

# SmartFarm: Computing Research for the Next-Generation of Precision Agriculture



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Univ. of California, Santa Barbara  
**UCSB**



Using Computing to Sustainably Feed a Growing Population Panel  
AAAS Annual Meeting, February 14, 2020

# Precision Agriculture (Ag)

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  - Measure & understand variability
  - Use this information to optimize input use
  - Automate some/all of these steps



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  - Observation (sensing, measuring) & actuation
  - Algorithms: AI, ML, statistical/data analyses
  - Systems: Hardware & software for automation and decision support
  - **Plus** multidisciplinary research collaborations to tailor solutions to Ag



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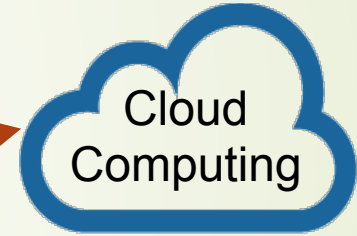
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# The Cloud + Data Analytics Has Revolutionized E-Commerce

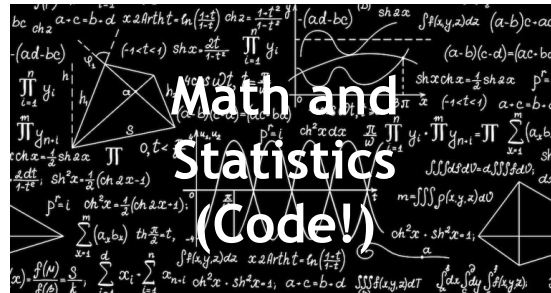


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Cloud Computing Systems



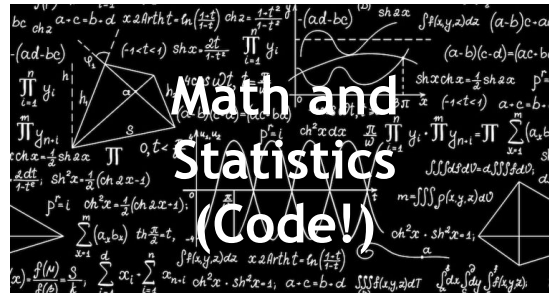
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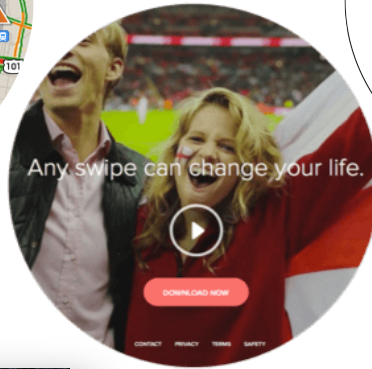
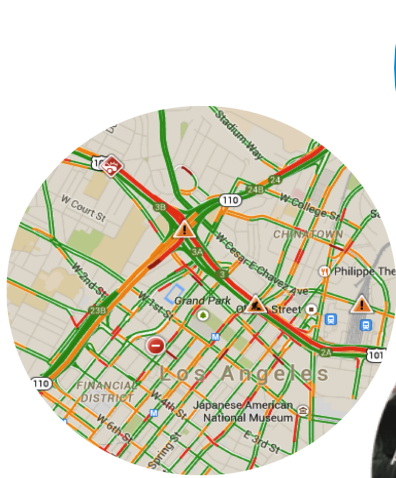
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- What will you buy?
- When will you buy it?
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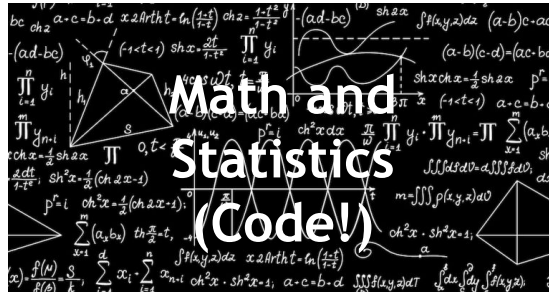
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Can we use it to revolutionize agriculture?



Cloud Computing Systems

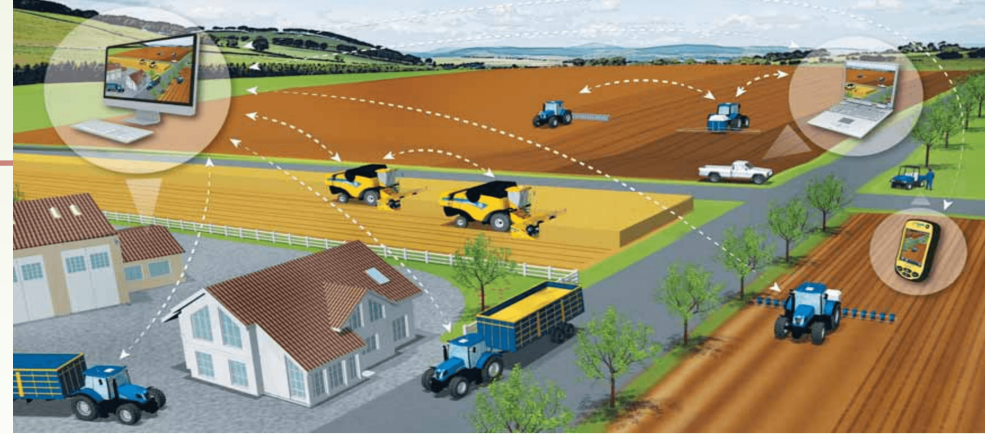


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# Revolutionizing Precision Ag

