

# Milestone I Presentation

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## FPGA-Based Machine Learning on a Drone

### Capstone Team 109

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<https://capstone-skynet.github.io>



# Presentation Overview

Context and Purpose

Requirements

Constraints

Viability of the Project

Risks

Risk Mitigation

Solution Path

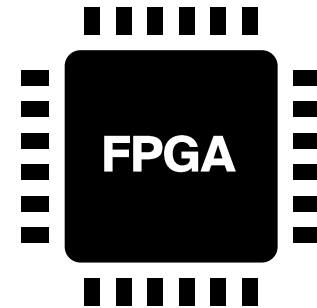
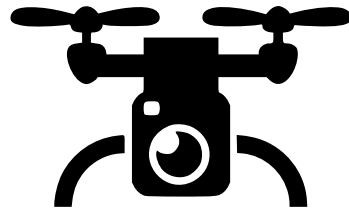


**Why?**

# Context & Purpose

Increasing ***machine learning*** and ***drone*** applications

No existing combination of FPGA + ML + drone on the market



# Context & Purpose

Want to combine all of them → ***computing platform***

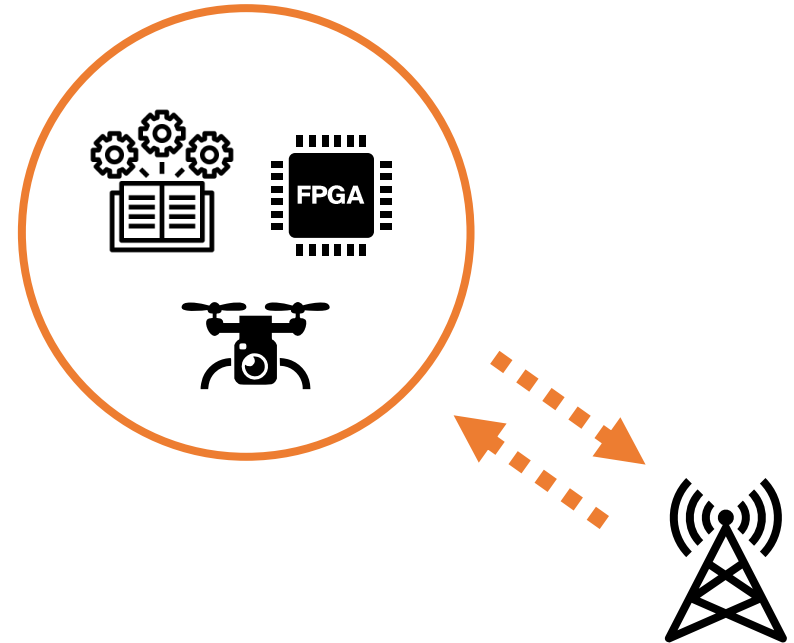
Accelerate ML using FPGA

FPGA on deployed on the drone

For client's **ML research**

Communicate with ground station

Detect pedestrians from above





detecton\_04  
confidence: 0.95  
err: 0.16



detecton\_00  
confidence: 0.95  
err: 0.08



detecton\_03  
confidence: 0.88  
err: 0.06



detecton\_07  
confidence: 0.92  
err: 0.11



detecton\_02  
confidence: 0.99  
err: 0.11



detecton\_01  
confidence: 0.99  
err: 0.06



detecton\_17  
confidence: 0.57  
err: 0.21



detecton\_16  
confidence: 0.65  
err: 0.23

# Requirements & Constraints



# Requirements

## Integrated Drone Requirements

- Capable of flying with the computing platform
- Flight duration at least 10 minutes
- Remote controlled by the pilot





