

# Delivery Drones and Citizen Privacy

Vinod Ganapathy

[vg@iisc.ac.in](mailto:vg@iisc.ac.in)

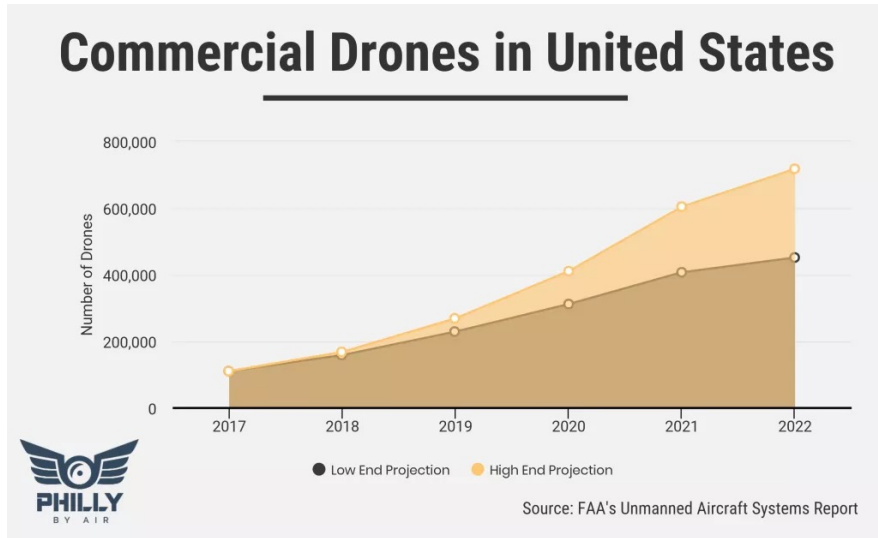


Computer Systems  
Security Laboratory

IISc Bangalore



# Privacy in the age of drones



Predicted 2.4 million hobbyist UAVs by 2022  
Predicted 450,000 commercial UAVs by 2022  
[\[FAA Aerospace Forecast FY 2018-2038\]](#)

- ❖ End-user drones are now commonly available.
- ❖ Equipped with sensors such as cameras and GPS.
- ❖ Threat to individual privacy.
- ❖ Regulations are loose and mechanisms to enforce privacy are lacking!

# Our focus: Delivery drones

- ❖ Incentive to comply with privacy regulations?
  - E-commerce companies with reputations to protect → no overt malicious intentions → our threat model can exclude rogue drones.
  - Strong interest to comply with local regulations.
- ❖ Yet, we need to mechanisms to enforce privacy:
  - Different **host airspaces** may have different privacy needs
  - E-commerce companies may contract out drone operations to third-party fleet operators (*a.k.a.* “delivery-service partners”).
  - Host airspaces may wish to determine that these **guest drones** comply with their privacy requirements.

# Enter → Privaros

## Drone software stack with mechanisms to enforce privacy policies specified by host airspaces

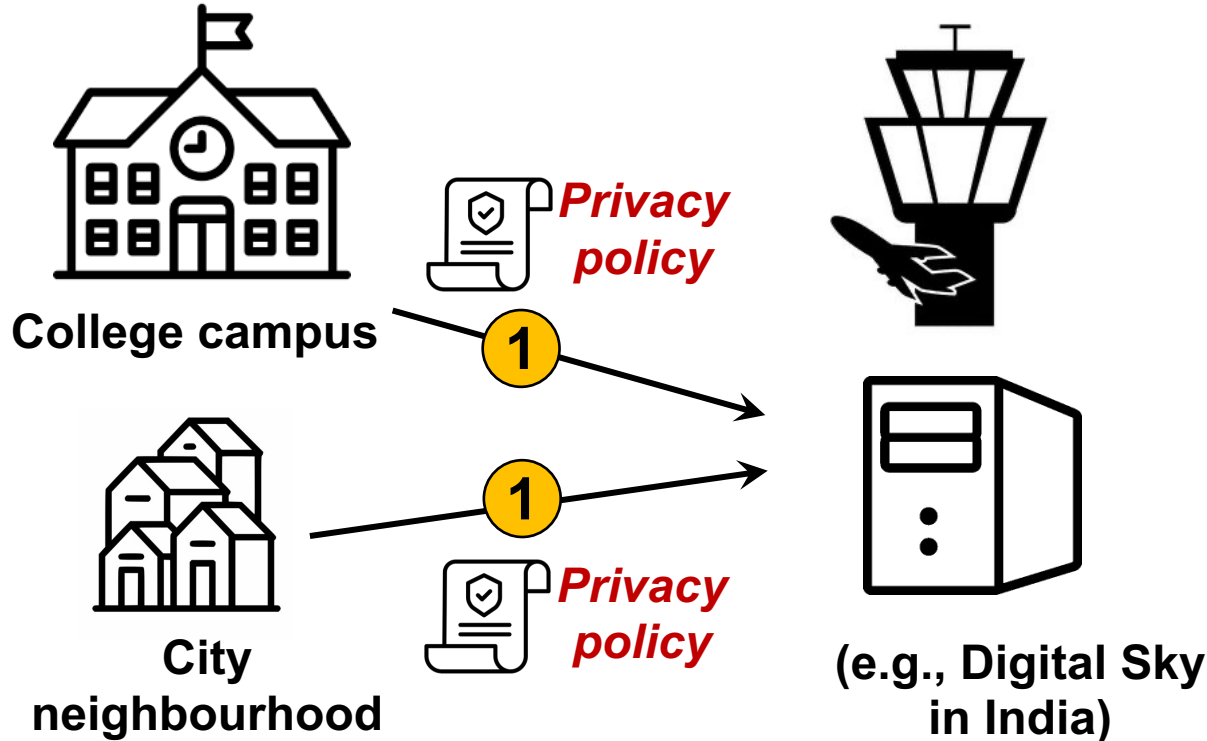
- ❖ Adds **mandatory access control (MAC)** based policy enforcement to the **Robot Operating System (ROS v2)**.
- ❖ **Runs on the guest delivery drone** and enforces MAC policies in the OS and ROS layer.
- ❖ Uses **hardware-based attestations** from a trusted execution environment (TEE) on guest drone convince host airspace that guest drone runs Privaros.

