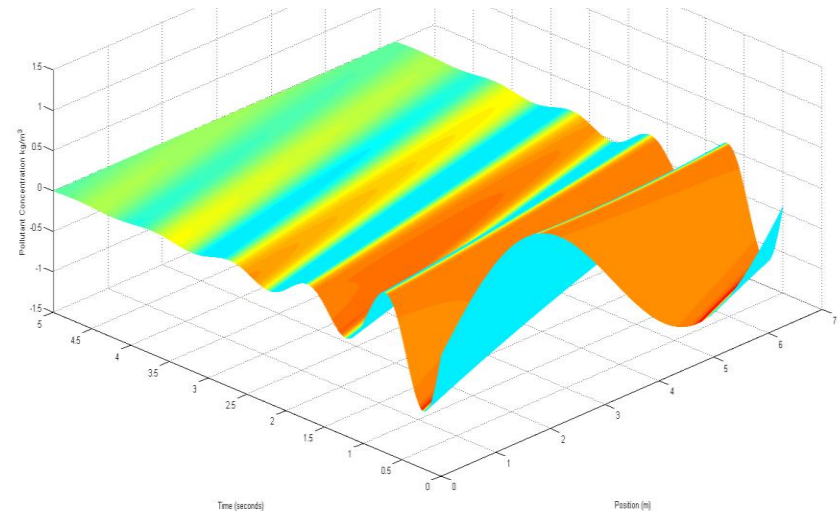
- Computational Sciences

- Computational Mechanics

- Optimization

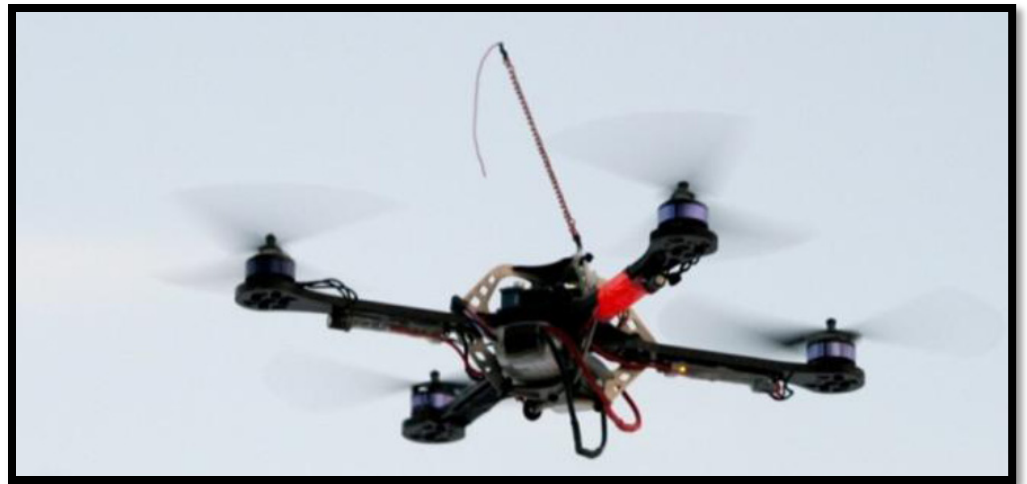
- Dynamics/Controls

- Robotics



# The Project

- Autonomous Quadrotor
  - Develop autonomous rooftop landing software



- My role
  - Develop software to track a given landing point during descent
    - Helps control quadrotor accurately through descent

# Implementation

- Software developed using ROS and C/C++
- Software utilized vision based methods
  - First tried using OpenCV, an open source computer vision library
  - Later migrated to using computer vision code developed here at JPL

# Why?

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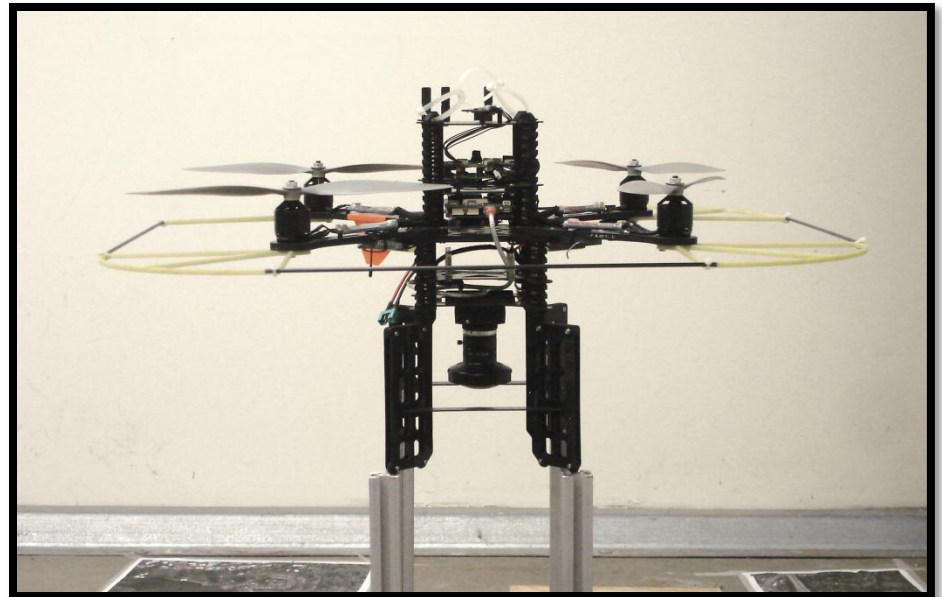
- Why autonomy?
  - Can help keep the UAV in air
  - Less work for pilot

# Why?

- Why use vision based methods?
  - Pros
    - Cameras are light and energy efficient
    - Lots of useful data can be extracted
  - Cons
    - Can be computation heavy
    - Real-time algorithms are difficult to build

# Why?

- Why use a quadrotor as the UAV?
  - Maneuverability
  - Hovering ability
  - Simple mechanically



# Approach ~ Tracking Landing Pose in Image

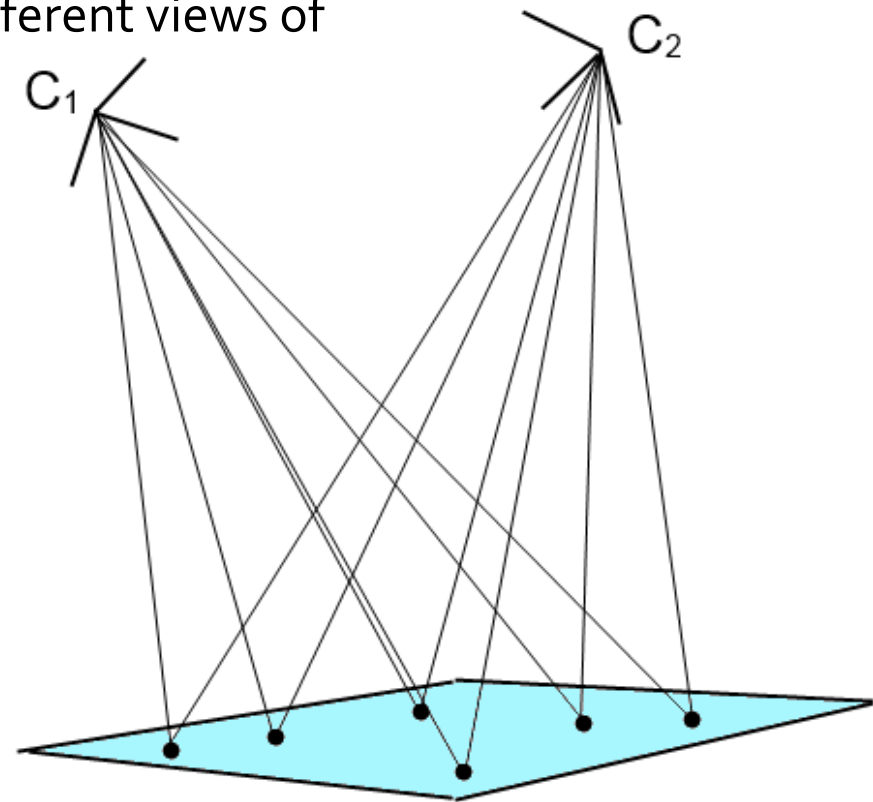
- Homography based tracking
  - Pros
    - Simple
    - Efficient once found
    - Can be used on all points on the plane it describes
  - Cons
    - Meant to represent features on a plane
    - Requires features matches to generate



