## Problem

- Golfers lose golf balls to slices and rough terrain.
- Affordable drones with onboard cameras can be used to take images of the ball but lack enough computational power to perform high speed tracking.

## Offloading Drone Computation to the Edge

- Insufficient computation make onboard calculations impractical.
- Low Latency requirements make cloud computation impractical.

### **Our Solution**

- Use nearby edge node to offload computation.
- Has sufficient computational ability and low latency.  $\bullet$

### Architecture



### Approaches

1) Image Tracking – Pivot and track the ball directly for full length of shot. Decided infeasible due to large distances and limitations in tracking.

2) Model Development – Track ball at start of shot and infer physics model. Track ball at end for precise location. The current approach.



# High Speed Object Tracking Using Edge Computing Caleb Phillips, Seyed Hossein Mortazavi, Pan Zhang, Joel Dick, Eyal de Lara Department of Computer Science, University of Toronto









- Pixel density scales with linearly distance
- Tracking algorithms incredibly difficult at higher ranges



## Prediction Using Model Development

- From top down perspective, use 2 images to predict ball trajectory. • Use known width of the ball and pixel width to predict height.
- Develop physics based model to predict landing point and turn to view.
- Takes 1.25 seconds to turn the drone 75 degrees, far enough to keep ball in line of sight for an approx. 200 yard drive



- Edge detection used to estimate ball distance from drone.
- Ball height can be inferred because height of drone is known.



- Distance: 30 feet Diameter: 20 px
- 1.68 inches = 11 px



- Distance: 393 feet
- Diameter: 5 px
- 1.68 inches = 1 px



## Why is it difficult?

- where to turn the drone gimbal.

### Experiments



- Tracking ball from various heights.



- Indoor dome with measured land marks
- lands (required for verification)

### Future work and other applications

- other domains.



• Ball can be reasonably tracked by the drone within ~**30 feet.** • At this distance, a slower drive will stay in frame for **500 milliseconds**. • Latency to send video from the drone to controller is **220 milliseconds**. • Additional latency if the controller is not directly connected to the edge. Additional latency to return instructions from the edge to the drone. • This leaves us with ~100 milliseconds of computation time to decide

• Tracking with OpenCV becomes error prone at heights above 30 feet.

Drone captures the first few frames and also records the places the ball

Ideally the difficulty of the problem will allow us to use our methods in

E.g. Offloading Computation for IoT devices performing; Tracking of Vehicles, Facial recognition, search and rescue, sports monitoring etc.