1

# Host airspaces specify their privacy policies and send it to the aviation authority

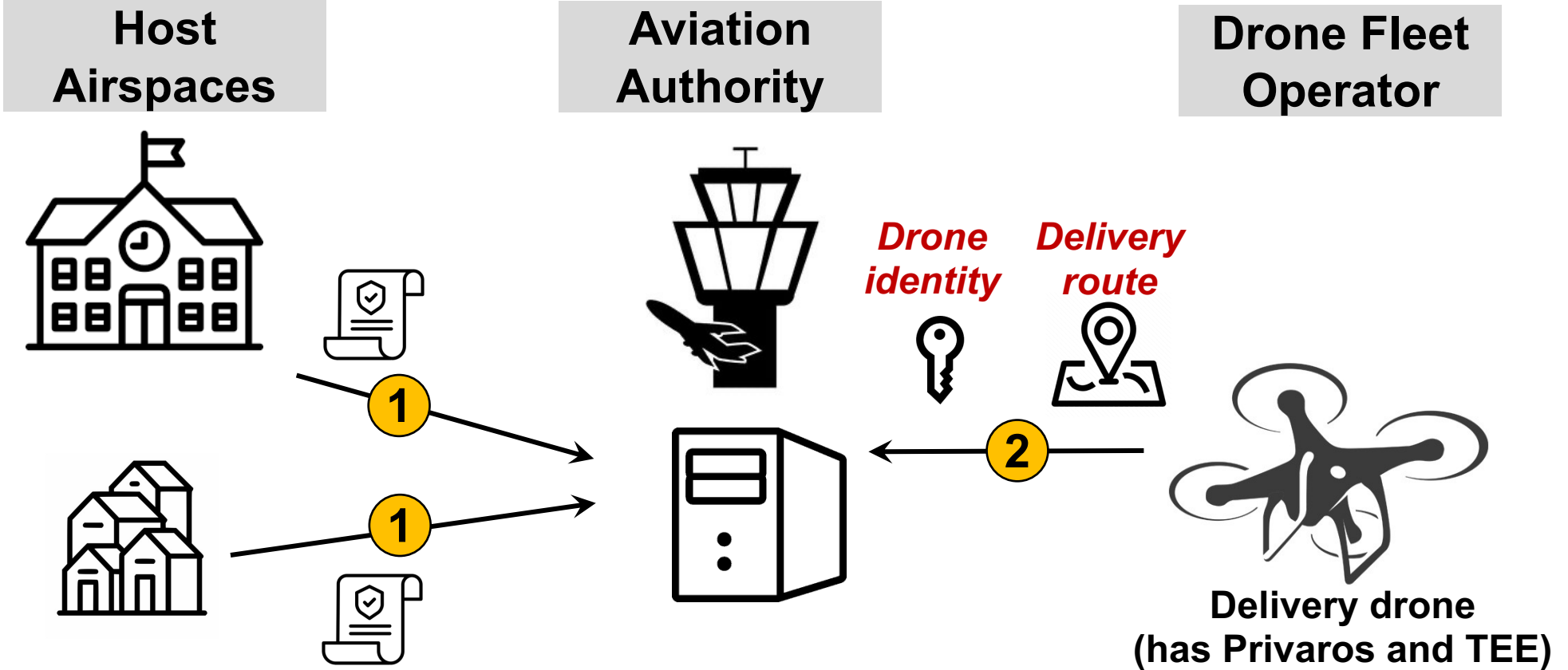
Host  
Airspaces

Aviation  
Authority



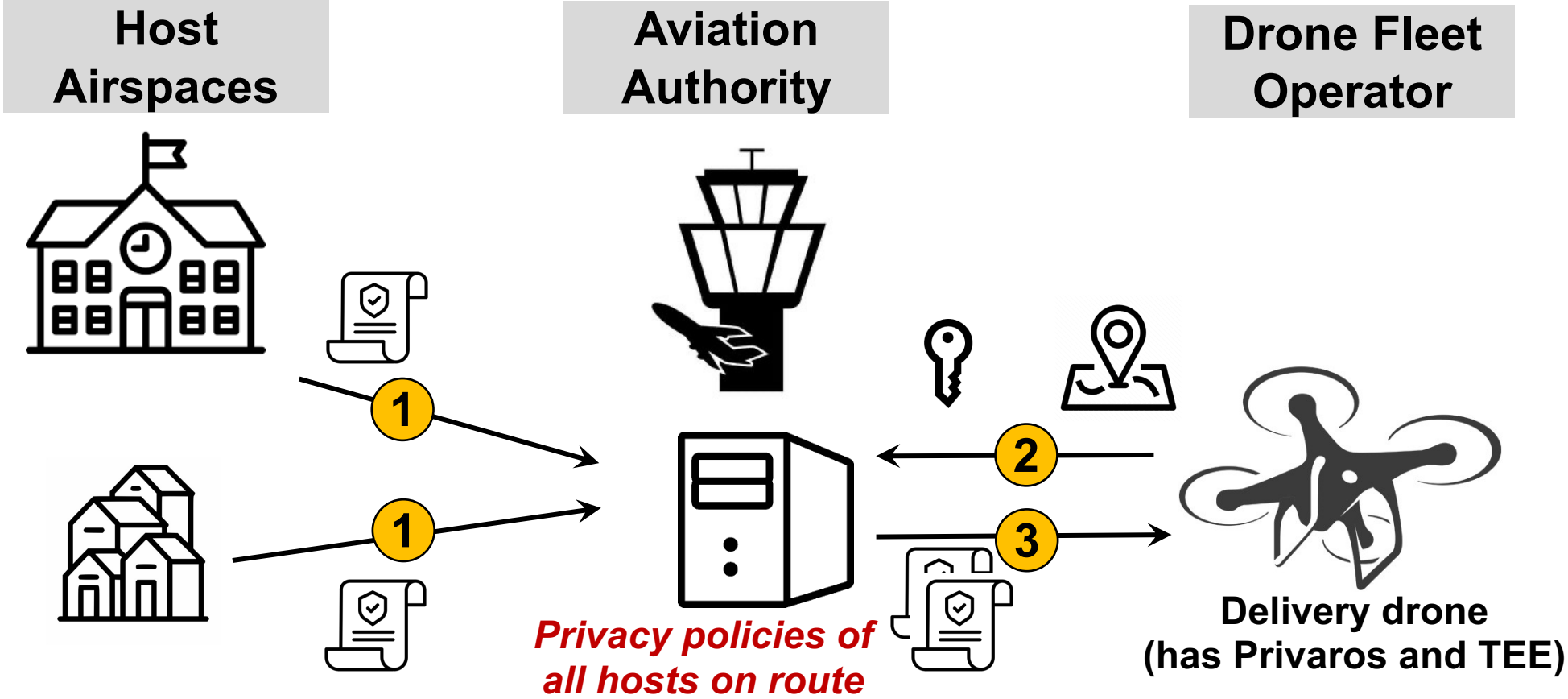
# 2

## Drone sends its identity, attestation, and delivery route to aviation authority prior to delivery run



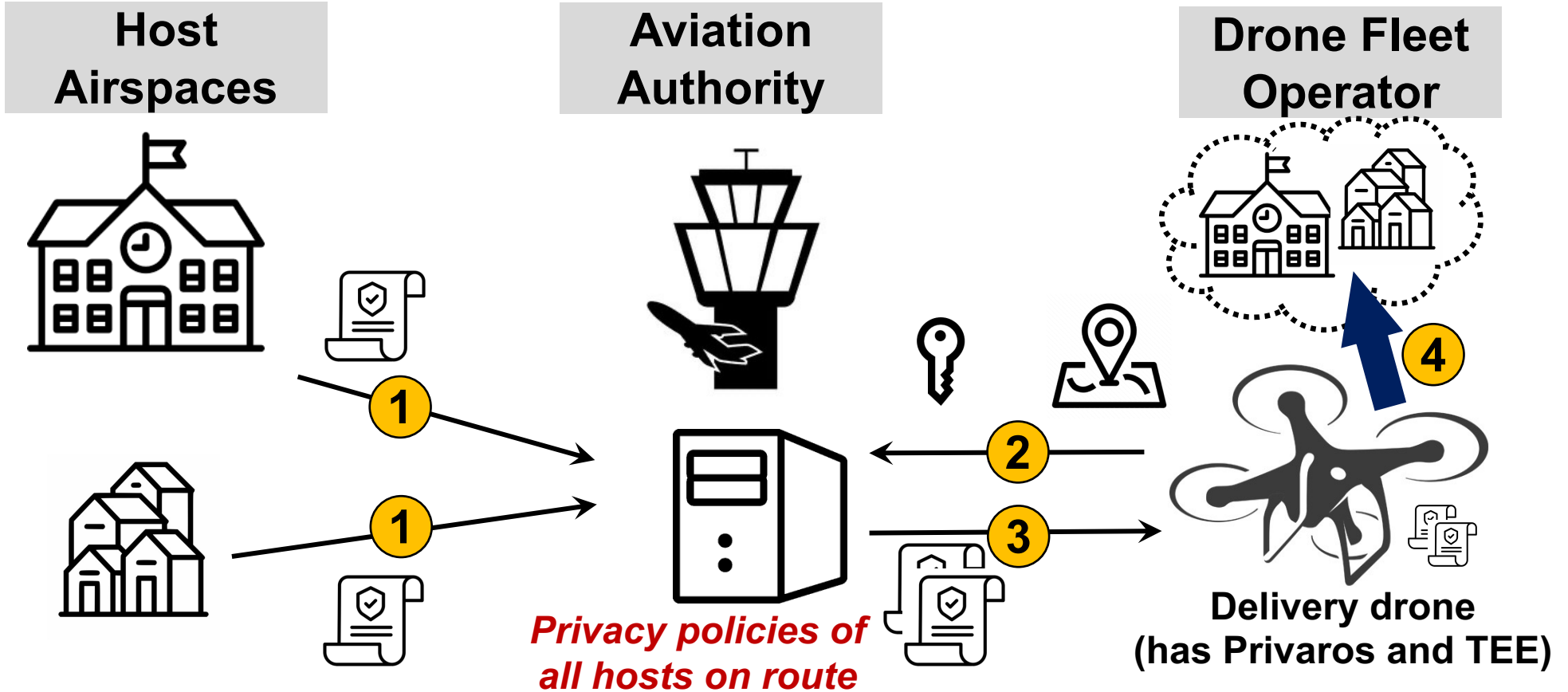
# 3

## Aviation authority sends the drone the privacy policies of all host airspaces in its delivery run



# 4

## Drone loads privacy policies and starts route





5

Drone applies host's privacy policy before entering airspace. Drone proves to host that it is equipped with Privaros and that the host's policy is applied

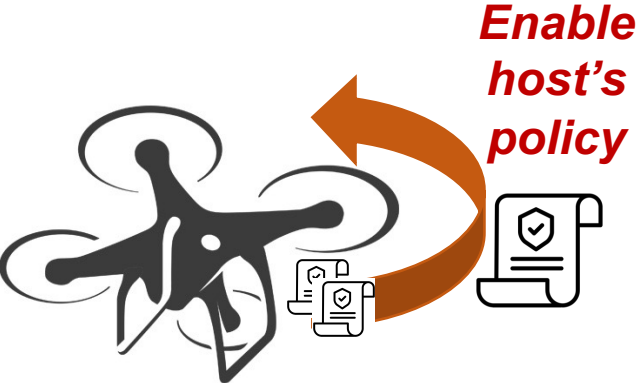
Host  
Airspace

5 *Attestation  
report from TEE*

Drone Fleet  
Operator



*Geo-fence of  
host airspace*



Delivery drone  
(has Privaros and TEE)

# Role of TEE on guest drone

- ❖ Trusted application identified by a host must execute on guest drone before entering host airspace.
- ❖ Hardware-based TEE on guest drone attests that the drone runs these trusted applications atop Privaros.