# Requirements

## Drone Legal Requirements

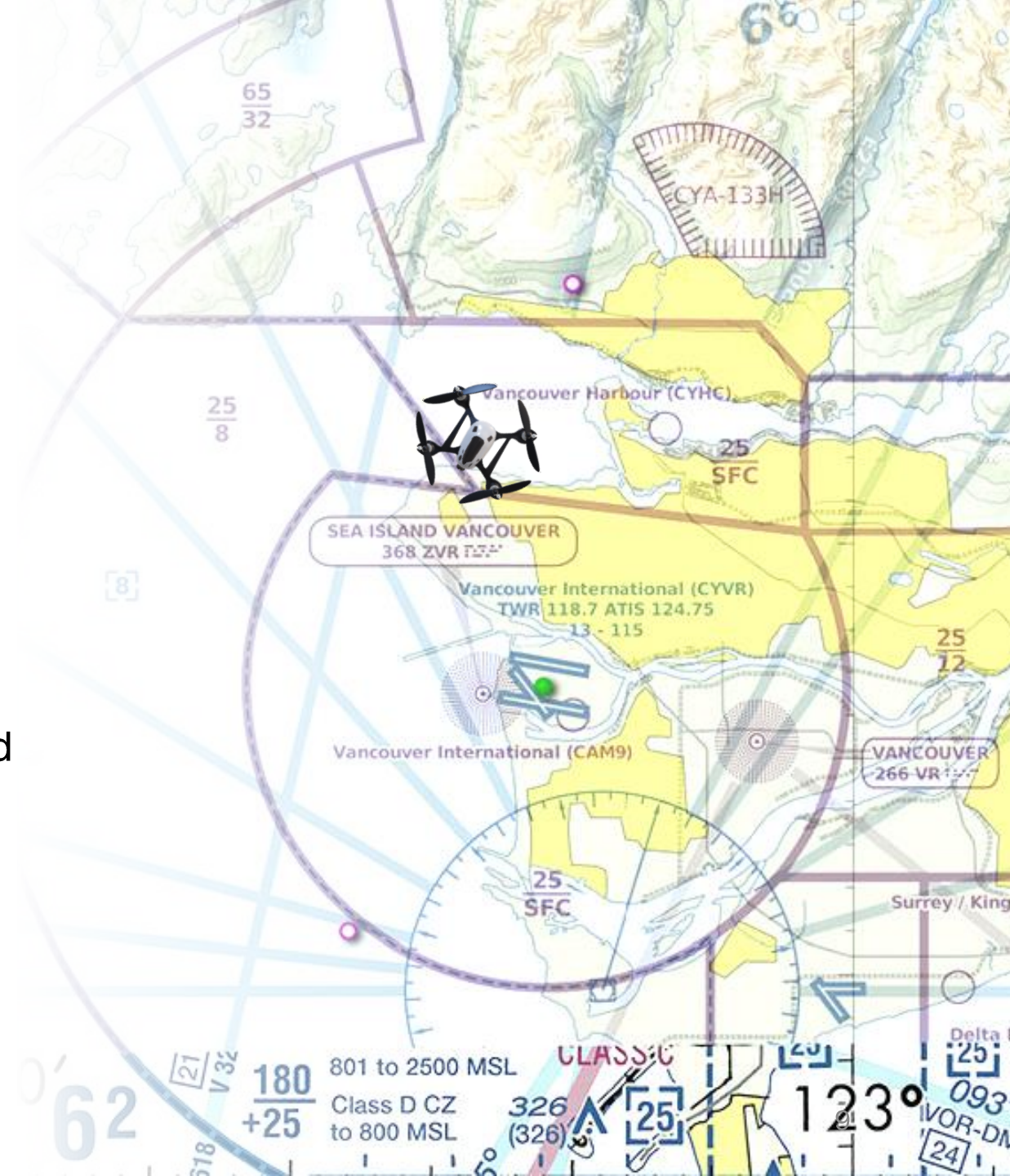
- Operation is compliant with *Transport Canada*
- Tests inside YVR controlled airspace is permitted



Government  
of Canada

Gouvernement  
du Canada

2019-10-18



# Requirements

## Data Transmission Requirements

- Data processed on the drone transmitted to ground station
- Ground station receives and display data to the operator
- Transmission via WiFi (2.4GHz or 5.2GHz)



## Machine Learning Requirements

- Machine learning model fits on FPGA
- Model detects pedestrians and outputs bounding boxes



# Requirements

## Data Transmission Requirements

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## Machine Learning Requirements

- Machine learning model fits on FPGA
- Model detects pedestrians and outputs bounding boxes



# Constraints



## Time & Budget

Limited to C\$1,000

Limited time to perform 2 sub-projects

Coordination and leadership is challenging



## Future-Proofing

FPGA chip area big enough for future ML models



## Power & Weight

Battery power is limited

Weight and power draw affects flight duration

Portability



## Data Transmission

Limited bandwidth for data

Limited power emission

Limited range

**Viable?**

# Viability

Assess system feasibility on 3 objectives:

**1**

Integration of FPGA with  
a Drone

**2**

Air-to-Ground Data  
Transmission

**3**

ML Implementation on  
FPGA

# Viability

All three objectives individually has existing solutions

1

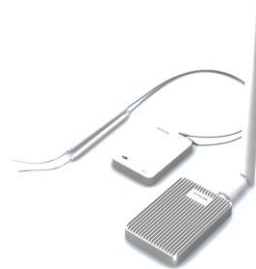
Integration of FPGA with a  
Drone



Aerotenna FPGA  
flight controller

2

Air-to-Ground Data  
Transmission



DJI DATALINK

3

ML Implementation  
on FPGA



SymbioticEDA  
MARLANN



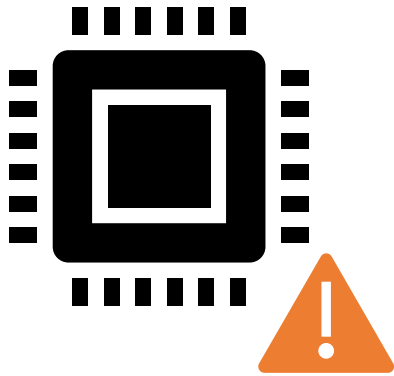
# Viability

Combination of the three will further this field of research

This project is a **proof-of-concept**

# Risks?

# Risks



## Hardware

Flight crashes  
Loss of FPGA  
Loss of drone



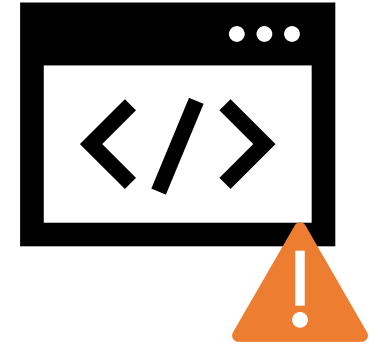
## Management

Insufficient commitment  
Poor task management  
Poor decision making



## Legacy

Low repairability /  
maintainability  
Client doesn't know  
how to operate



## Software

Tech. debt  
Inadequate  
documentation

# Risk Management

We keep track of an updated copy of the **risk profile**

**Active mitigation** on risks with index  $\geq 0.4$

Triage tasks to mitigate risk

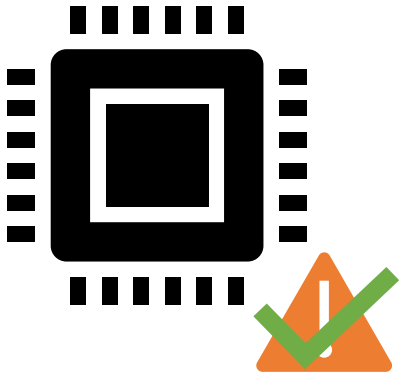
Weekly update on risk status

**Passively monitoring** on risks with index  $< 0.4$

Table 2: Risk Profile			
Risk description	Likelihood	Impact	Risk (.)
Drone flight hardware (flight controllers, radio, motors) cannot function due to crashes and/or damage	0.9	1.0	0.90
Payload is too heavy which significantly increases drone motor requirements and significant reduction in flight duration	0.8	0.8	0.64
Accidents that damage the drone and computation equipment that require extra budget that we may not have	0.6	0.9	0.54
Total loss of drone hardware and payload during flight	0.5	1.0	0.50
Not enough time commitment from team members	0.7	0.7	0.49
Access to tools and shops for modifying and repairing drone hardware is inadequate or non-existent	0.6	0.8	0.48
Underestimation of project scope or work required, leading to insufficient time management and burn outs	0.5	0.9	0.45
Payload is too heavy which exceeds total take-off weight	0.4	1.0	0.40
Legacy documents for the project are insufficient, resulting in poor maintainability/extendability for the client	0.7	0.5	0.35
Financial inefficiencies leading to budget overruns or lack of capital	0.4	0.8	0.32
Constrained to purchase lower-quality components due to budget, resulting in lower performance	0.6	0.5	0.30
Team is indecisive or cannot make a timely decision — resulting in delay	0.4	0.6	0.30
Development and management technique/methodology is not effective, leading to productivity losses	0.4	0.7	0.28
Not enough time to work on documentation	0.7	0.4	0.28
Not enough machine learning training data	0.5	0.5	0.25
Not enough FPGA logic elements to implement a desired ML model	0.5	0.5	0.25
Failure to acquire regulatory compliance resulting in inability fly drone legally	0.3	0.7	0.21
The software, tools or development environment for the project is inadequate	0.4	0.5	0.20
Knowledge and skill regarding ML is insufficient	0.5	0.4	0.20
Technical debt paydown impacts project timeline	0.4	0.5	0.20
Deliverables fail to meet client's expectations	0.2	0.9	0.18
Client demands modification to the scope and requirements of the project that leads to delays or feature cuts	0.3	0.6	0.18