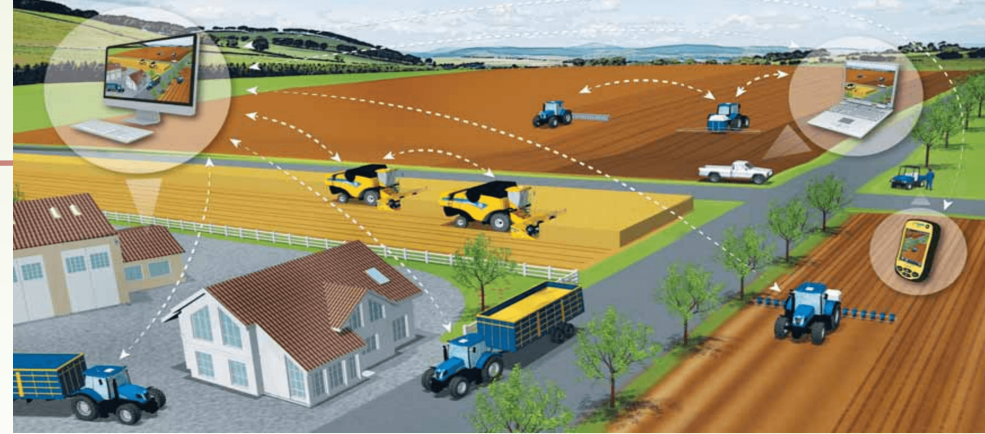
- Sensing, measuring, and monitoring
  - Vast amount of data surrounding the crop lifecycle
    - Weather, records, sensors, imagery, ...
  - Sense/actuate: Internet of Things (IoT)



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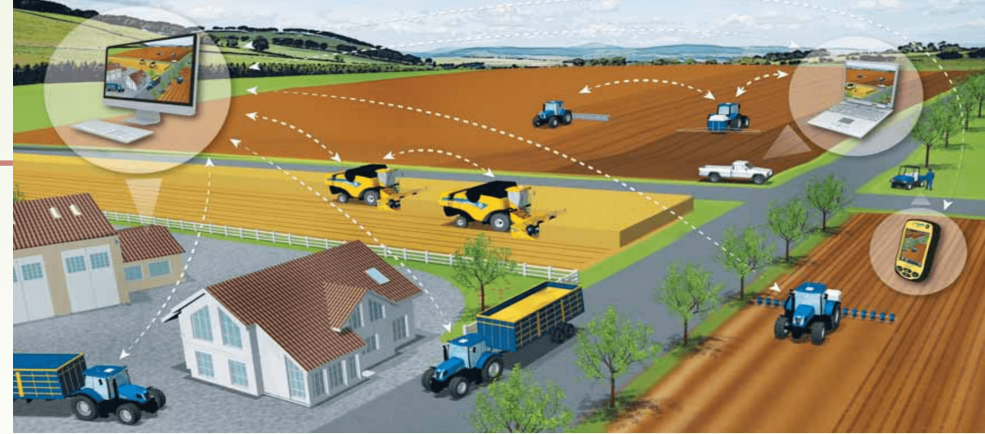
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# Revolutionizing Precision Ag



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**What about the systems?**



# Cloud Systems Were Not Designed for Rural Precision Agriculture

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- Clouds work for large scale data aggregation, processing, sharing
- Rural precision Ag introduces **new challenges**
  - Vast acreage to sense, measure, monitor, actuate, & automate
    - Sensors/actuators: large in number, very low cost, **battery powered** + solar, resource constrained, in harsh environments
    - Can't ship data to cloud: Radio power goes like the square of the distance
    - Many decisions/operations are *purely local* - moving this data is wasteful

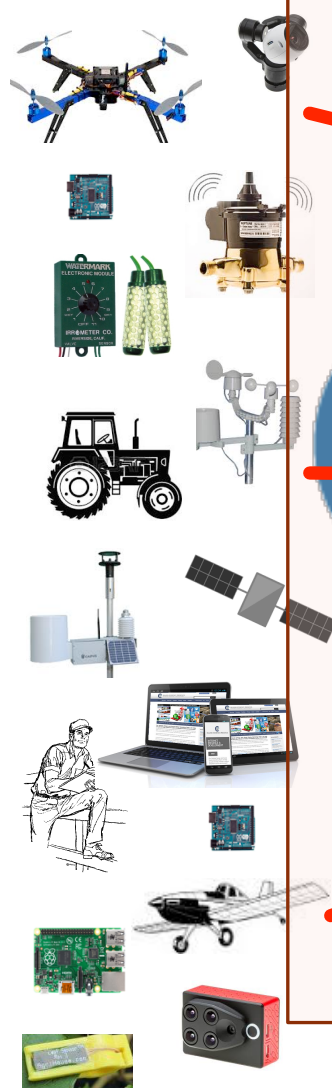
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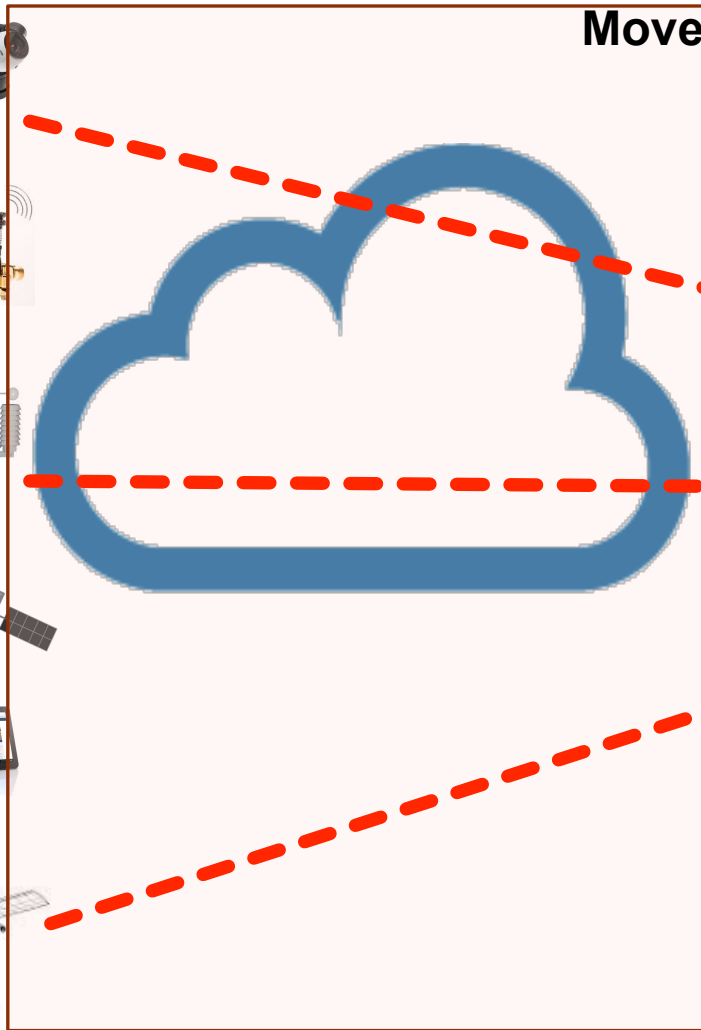
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- Intermittent or no Internet connectivity
- Data privacy = grower's economic advantage