# Example policy: **Blur-Exported**



Delivery drone  
running **Privaros**



First-person view on  
untrusted remote control  
→ sensitive parts hidden

Host airspace →  
sensitive objects captured  
in video feed of drone

# Example policy: **Blur-Exported**

For more examples of policies, see our CCS 2020 paper

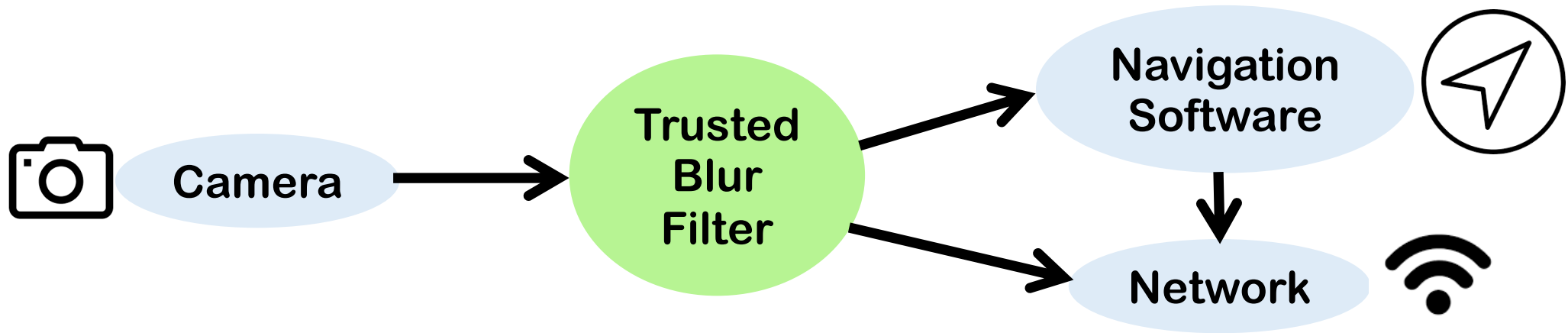
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Delivery drone  
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First-person view on  
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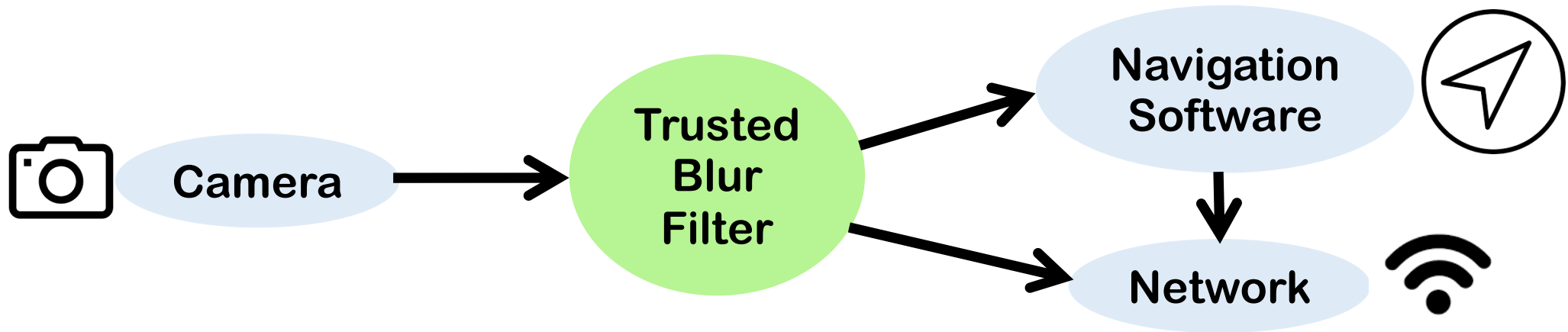
# Policies as communication graphs

- ❖ Hosts use a **communication graph** to specify their policy, which restricts how applications on the drone can communicate with each other.



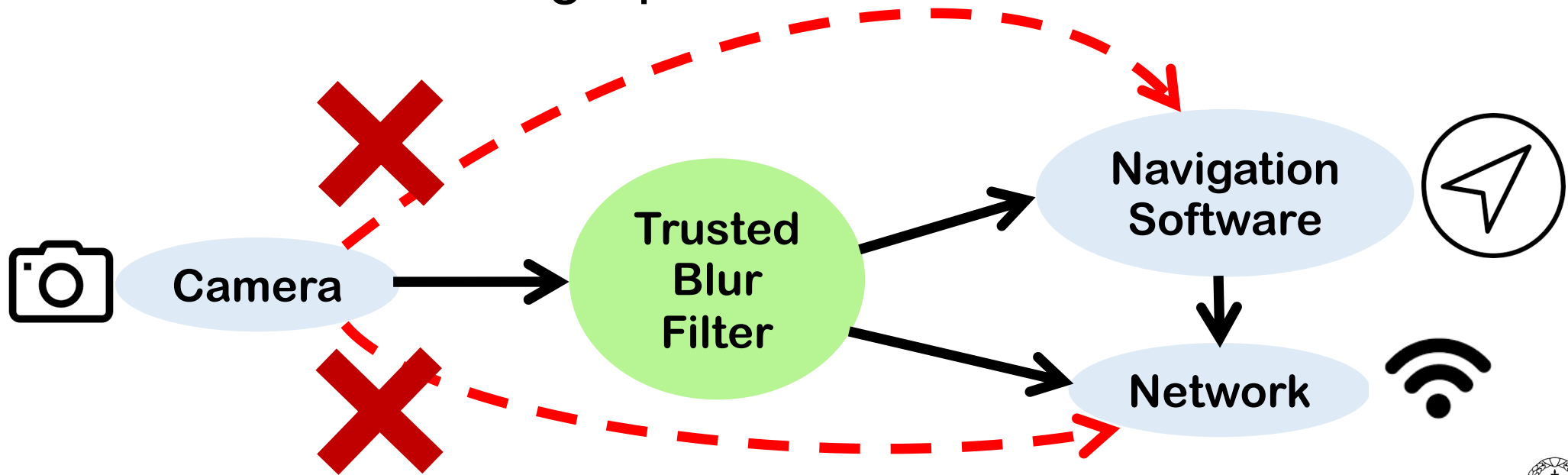
# Trusted applications

- ❖ **Trusted applications** running on the drone process sensitive data before the data leaves the drone.
- ❖ Hosts identify these trusted applications that they entrust with data declassification.



# Mandatory access control

- ❖ Privaros uses mandatory access control to ensure that applications communicate as specified by the communication graph.