# Homography based Tracking

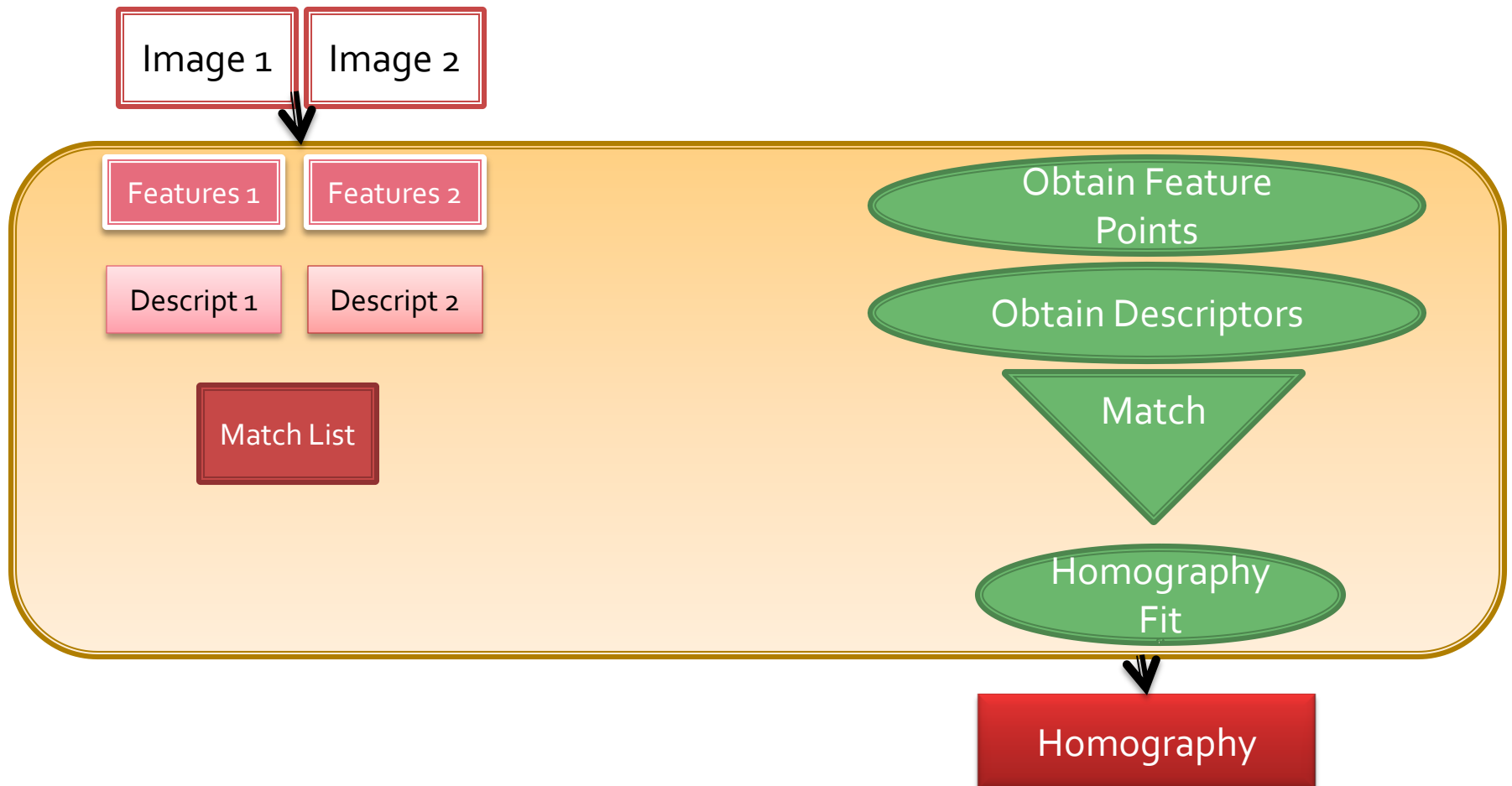
## ■ Definitions

- What is a planar homography?
  - Point-to-point mapping between different views of a plane
- What is a feature point?
  - A point with high detail
- What is a descriptor?
  - A vector that holds local feature information



# Homography based Tracking

- Homography Obtaining Process



# Feature Detectors and Descriptors

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- Selection of these is very important
- Consequences
  - Robustness
  - Computational Efficiency

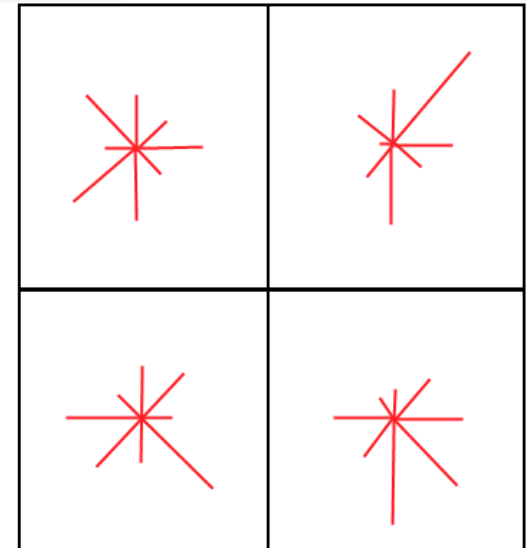
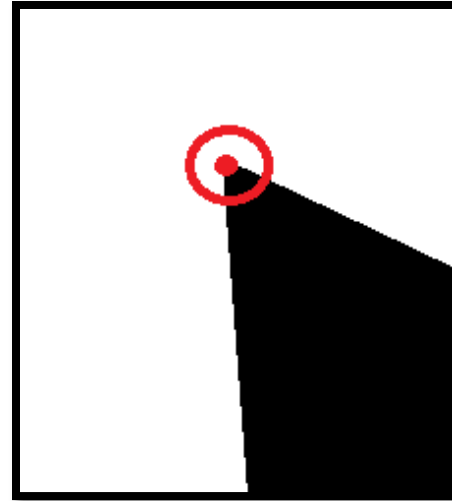
# Feature Detectors and Descriptors