## Sensing Tier

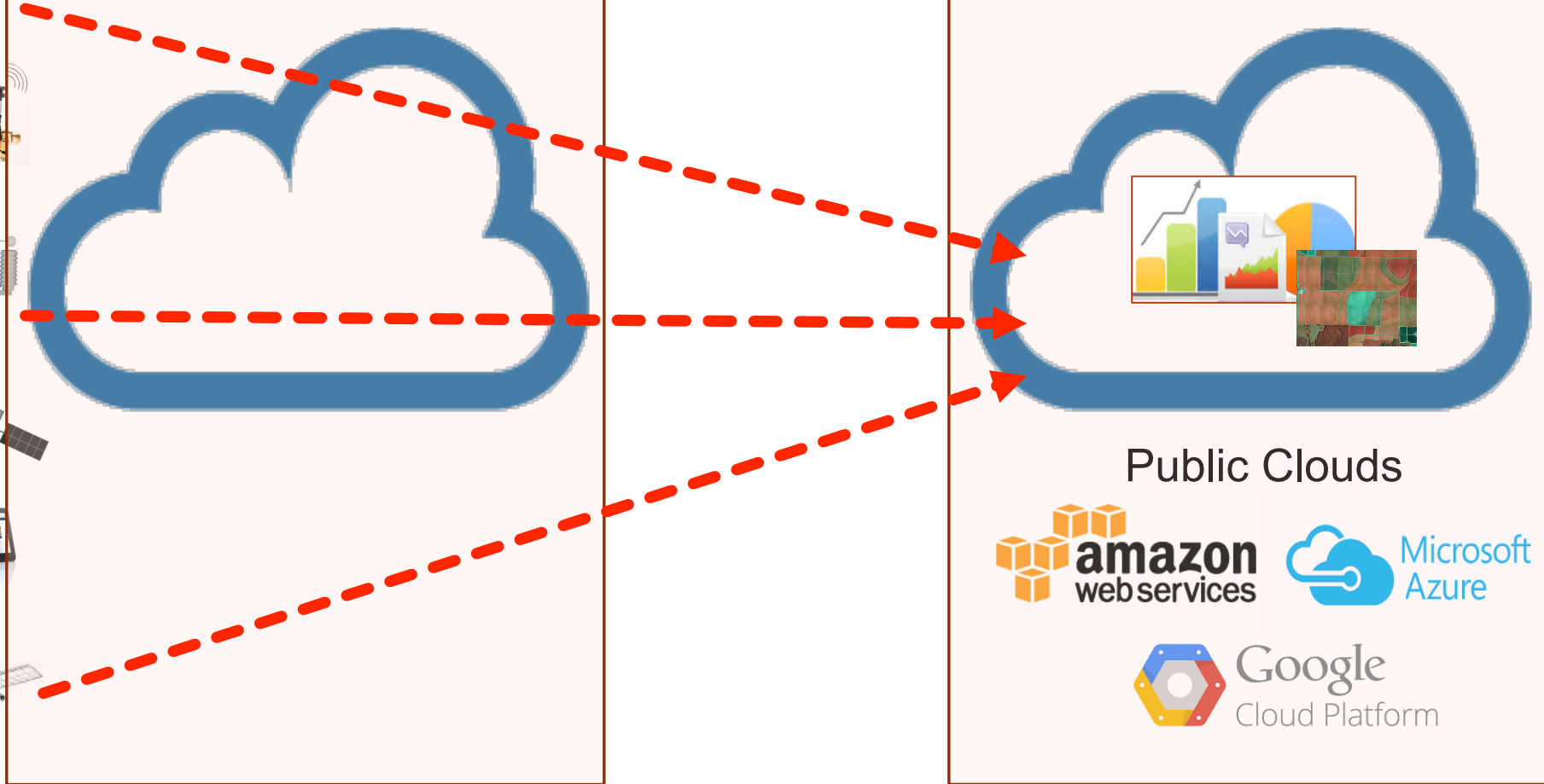


## Edge Tier

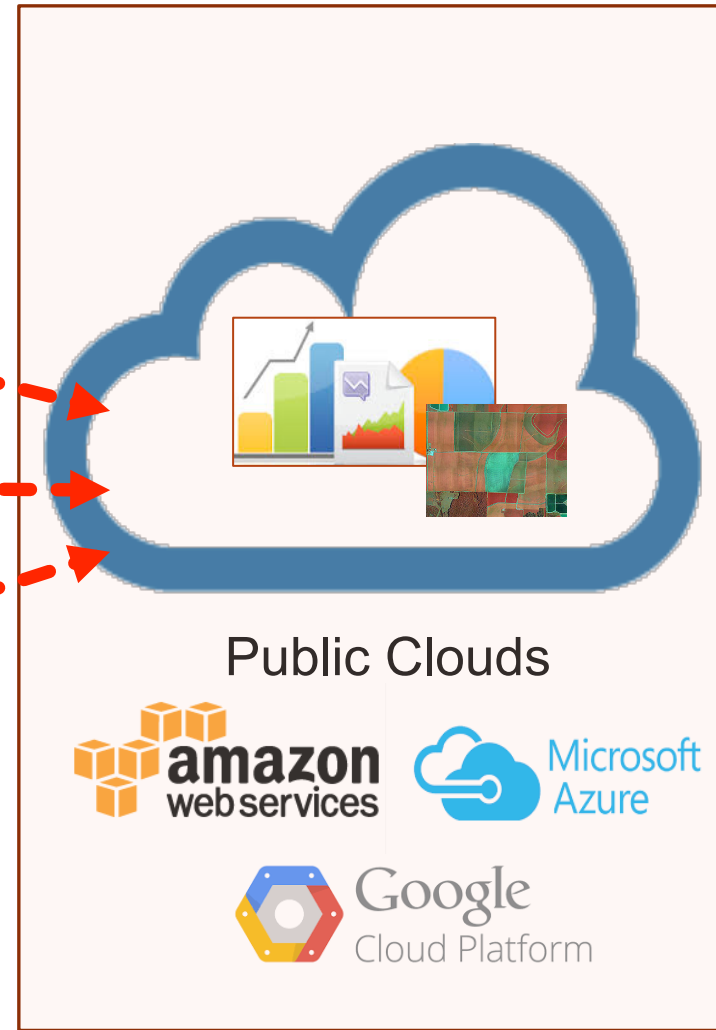


Our Approach:

**Move the cloud (code) to the data**



## Cloud Tier



Public Clouds

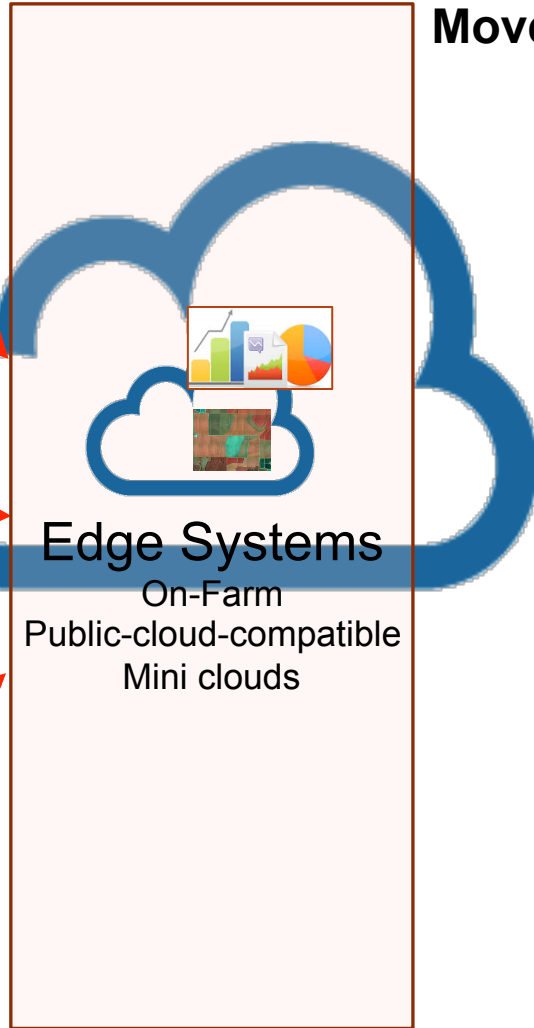


*Resource Rich*