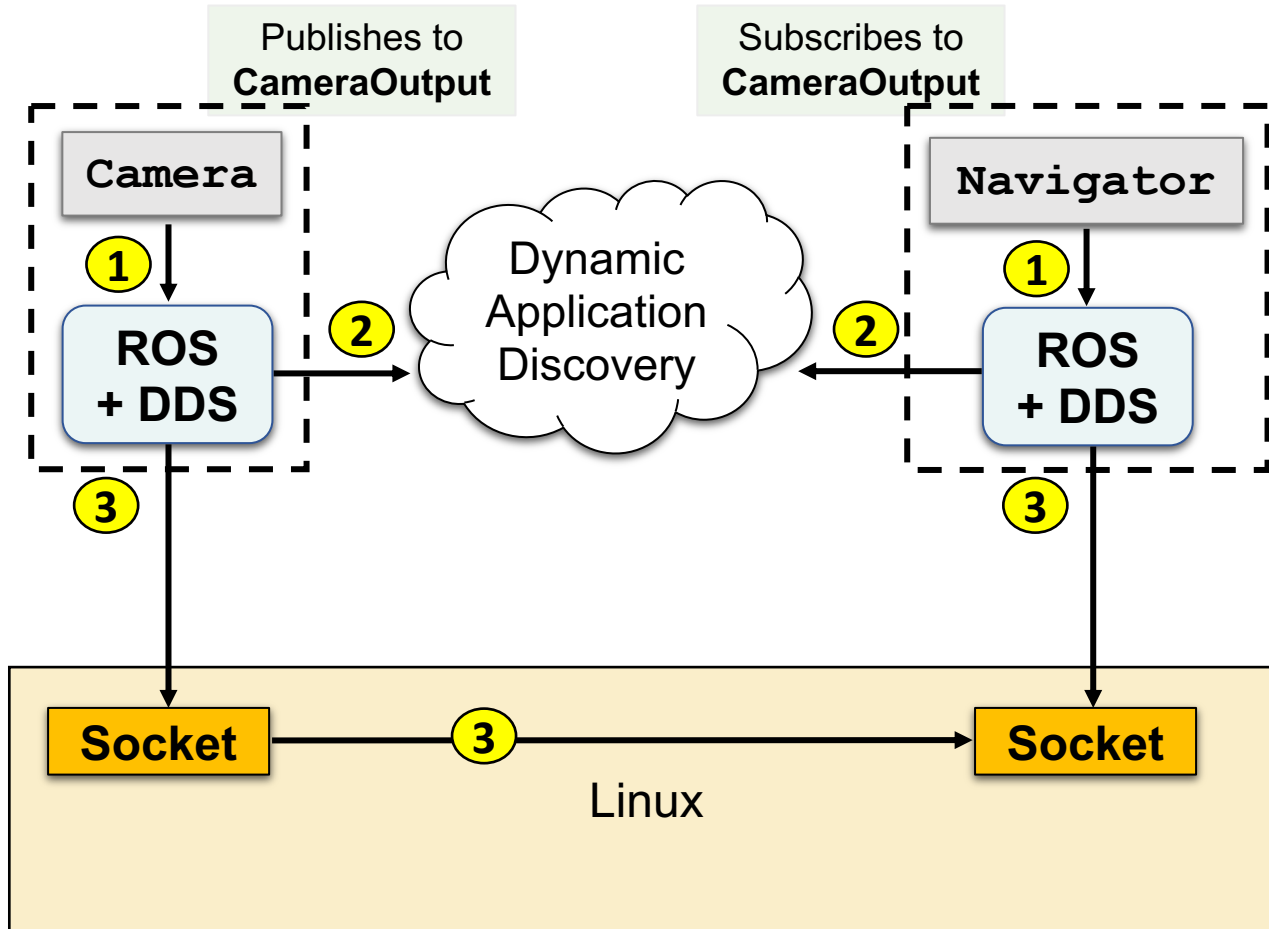


# Existing solutions: Secure ROS

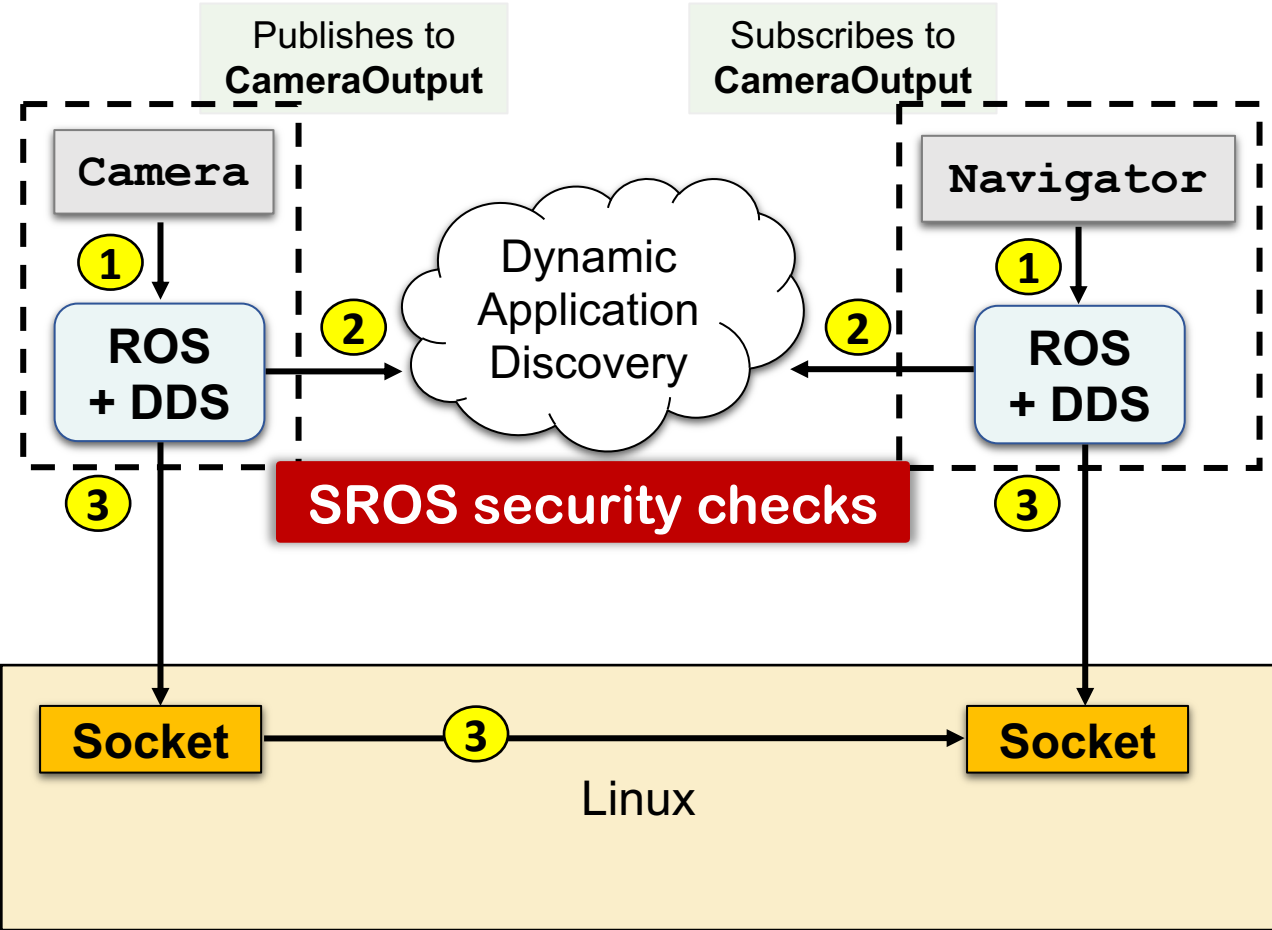
- ❖ The Secure ROS (SROS) project already provides some mechanisms for access control.
- ❖ Applications declare manifests and only applications with matching topics can communicate.
- ❖ Manifests are digitally signed by developers and therefore are cryptographically bound to the applications they are associated with.