- Detector Options

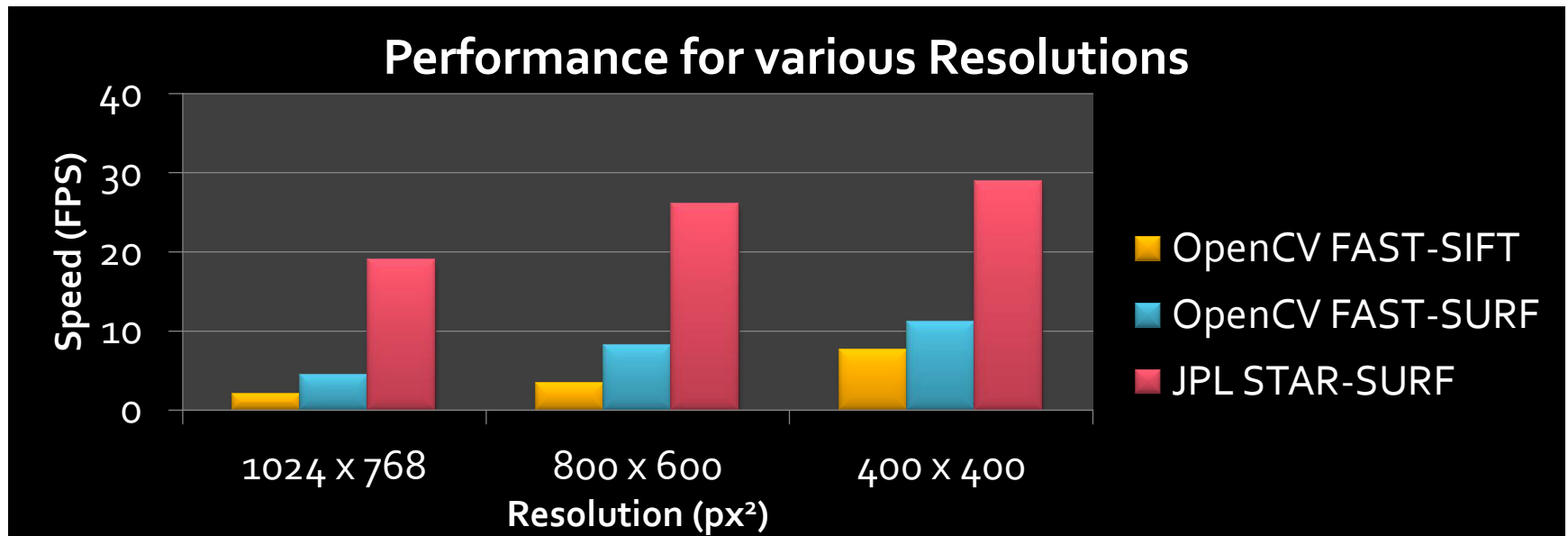
- FAST
- STAR

- Descriptor Options

- SIFT
- SURF



# Performance Results



- OpenCV FAST-SIFT

- Robust but slow

- OpenCV FAST-SIFT

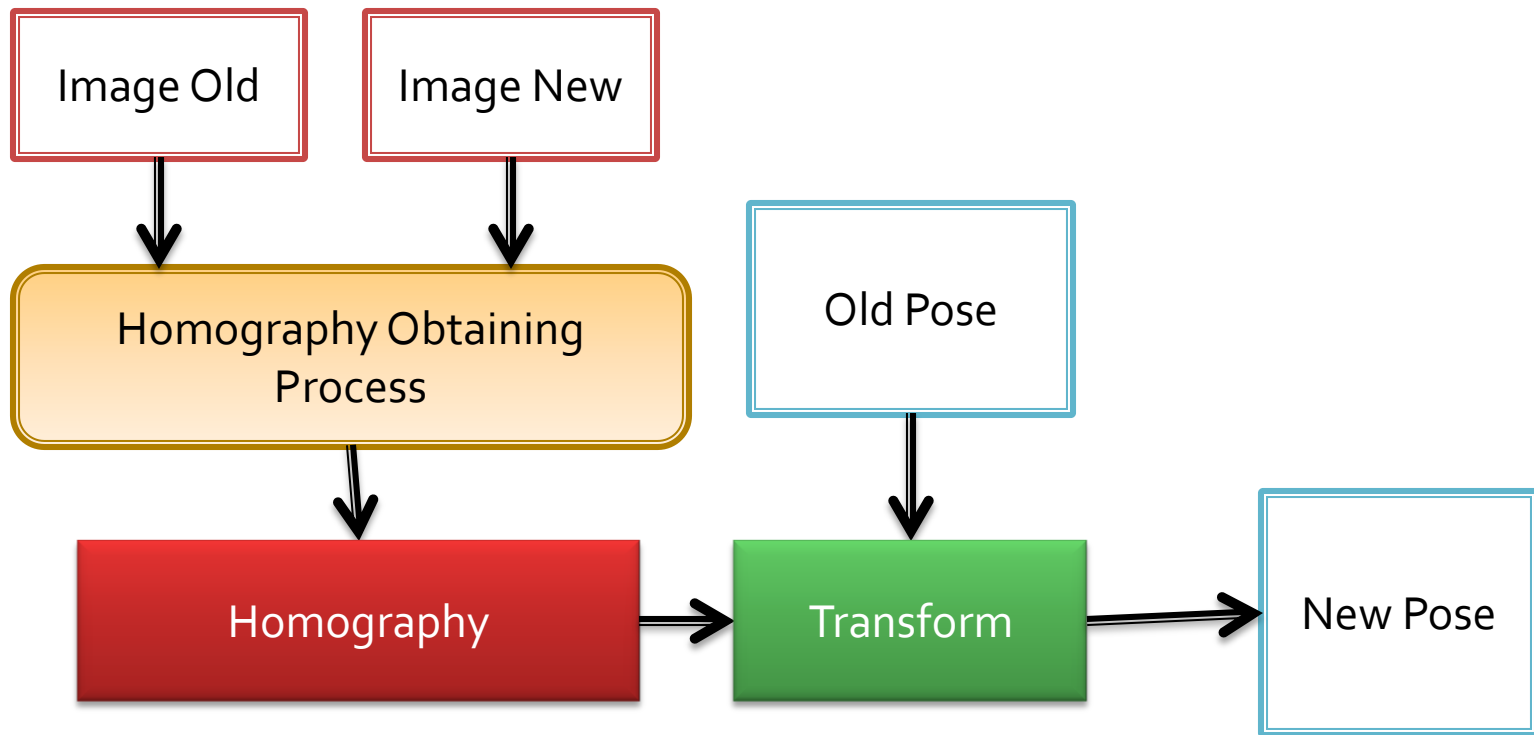
- Slow and not robust

- JPL STAR-SURF

- Robust and fast

# Homography based Tracking

- Tracking Process



# Not so fast...

- Problems

- Scene may have many planes
- If no filtering of features is done, homography can be wrong
- Can cause landing location drift