# Sensing Tier



# Edge Tier



Edge Systems

On-Farm  
Public-cloud-compatible  
Mini clouds

*Resource Constrained*

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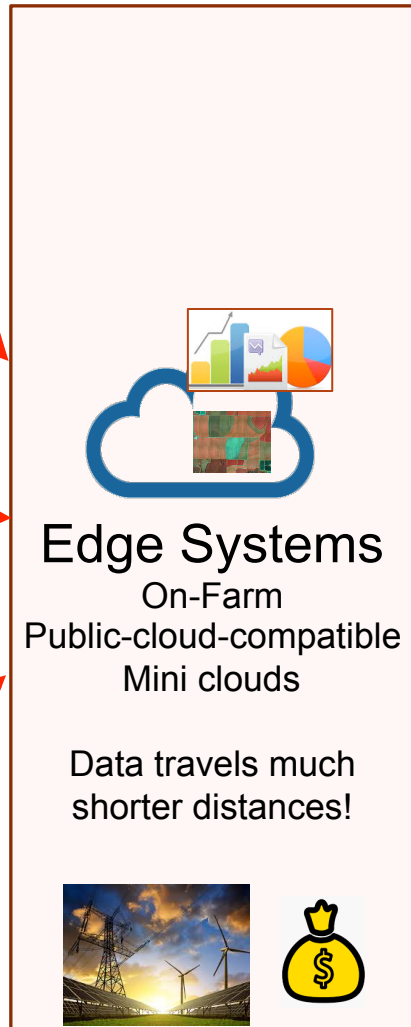
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## Sensing Tier