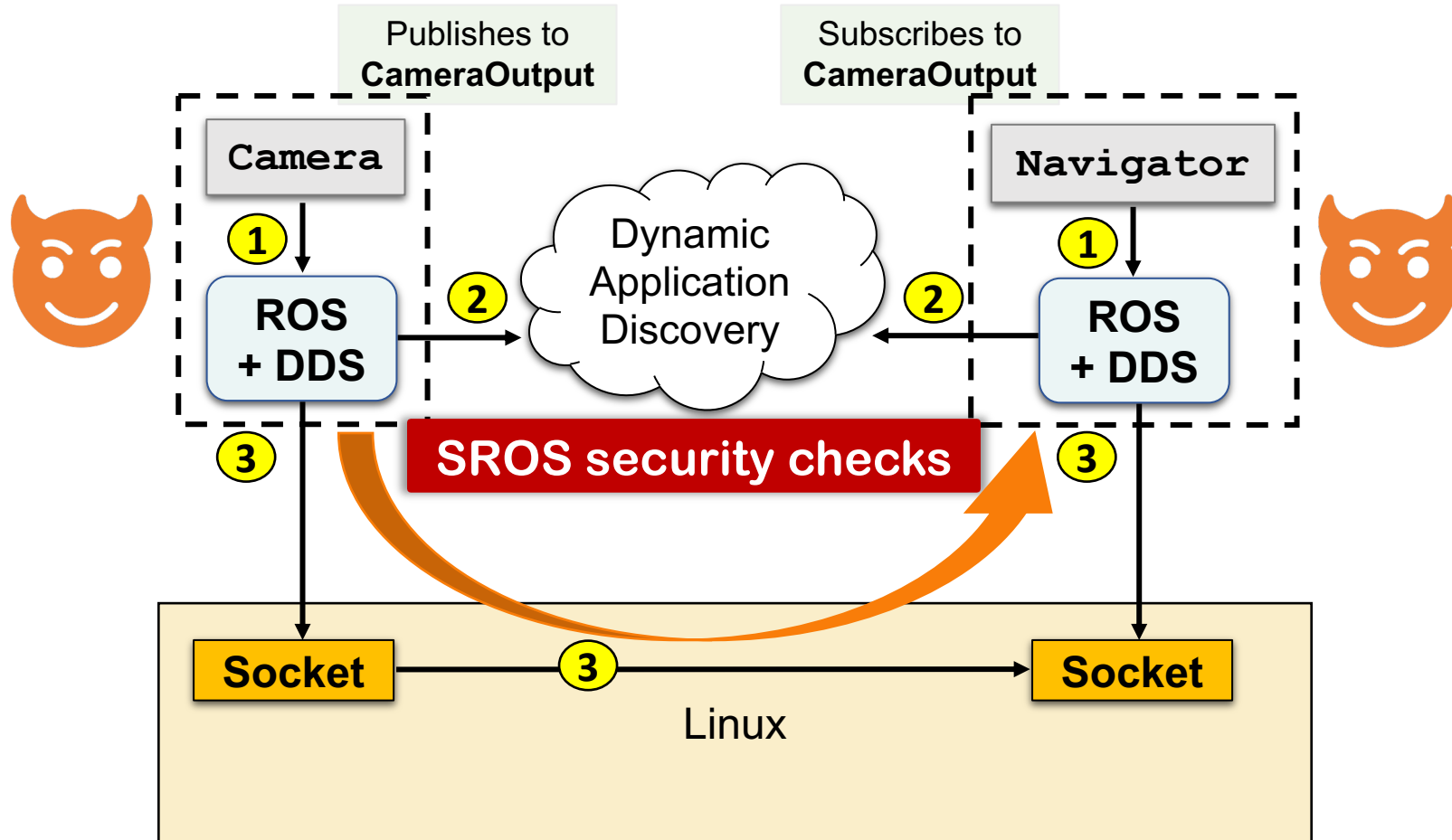
# Communication in ROS



# SROS mediates ROS communication



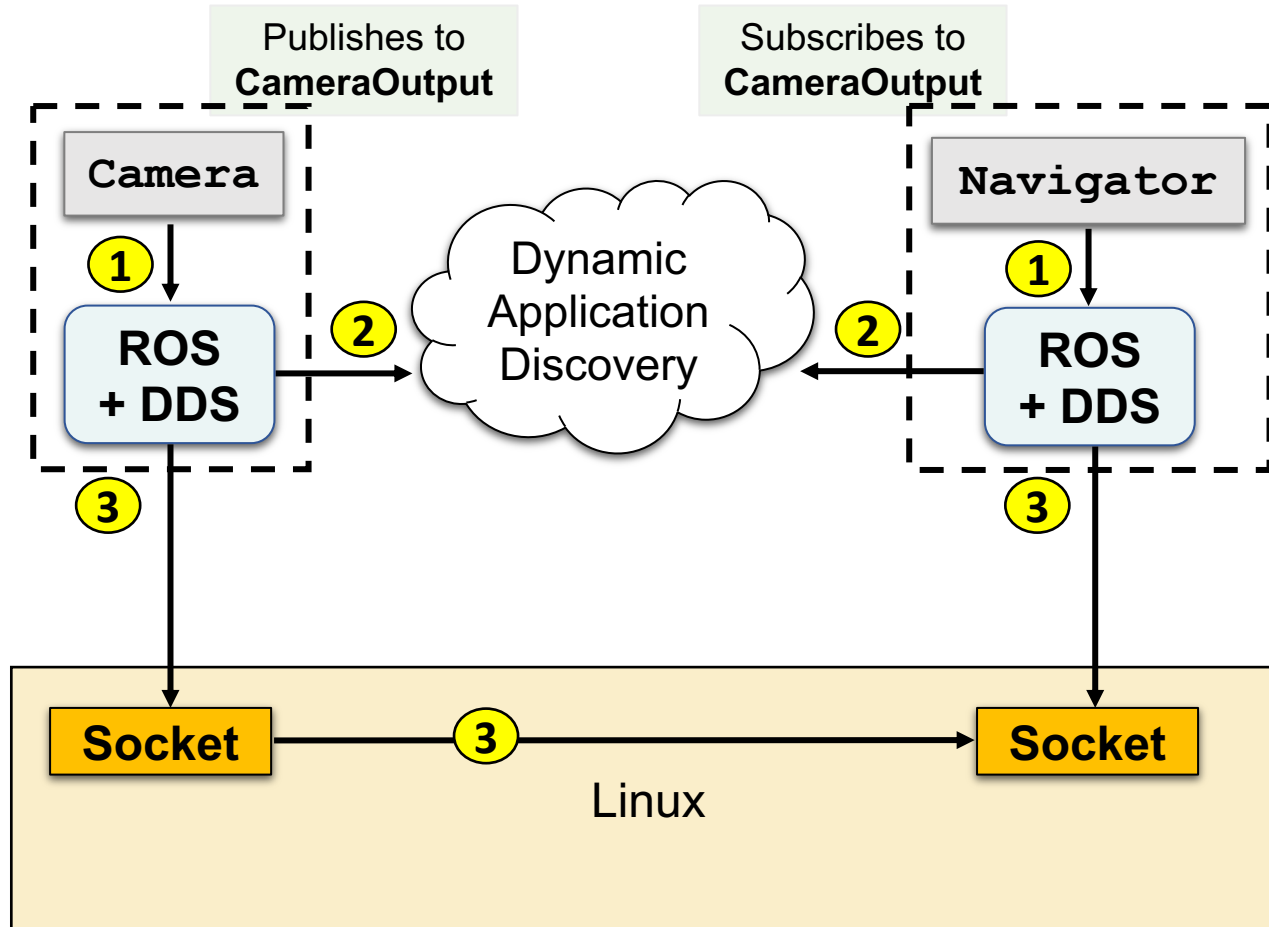
# Shortcomings of SROS



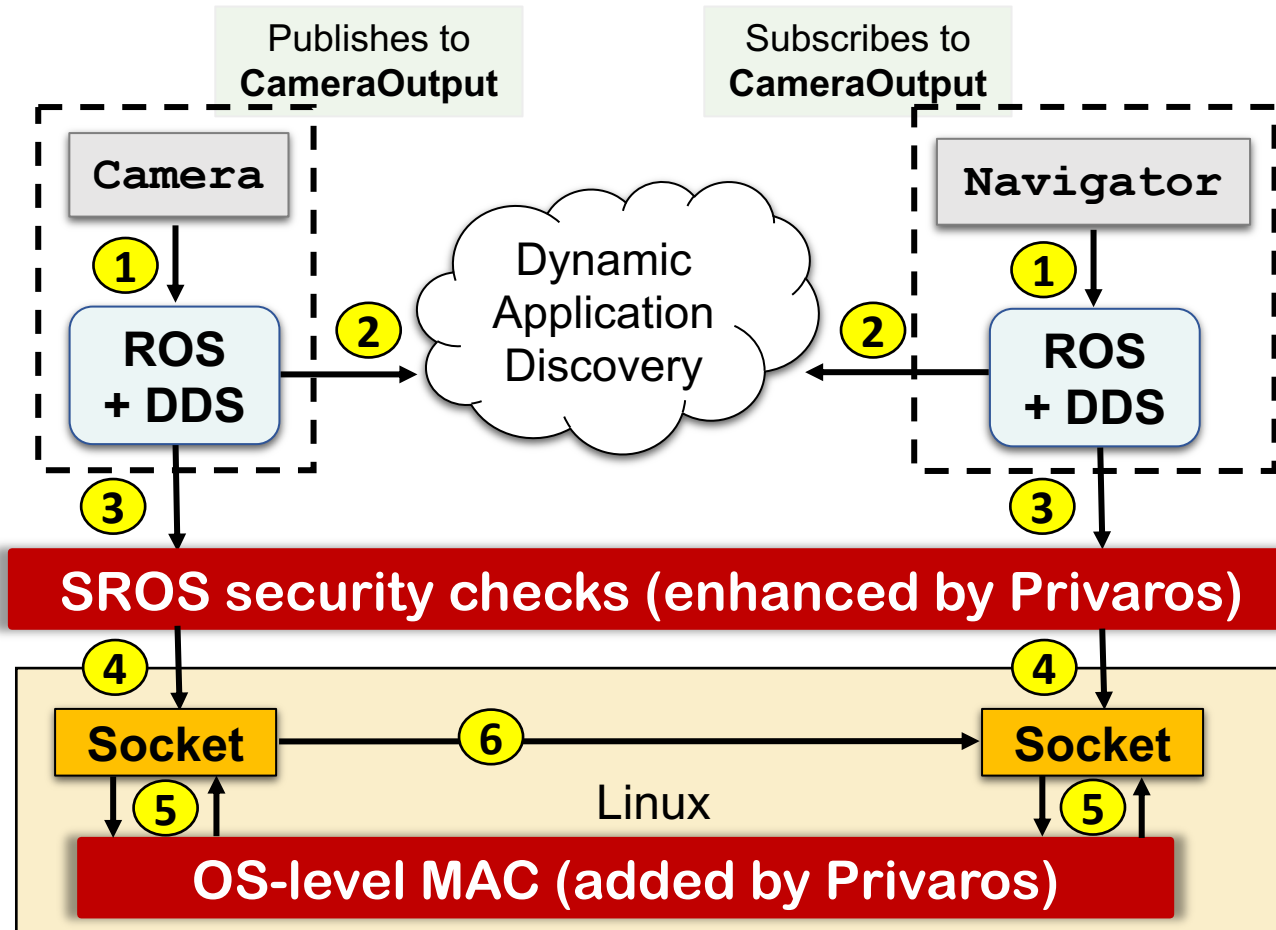
# Shortcomings of SROS

- ❖ Enforcement of application manifests happens only when the communication happens within the purview of SROS (using SROS primitives)
- ❖ Easy to bypass via low-level code in the application (e.g., a system call to open a socket or shared memory)
- ❖ Manifests only determine the next hop of communication and there is no end-to-end reasoning of application data usage: MAC policy exposes end-to-end application behavior.

# Mechanisms in Privaros



# Mechanisms in Privaros



# Snippet from our evaluation

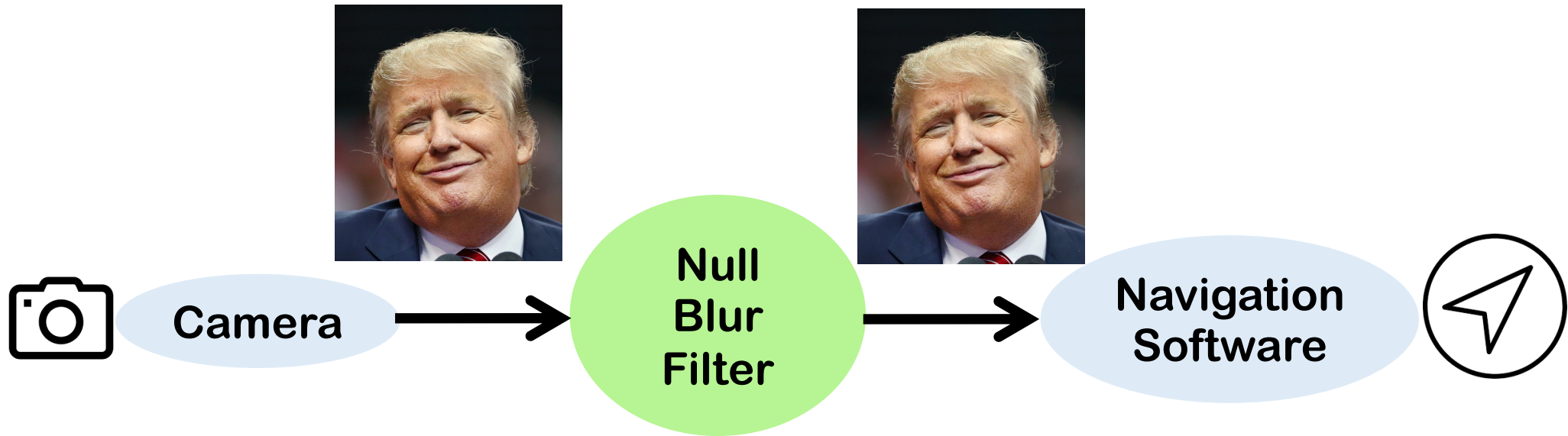
- ❖ What is the **performance impact of redirecting flows** through trusted applications?
- ❖ **Experimental Platform: Nvidia Jetson TX2** evaluation board running Privaros.
- ❖ **In the paper:**
  - **Security and robustness** evaluation.
  - Performance evaluation with **microbenchmarks**.