- Solution

- Find smart way to get rid of outlier features

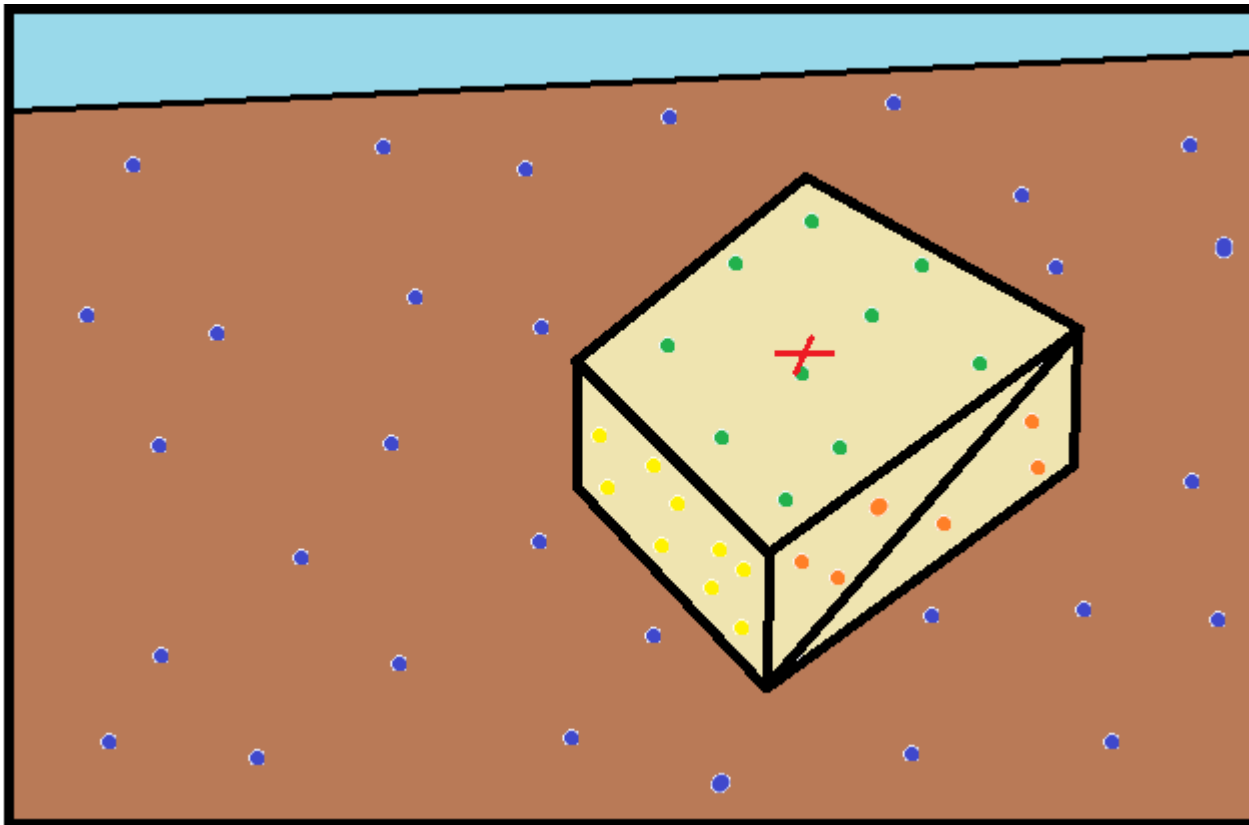
# Methods for Outlier Removal

- RANSAC Homography Calculation
  1. Picks random set of four points and finds homography
  2. Finds number of inliers for found homography
  3. Iterates through 1. and 2. **N** times, picking the homography with the most inliers
  4. Outputs best homography



# Methods for Outlier Removal

- But RANSAC is not sufficient

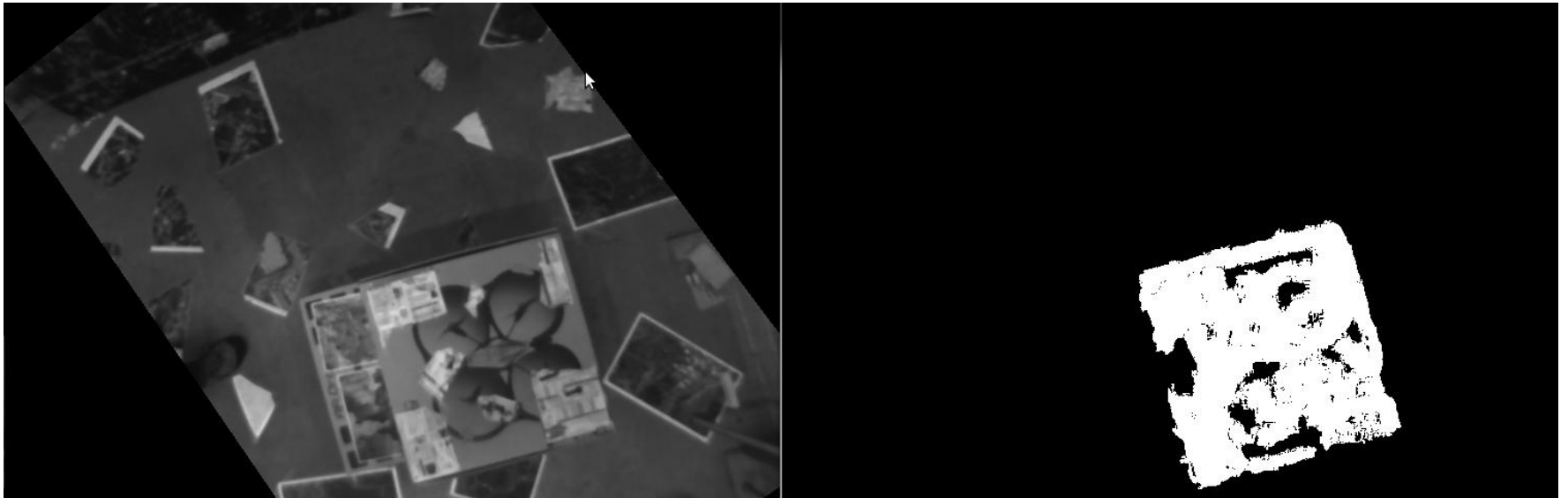


# Methods for Outlier Removal

- Filter features using landing plane map
  - Pros
    - Accurate if a dense landing map
  - Cons
    - Map is often full of holes