## Edge Tier



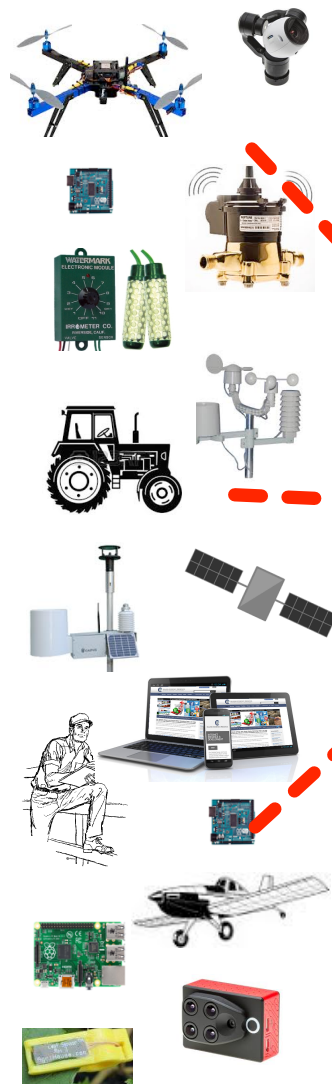
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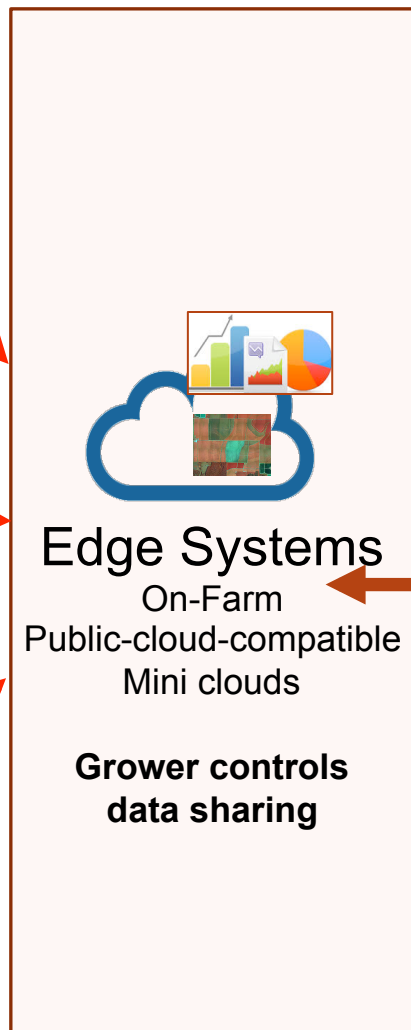
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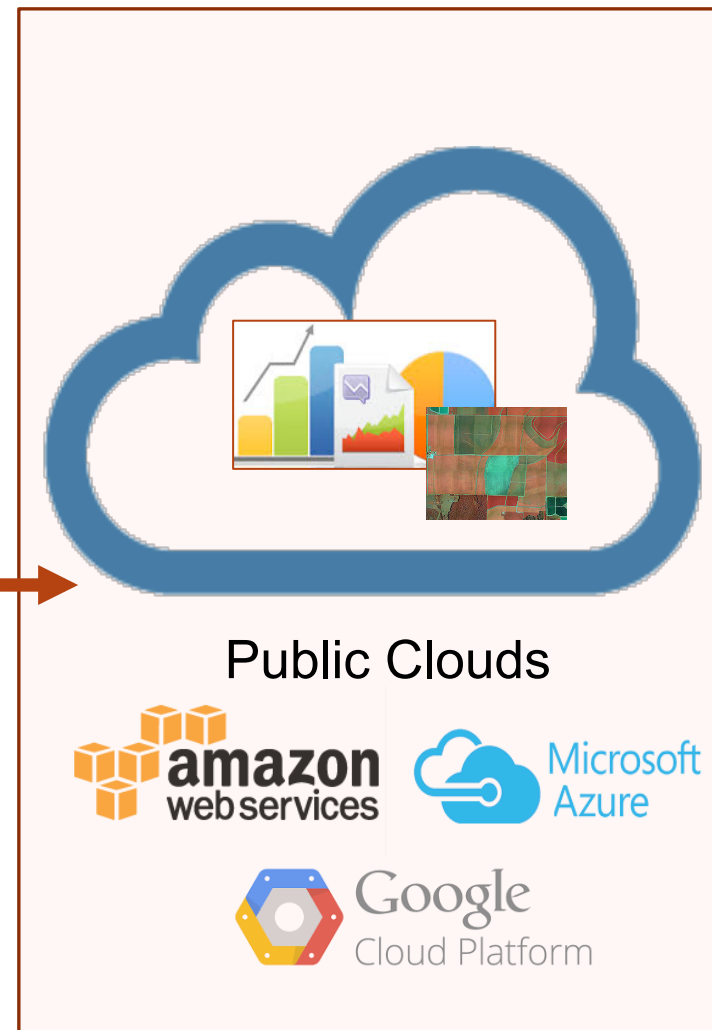
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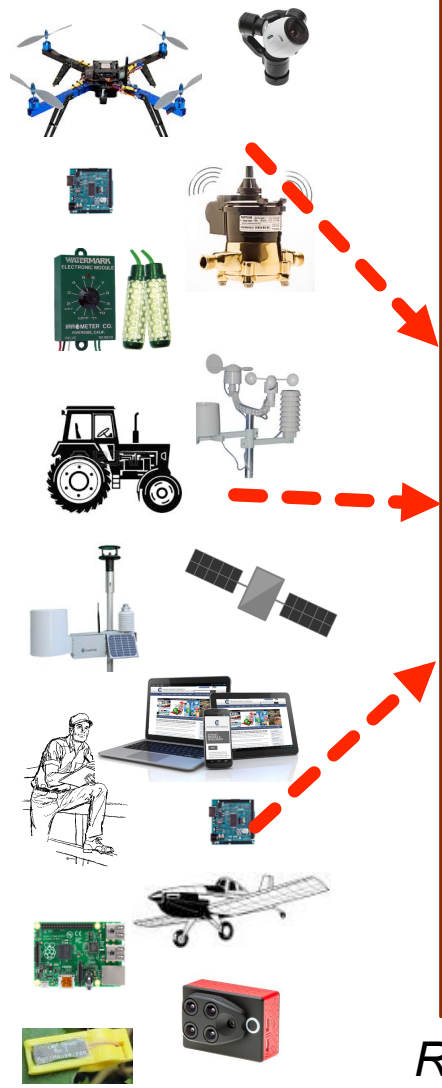
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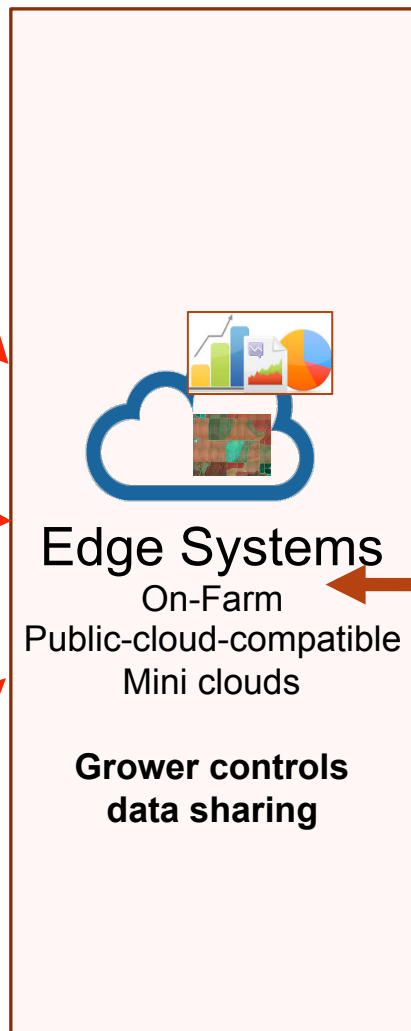