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# Risk Management



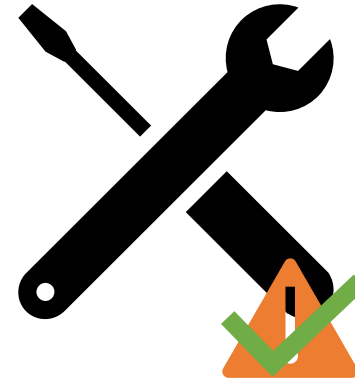
## Hardware

- Follow safety protocol
- Only power on when absolute ready



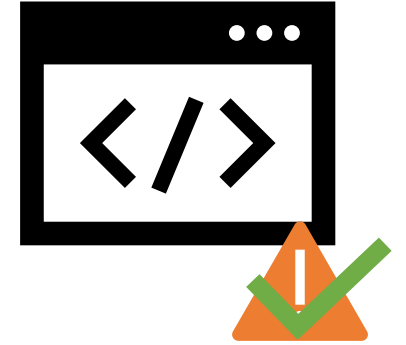
## Management

- Weekly updates and status report on assigned tasks
- Timeline closely tracked



## Legacy

- Actively updating all documents alongside changes

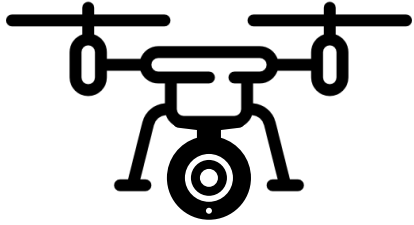


## Software

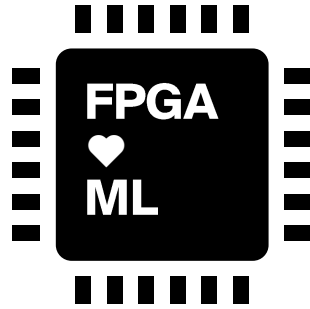
- Version tracking
- Code review

# Solution?

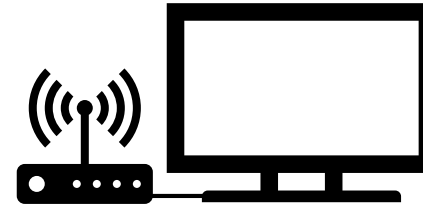
# Deliverables



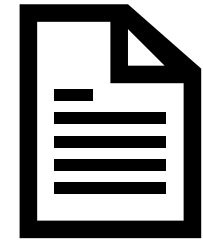
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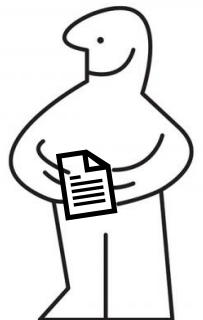
1x