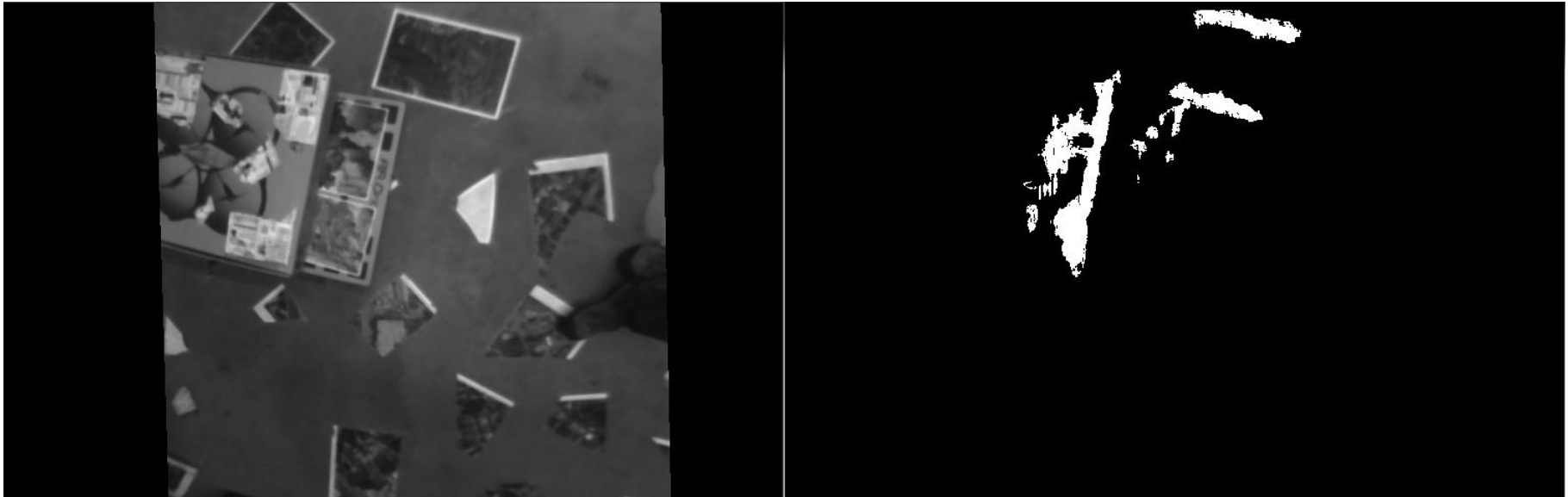
# Methods for Outlier Removal

- Good Landing Map



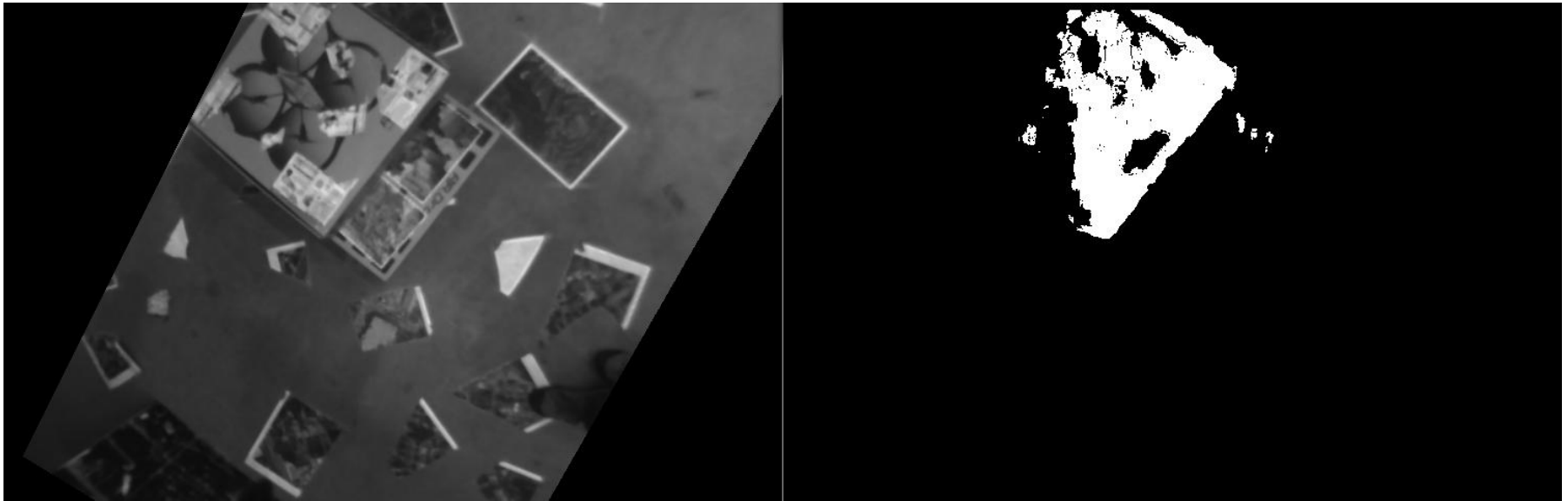
# Methods for Outlier Removal

- Bad Landing Map



# Methods for Outlier Removal

- Partial Landing Map = Bad Landing Map

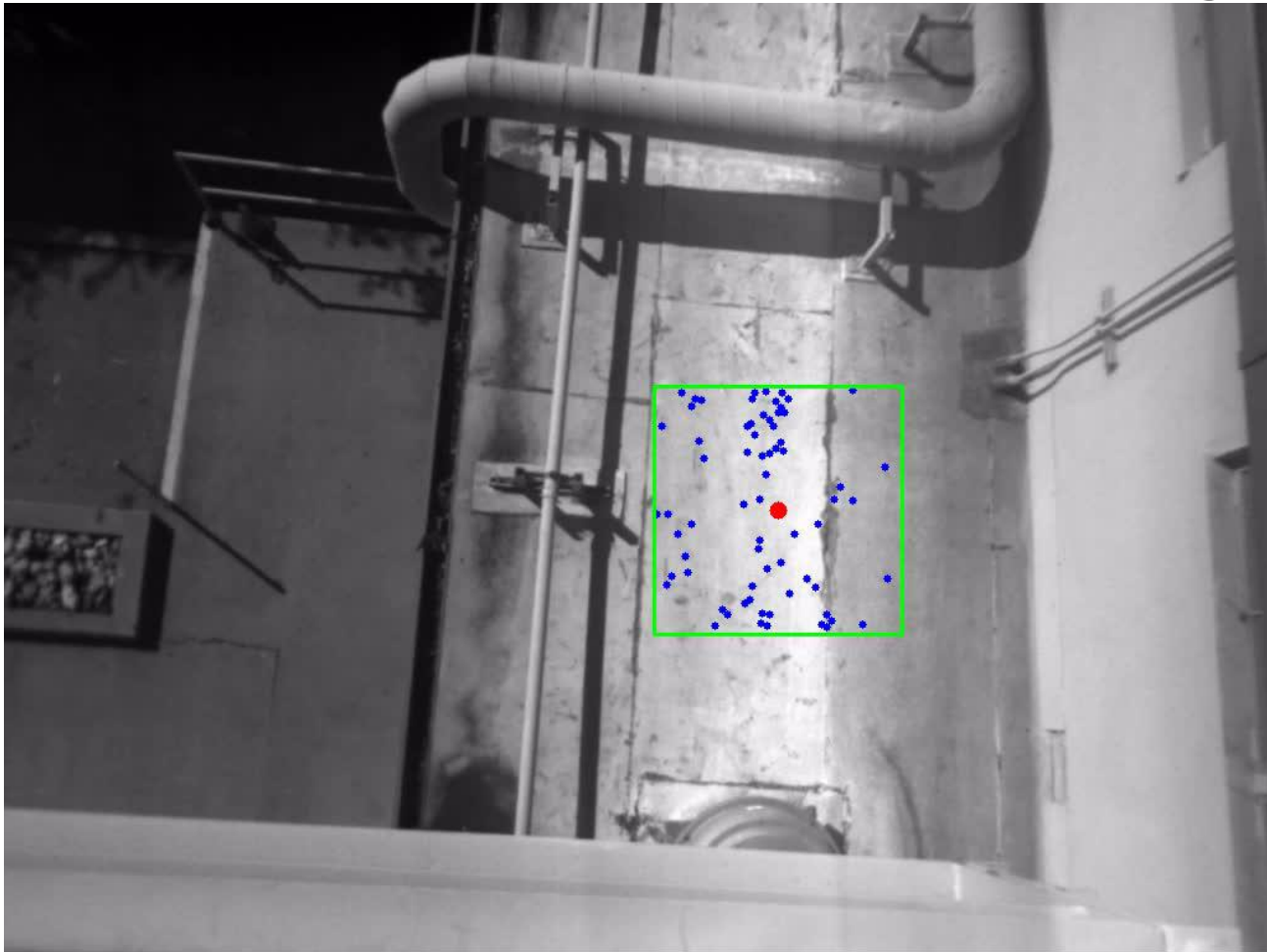


# Methods for Outlier Removal

- Use features within ROI around landing point
  - Pros
    - Accurate if enough points present
  - Cons
    - Lack of texture around landing point
    - Not always enough points around ROI
    - Size of ROI depends on height from plane