*Resource Rich*

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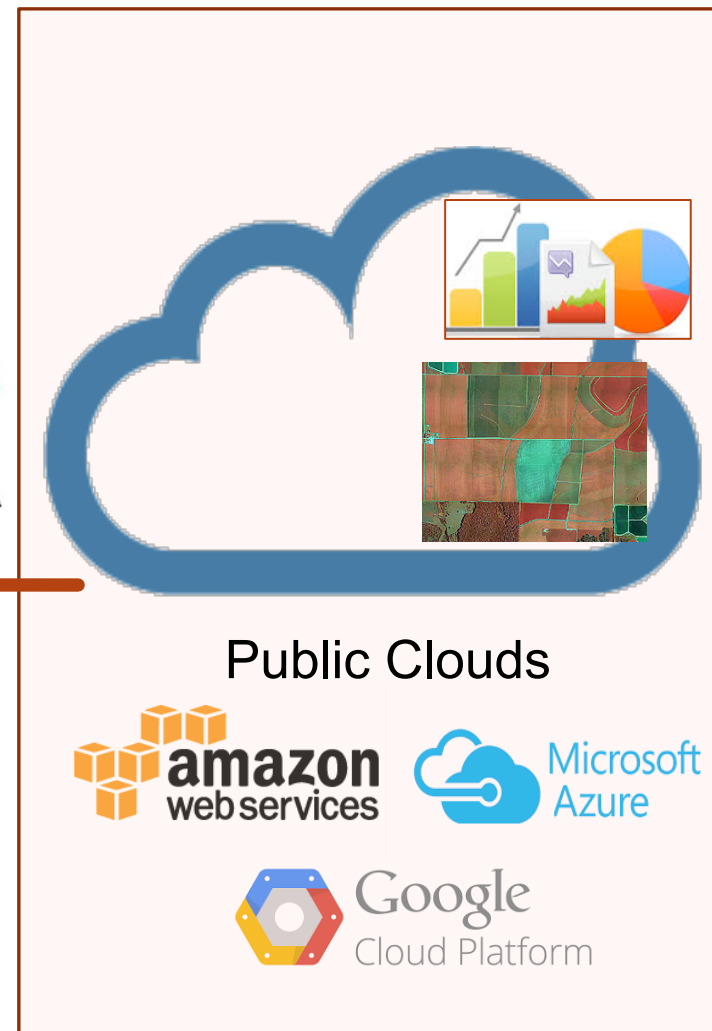
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**Move the cloud (code)  
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Data analytics apps