1x

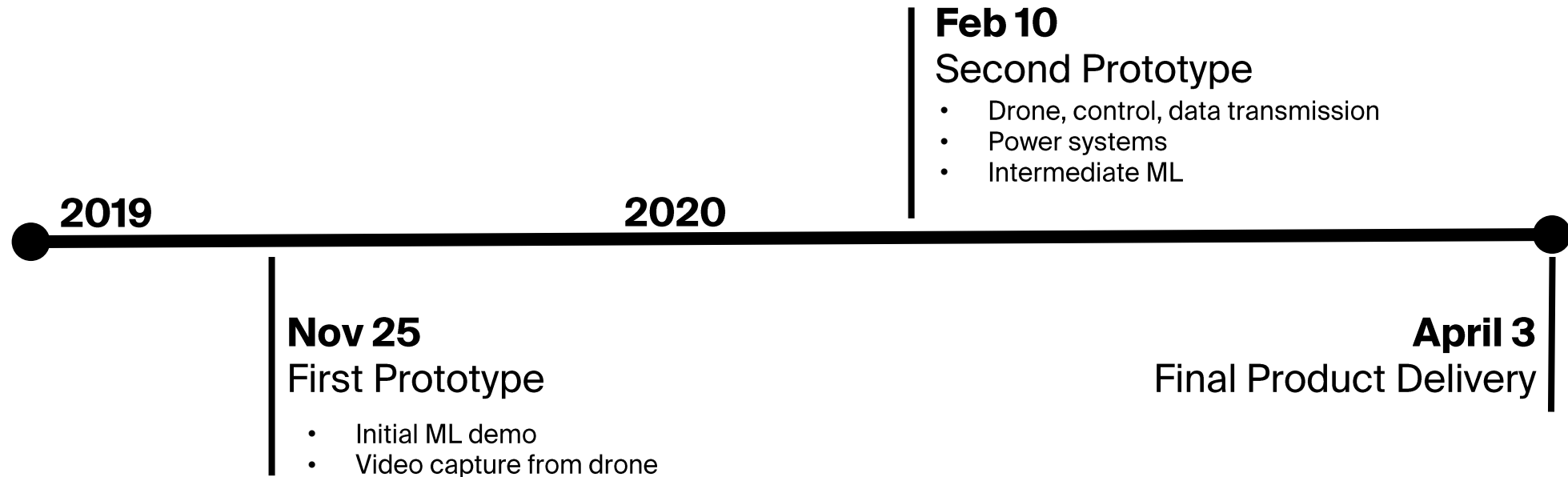


5x





# Deliverable Dates



# Immediate Steps



## Start **Small**

- Function over scale
- Integrate existing model



## Start **Quickly**

- Create purchasing plans
- Tool setup takes time



## Start **Legally**

- Drone registration
- Pilot and radio certifications

Q?

# Q?

## Context & Purpose

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No existing combination of FPGA + ML + drone on the market



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4

## Context & Purpose

Want to combine all of them → **computing platform**  
Accelerate ML using FPGA  
FPGA on deployed on the drone  
For client's **ML research**  
Communicate with ground station  
Detect pedestrians from above



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5

## Requirements

### Integrated Drone Requirements

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6

## Requirements

### Drone Legal Requirements

- Operation is compliant with Transport Canada
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10

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11

## Constraints

### Time & Budget

- Limited to C\$5000
- Limited time to perform 2 sub-projects

### Future-Proofing

- FPGA chip area big enough for future ML models

### Power & Weight

- Battery power is limited
- Weight and power draw affects flight duration

### Portability

### Data Transmission

- Limited bandwidth for data
- Limited power emission
- Limited range

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12

## Viability

Assess system feasibility on 3 objectives:

1

Integration of FPGA with a Drone

2

Air-to-Ground Data Transmission

3

ML Implementation on FPGA

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13

## Viability

All three objectives individually has existing solutions

1

Integration of FPGA with a Drone



Artemis FPGA flight controller

2

Air-to-Ground Data Transmission



DJI DATA LINK

3

ML Implementation on FPGA



SyntheticGDA IMPLANT

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14

## Viability

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This project is a **proof-of-concept**

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15

## Risks



**Hardware**

- Flight crashes
- Loss of FPGA
- Loss of drone



**Management**

- Insufficient commitment
- Poor task management
- Poor decision making



**Legacy**

- Low reparability / maintainability
- Client doesn't know how to operate



**Software**

- Test debt
- Inadequate documentation

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16

## Risk Management

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**Active mitigation** on risks with index > 0.4

Triage tasks to mitigate risk

Weekly update on risk status

**Passively monitoring** on risks with index < 0.4



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17

## Risk Management



**Hardware**

- Follow safety protocol
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**Management**

- Weekly updates and status report on assigned tasks
- Timeline closely tracked



**Legacy**

- Actively updating all documents alongside changes



**Software**

- Version tracking
- Code review

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18

## Deliverables



1x



1x



1x



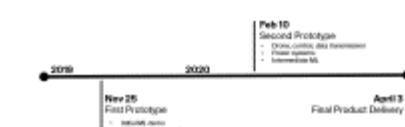
5x



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19

## Deliverable Dates



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20

## Immediate Steps



**Start Small**

- Function over scale
- Integrate existing model



**Start Quickly**

- Create purchasing plan
- Test setup later time



**Start Legally**

- Drone registration
- Pilot and radio certifications

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21

# Milestone I Presentation

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