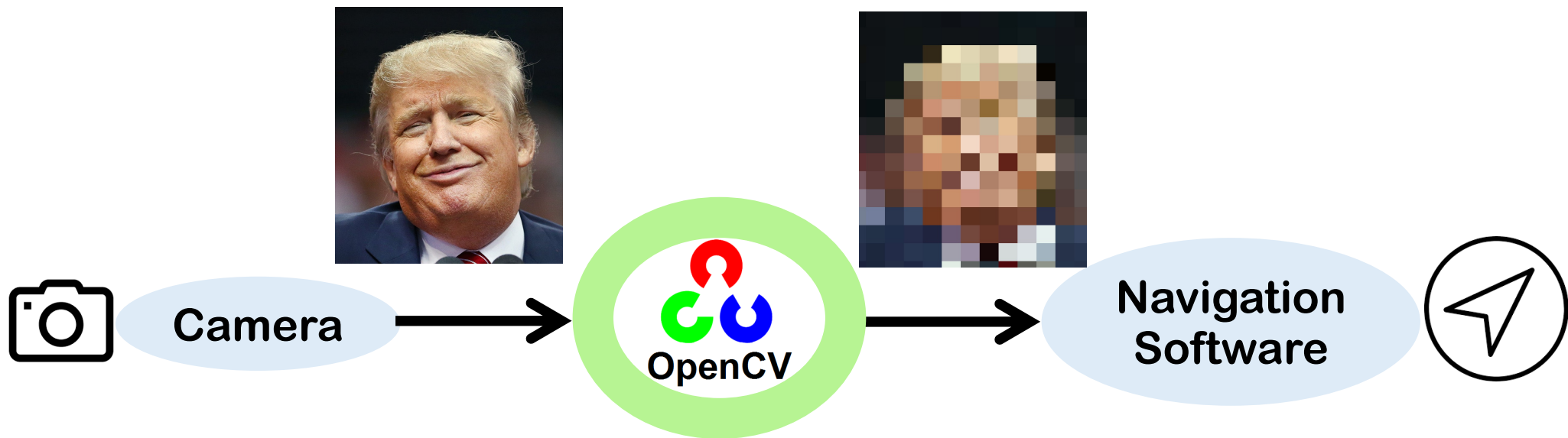


Scenario	Latency (ms)	Power (mW)
No redirection	8.1	4749.4



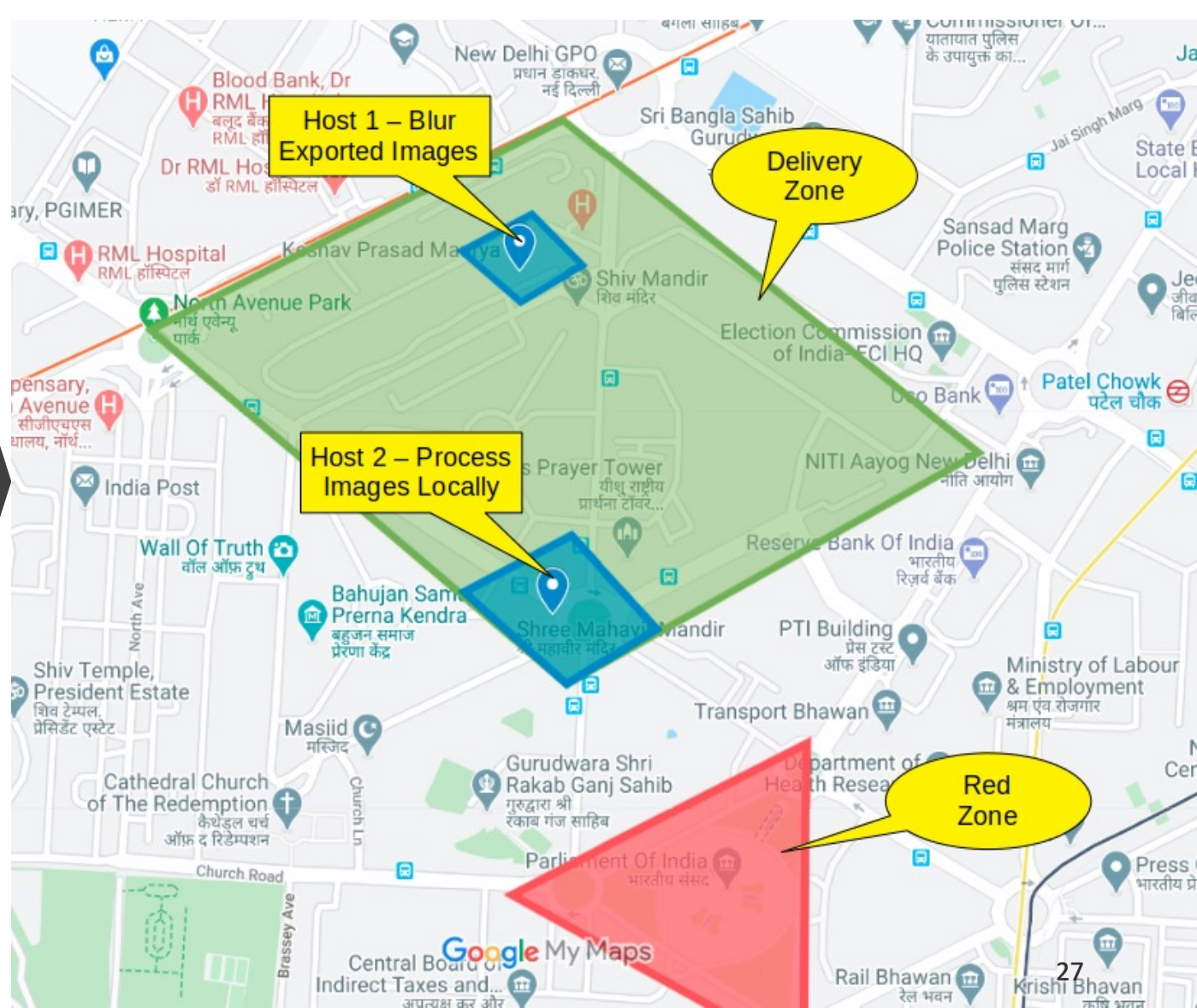


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Null blur filter	17.5 (+115.5%)	4836.2 (+1.8%)



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No redirection	8.1	4749.4
Null blur filter	17.5 (+115.5%)	4836.2 (+1.8%)
OpenCV blur filter	21.5 (+164.8%)	5132.4 (+8.1%)

# Integration with Digital Sky



# For more details

***“Privaros: A Framework for Privacy-Compliant Delivery Drones,”*** Rakesh Rajan Beck, Abhishek Vijeev, Vinod Ganapathy.

Proceedings of the *ACM Conference on Computer and Communications Security (CCS’20)*, November 2020

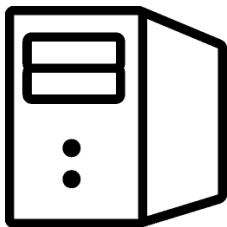
# Is the problem solved?

- ❖ **NO!** Our solution so far focuses on constraining drones within **host airspaces**.
- ❖ Host airspace defines the policies, which protects all citizens within that airspace
- ❖ But **what about individual citizens** that may not be located within a host airspace?