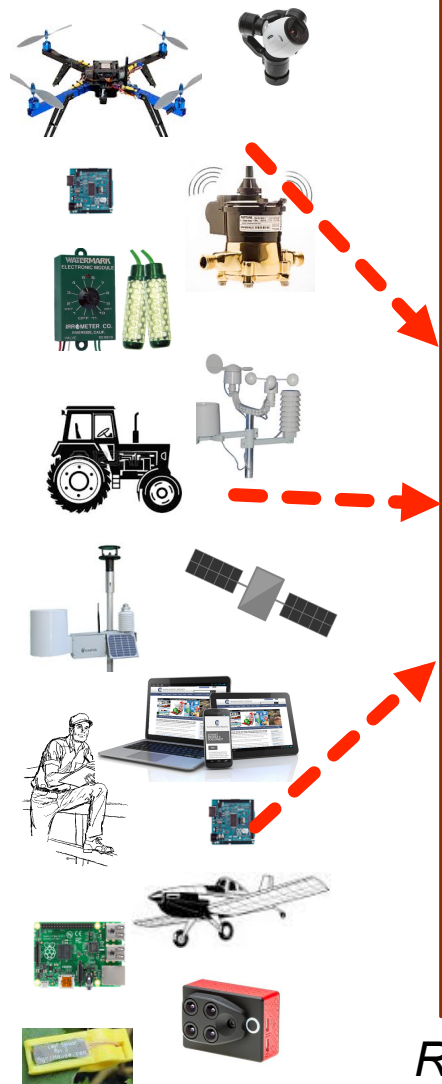
External data sources

## Cloud Tier

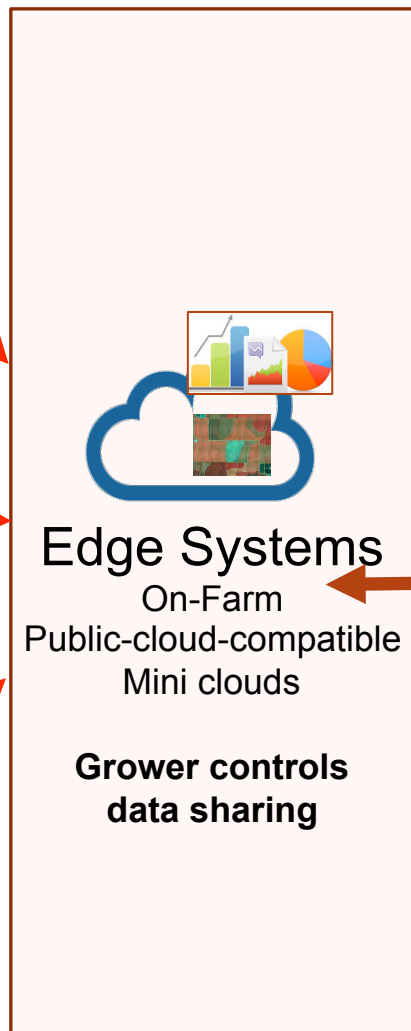


*Resource Rich*

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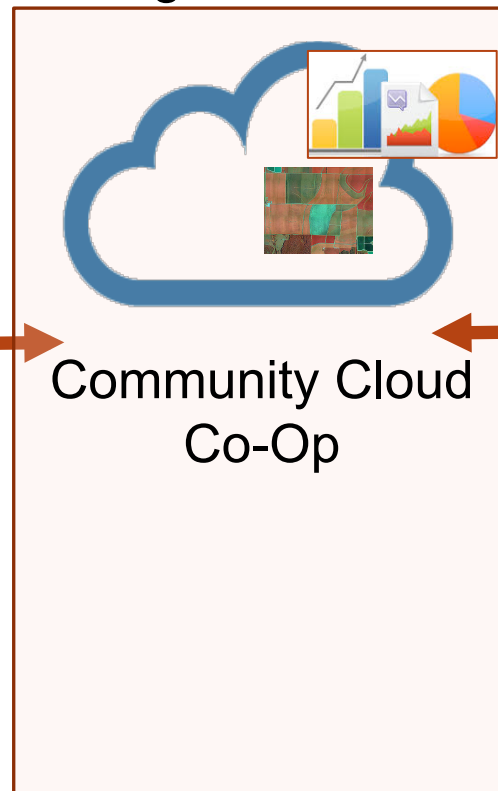
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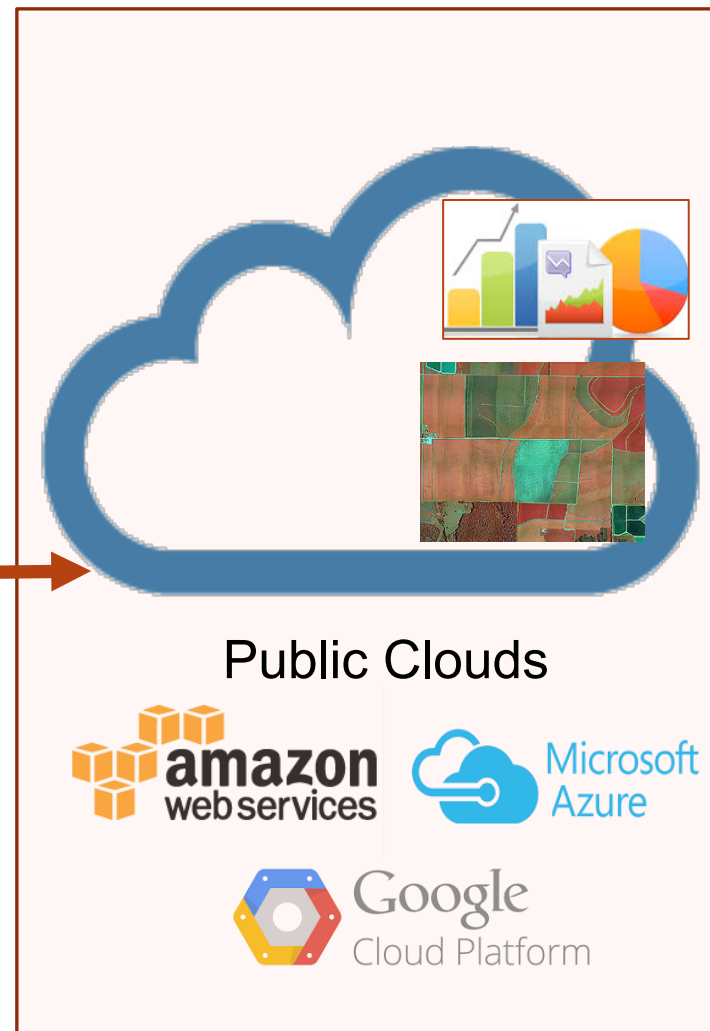
*Resource Constrained*