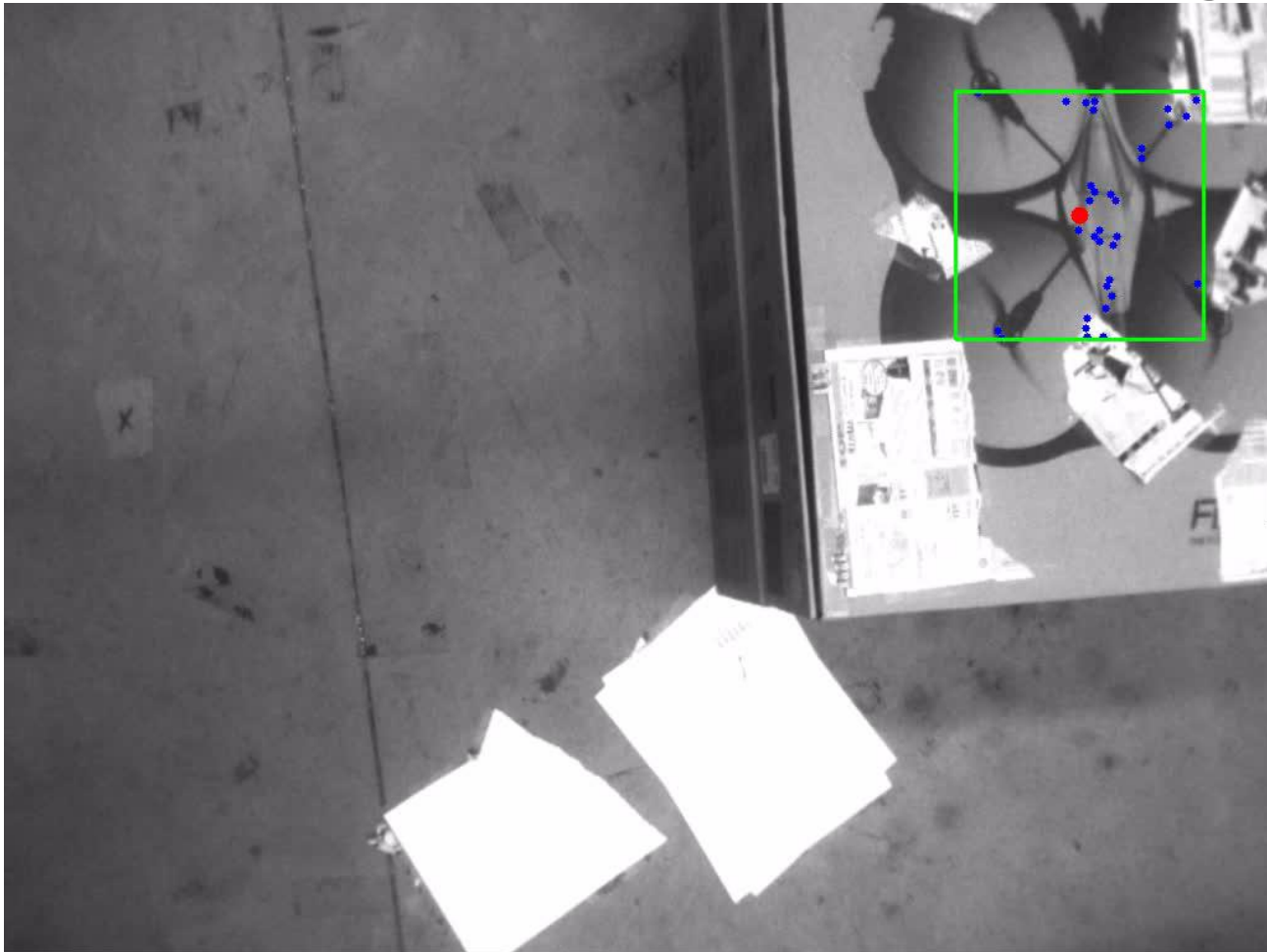
# Methods for Outlier Removal

- Use features within ROI around landing point



# Methods for Outlier Removal

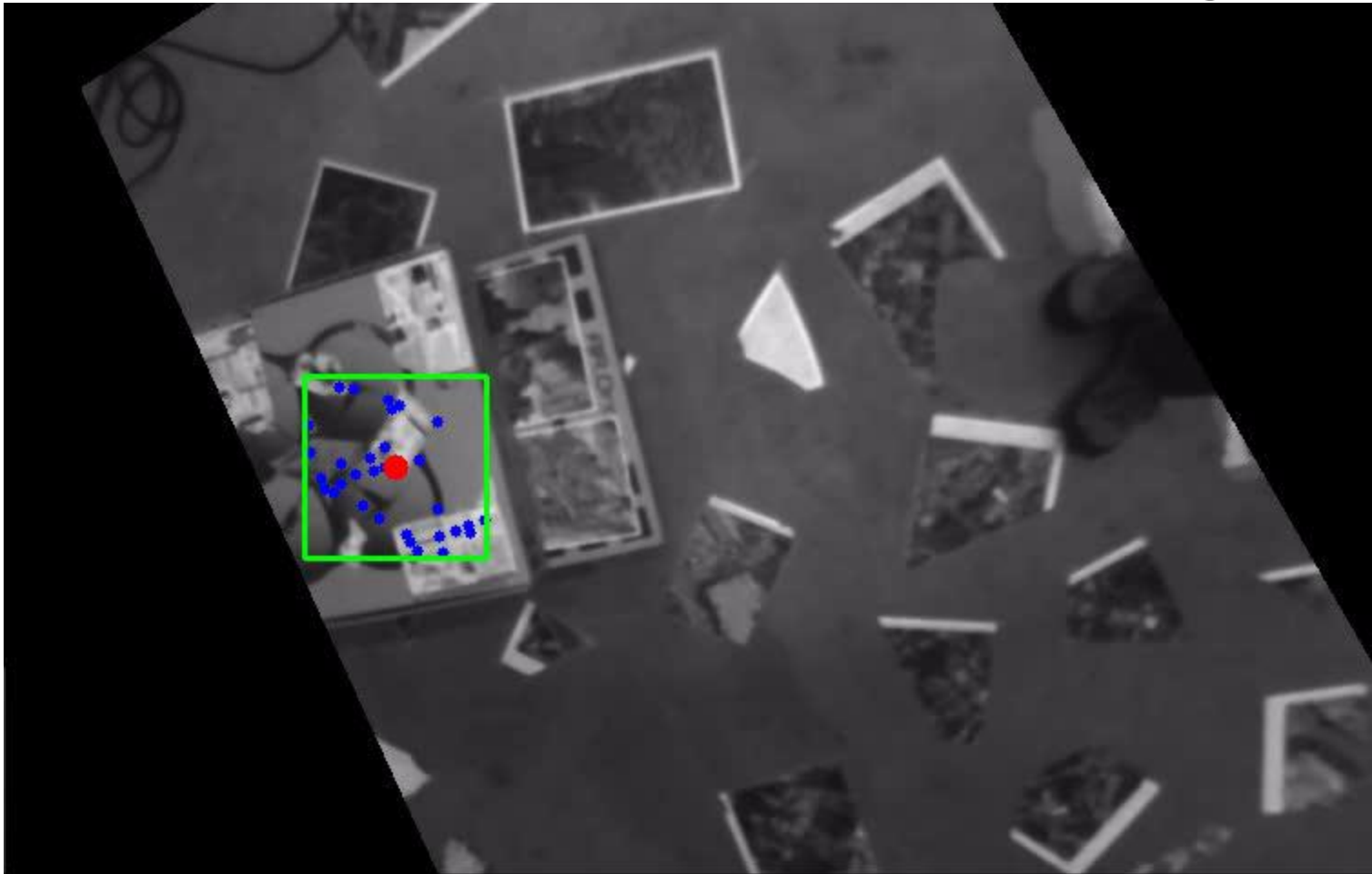
- Use features within ROI around landing point