# Is the problem solved?

- ❖ **NO!** Our solution so far focuses on constraining drones within **host airspaces**.
- ❖ Host airspace defines the policies, which protects all citizens within that airspace
- ❖ But **what about individual citizens** that may not be located within a host airspace?
- ❖ Can we notify citizens if they are within the field of view of a drone's camera? **Enter → Privadome.**

**Regulatory Authority**

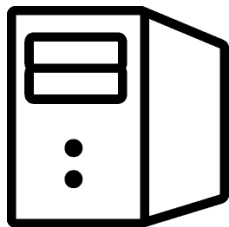


**Which drones can see me?**



**Privacy-cognizant citizen**

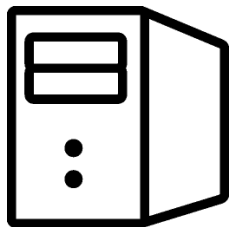
**Regulatory Authority**



**Privacy-cognizant citizen**



**Regulatory Authority**

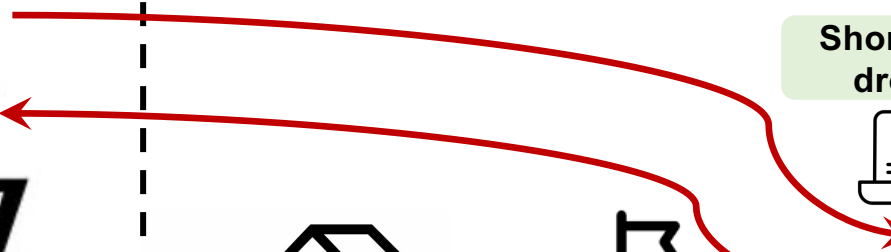
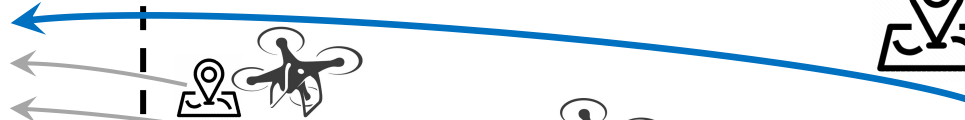
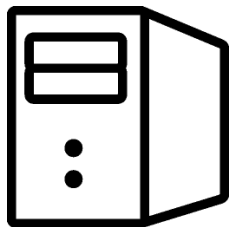


**Shortlist of drones**



**Privacy-cognizant citizen**

**Regulatory Authority**



**Shortlist of drones**



**Citizen's location privacy is compromised**

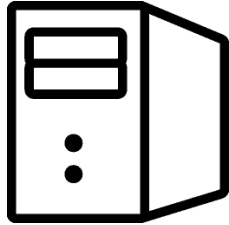
**Privacy-cognizant citizen**





**Use secure multiparty computation! (2-parties)**

**Regulatory Authority**



**MPC**

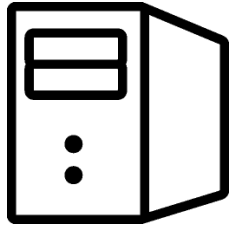
**Shortlist of drones**



**Privacy-cognizant citizen**

# Privadome

Regulatory Authority



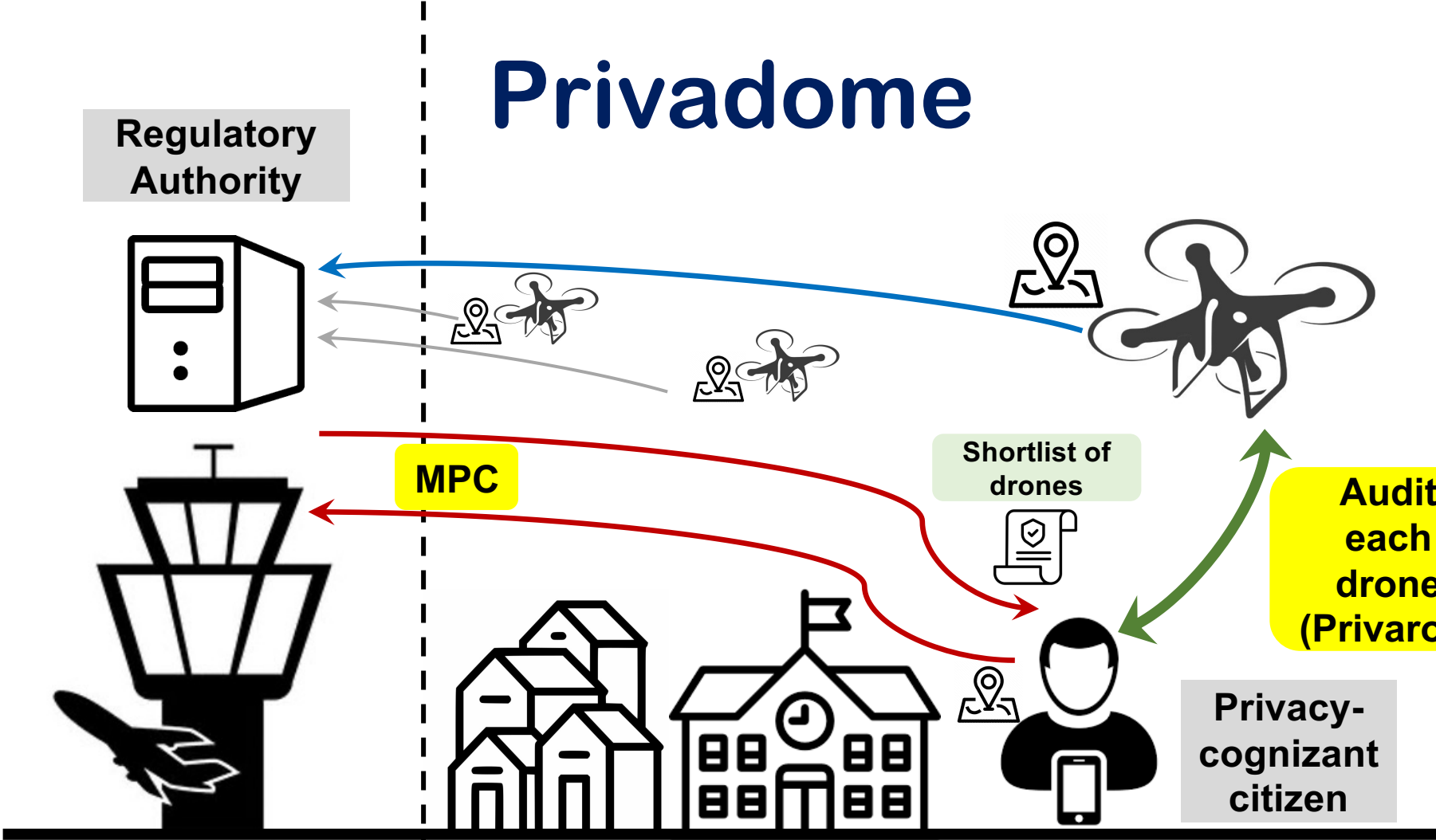
MPC

Shortlist of drones



Audit each drone (Privaros)