Our Approach:  
**Move the data ONLY  
as far as required**

## Regional Tier



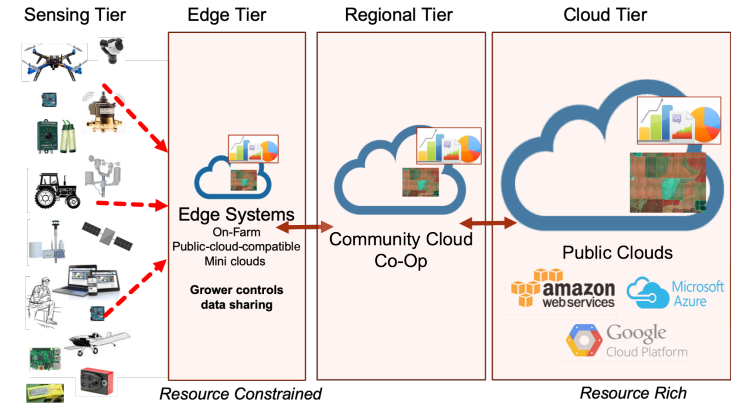
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*Resource Rich*



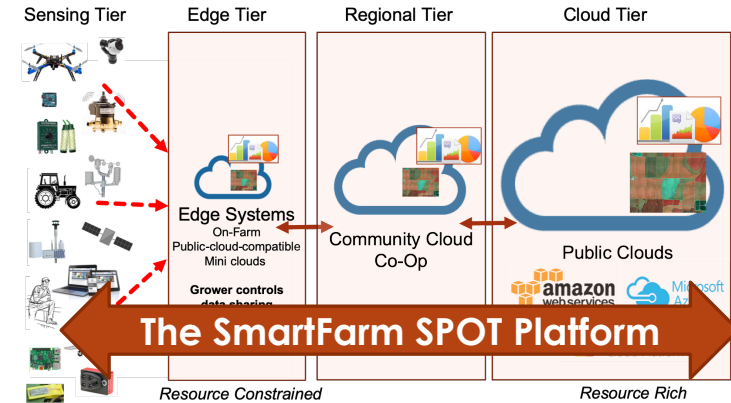
# How Can We Write Apps for Such a Complex System?



# Goal: Expedite Innovation in Precision Ag

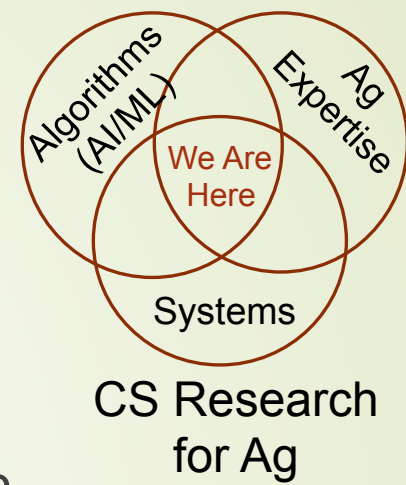


- Our Approach:
- SPOT: Software platform for Apps
  - Apps run on all tiers without modification
  - Security, access, & deployment control
  - ***Designed for on-farm use***
    - *100x more power efficient*
    - Than existing cloud/edge solutions
- Free & open source

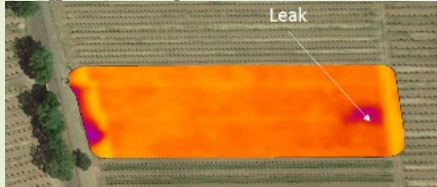


# Lessons Learned: The Future of Precision Ag

- Academia has freedom to consider new approaches
  - Cloud works well for some things
  - Domain-specific design = new directions with vast potential
  - Build communities & demonstrable deployments via open source
- Collaborations are key to expediting innovation
  - Across disciplines; academia, government, & industry



Exciting Innovations Just Over the Horizon...





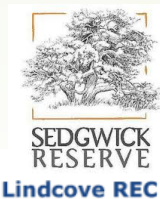
# A New Kind of Computer Science Research for Ag



- Academia + Industry + Government**
- Systems + Algorithms + Domain Sci.
  - Problem driven & empirical
    - Sustainable, efficient, useful
  - Societal & regional impact
  - Multidisciplinary collaboration
  - Demonstrable, applied, & open
  - Engage students & farm communities

# Thanks!

- Collaborators: UCSB, Lindcove REC, CalPoly, Fresno State, UCDavis, UCR, NCState, Powwow Energy, Sedgwick Reserve, Private Growers



- Support: NSF, California Energy Commission, NIH, Google, Intel, IBM Research, Microsoft Research, UCSB IEE



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Kerem Celik



Gareth George



Shereen Hussein



Wei-Tsung Lin



Nazmus Saquib



Michael Zhang

## UCSB RACELab

The Lab for Research on Adaptive Computing Environments  
Computer Science Department, Harold Frank Hall (E-5), Santa Barbara, CA