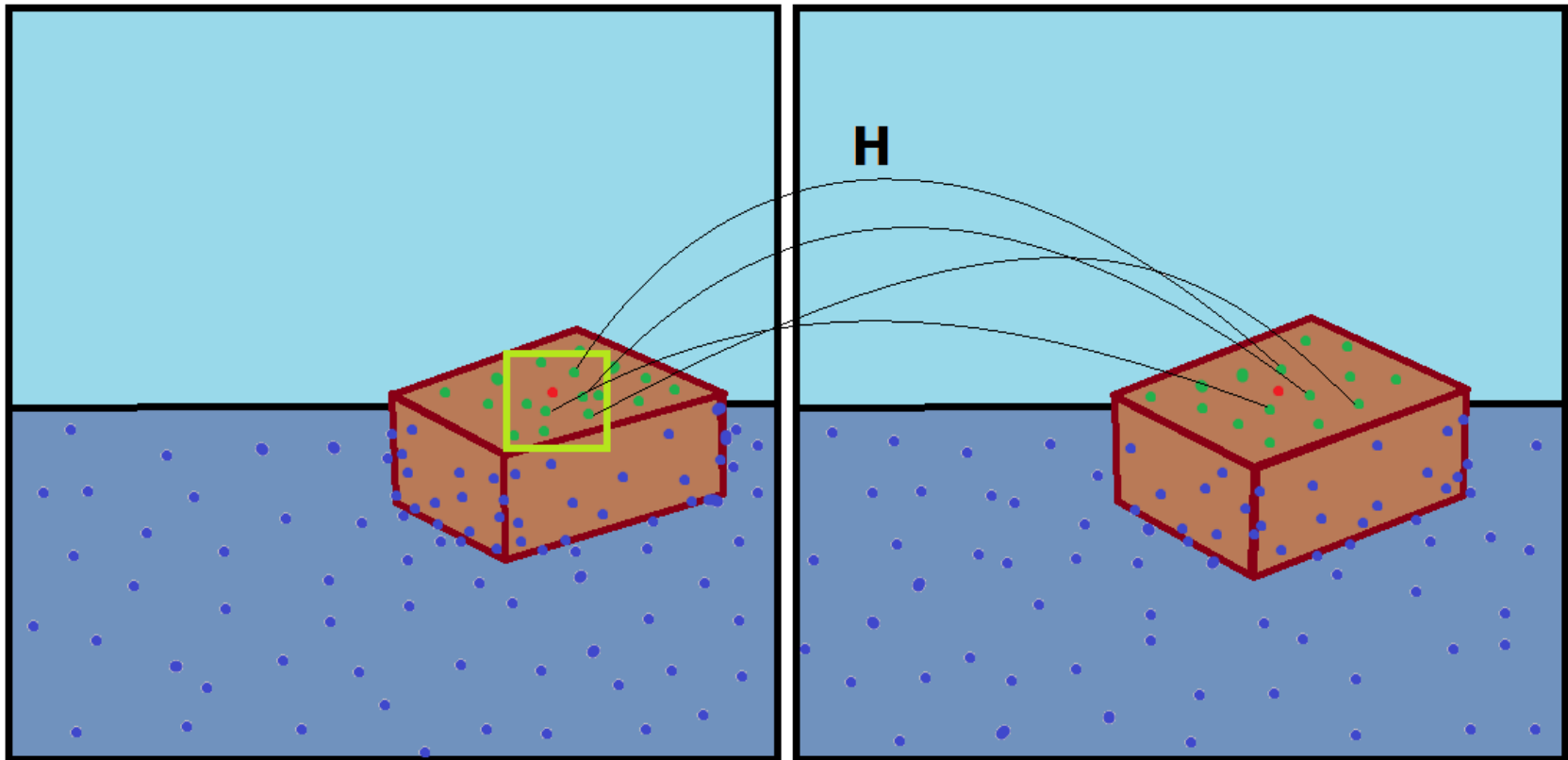
# Methods for Outlier Removal

- Use features within ROI around landing point



# Methods for Outlier Removal

- Use homography to find features of plane



# Methods for Outlier Removal

- Use homography to find features of plane
  - For first image pair, use ROI around landing point to find homography
  - Map old matched points in the image using homography
  - Find error between these mapped values and the new matched points
  - Keep features with very small error

# Methods for Outlier Removal

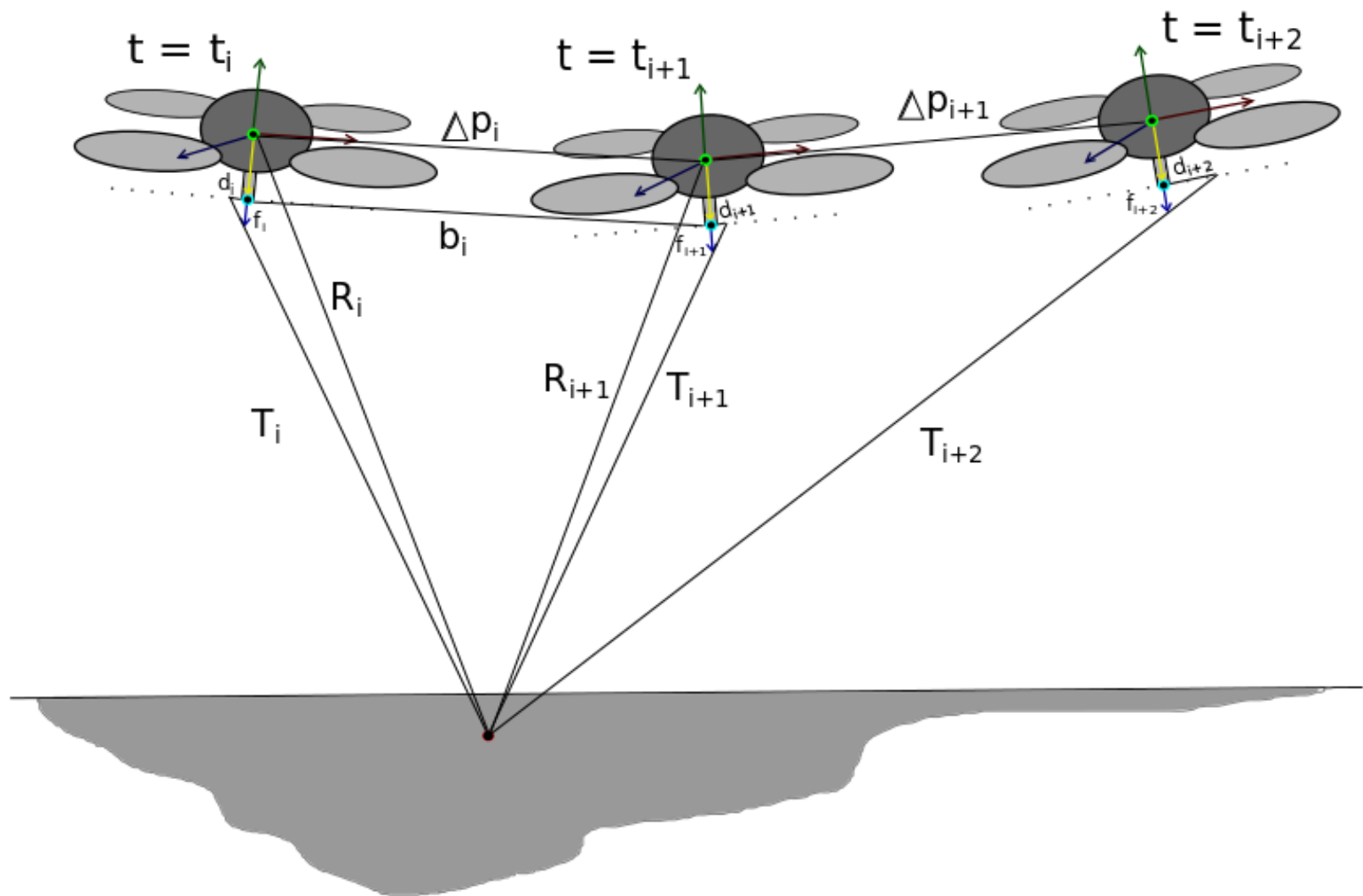
- Initial Results



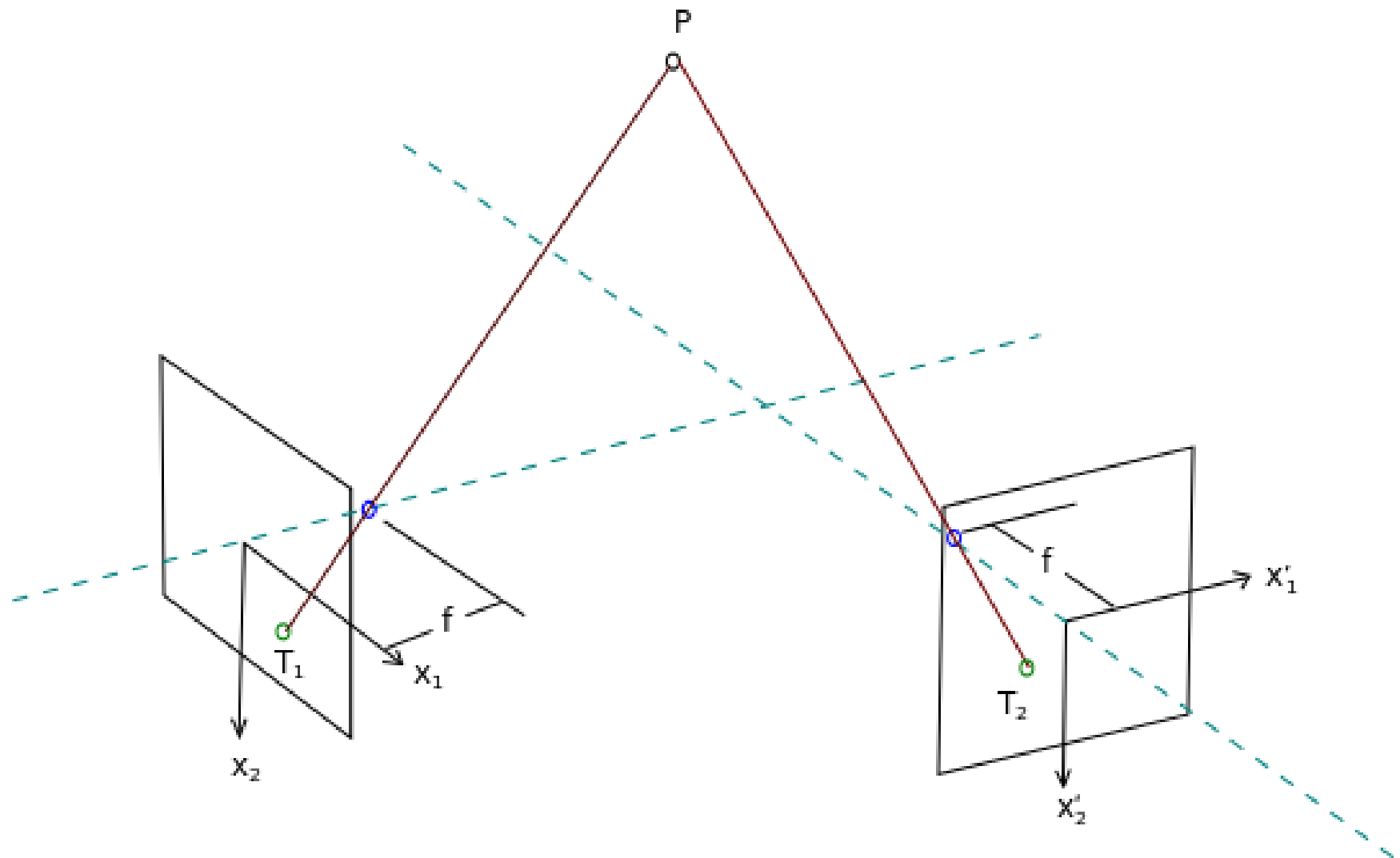
# Approach ~ 3-D Vector Generation

- Uses pose estimation and simple pinhole camera model
  - Pros
    - Efficient to calculate
  - Cons
    - Pose estimate is noisy, so error exists

# Approach ~ 3-D Vector Generation



# Approach ~ 3-D Vector Generation



# Summary of Results

- Working tracking code utilizes JPL code for:
  - STAR feature point detection
  - SURF descriptor generation
- OpenCV Library robustness and efficiency not sufficient, using JPL code instead
- Three dimensional vector generation
  - Needs more testing



# Future Work

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- Finish development of homography based outlier removal
- Test 3-D vector generation software on real data set or quadrotor

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# Thanks

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# Questions?

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