Privacy-cognizant citizen



# Identifying “interesting” drones?



$\Gamma_t, \lambda_t$

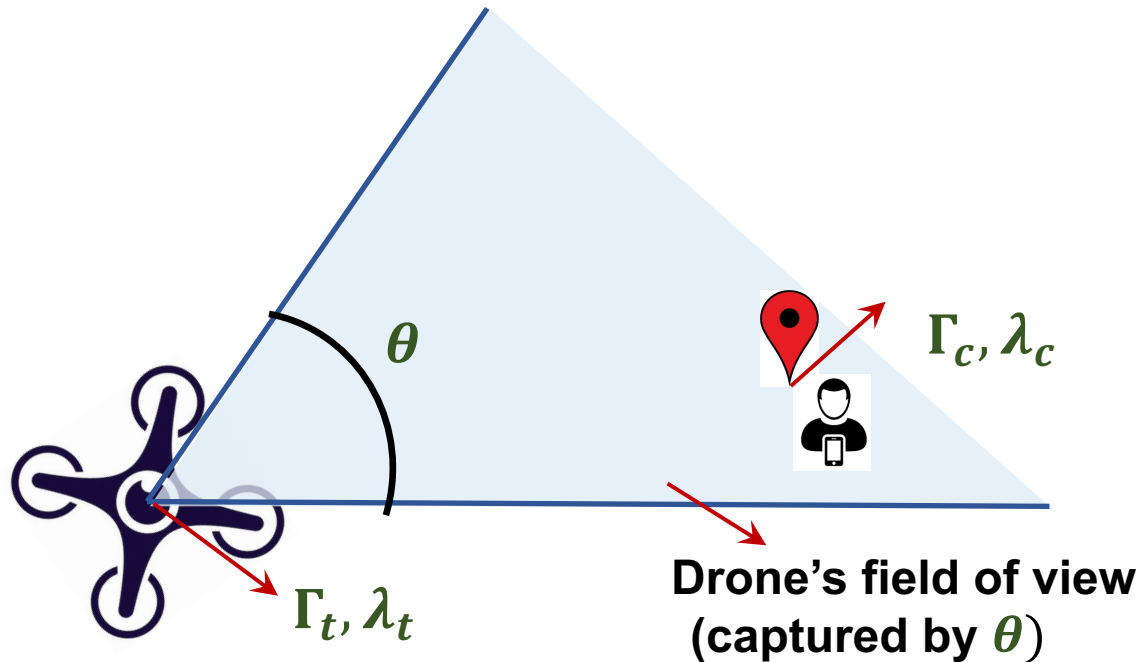
Drone's  
location



Citizen's  
location

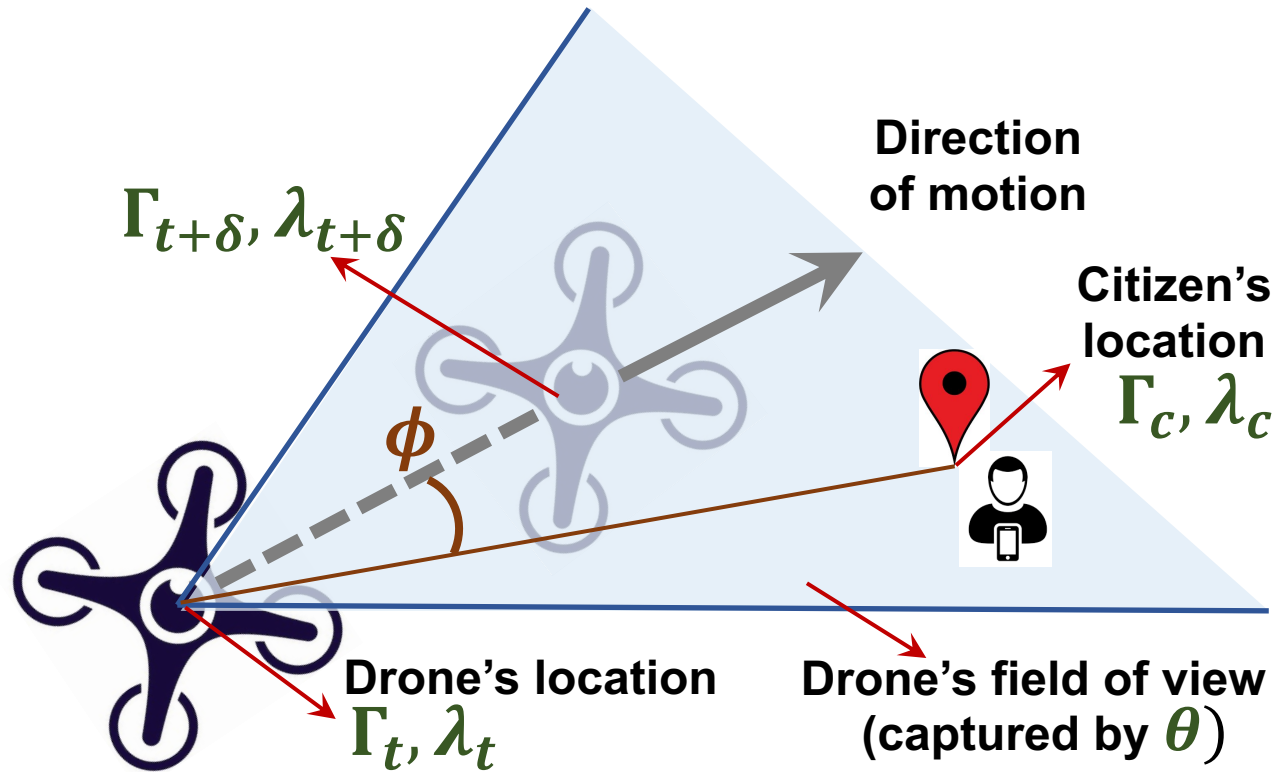
$\Gamma_c, \lambda_c$

# Identifying “interesting” drones?

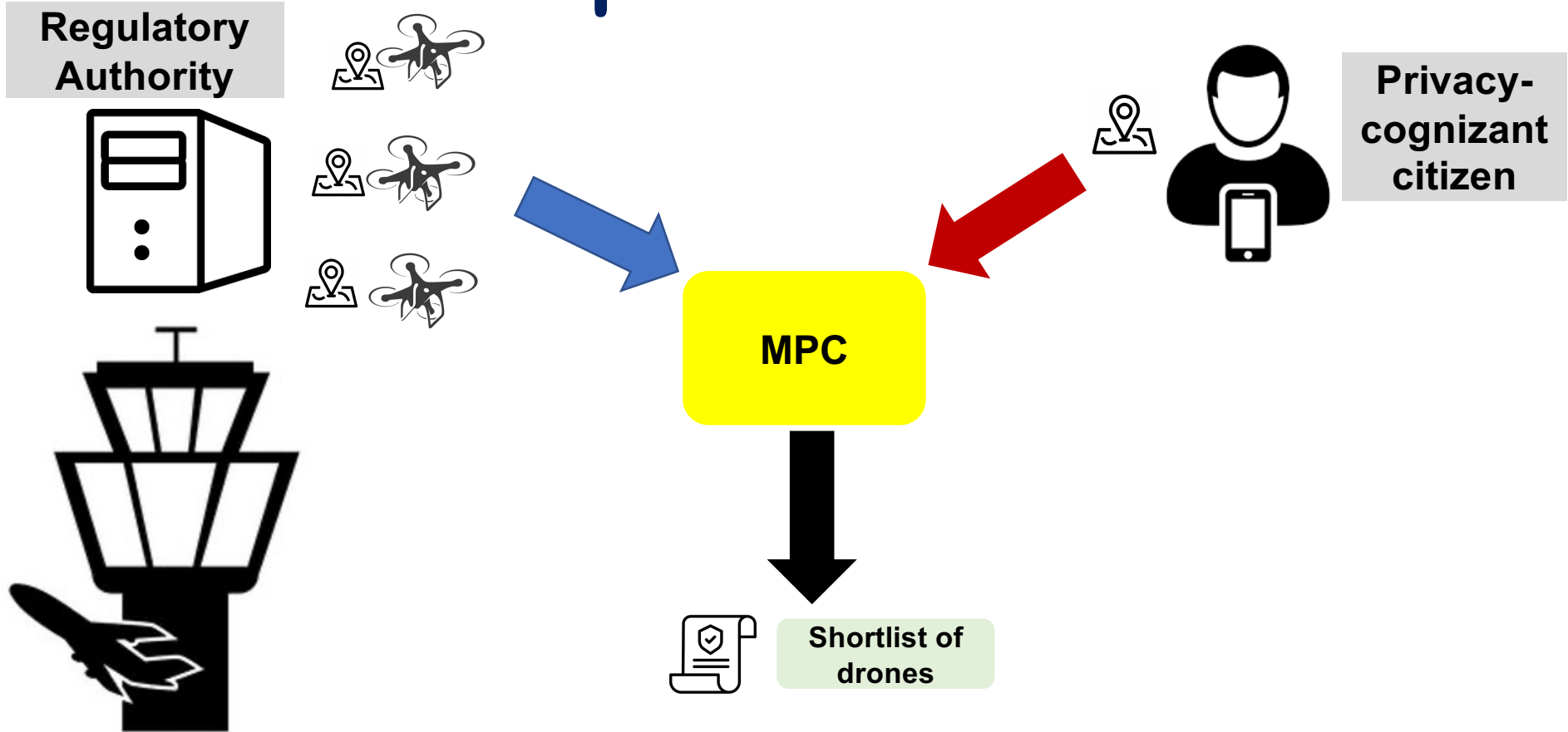


Value of  $\theta$  is known to the regulatory authority

# Identifying “interesting” drones?



# MPC setup in Privadome





# MPC setup in Privadome

**Input:** From citizen:  $\Gamma_c, \lambda_c, \text{VicinityRadius}$ .

**Input:** From regulatory authority:  $\Gamma_t, \lambda_t, \Gamma_{t+\delta}, \lambda_{t+\delta}, \theta$ .

**Output:** True if citizen in field of view, else False.

// Each  $(\Gamma, \lambda)$  is a GPS latitude/longitude pair.

- 1  $\text{Dist} = \text{DISTANCE}(\Gamma_c, \lambda_c, \Gamma_t, \lambda_t)$
- 2 **if**  $(\text{Dist} > \text{VicinityRadius})$  **then return** False
- 3  $\vec{\mathbf{D}} = \text{VECTORIZE}(\Gamma_t, \lambda_t, \Gamma_{t+\delta}, \lambda_{t+\delta})$
- 4  $\vec{\mathbf{C}} = \text{VECTORIZE}(\Gamma_t, \lambda_t, \Gamma_c, \lambda_c)$
- 5  $\phi = \arccos((\vec{\mathbf{D}} \cdot \vec{\mathbf{C}}) / (|\vec{\mathbf{D}}| \times |\vec{\mathbf{C}}|))$
- 6 **if**  $(\phi \leq \theta)$  **then return** True **else return** False

# Challenge 1: Side-channels

**Input:** From citizen:  $\Gamma_c, \lambda_c, \text{VicinityRadius}$ .

**Input:** From regulatory authority:  $\Gamma_t, \lambda_t, \Gamma_{t+\delta}, \lambda_{t+\delta}, \theta$ .

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Avoiding side channels



# Challenge 2: Performance

**Input:** From citizen:  $\Gamma_c, \lambda_c, \text{VicinityRadius}$ .

**Input:** From regulatory authority:  $\Gamma_t, \lambda_t, \Gamma_{t+\delta}, \lambda_{t+\delta}, \theta$ .

**Output:** True if citizen in field of view, else False.

// Each  $(\Gamma, \lambda)$  is a GPS latitude/longitude pair.

- 1  $\text{Dist} = \text{DISTANCE}(\Gamma_c, \lambda_c, \Gamma_t, \lambda_t)$
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Costly operations  
in MPC



# Practicality of Privadome at city-scale

Amount of data consumed on the citizen's mobile device per query

Number of drones in city	Data consumed (MBs)
100	0.972
200	1.910
500	4.723
1000	9.411
2000	18.788
10,000	93.800

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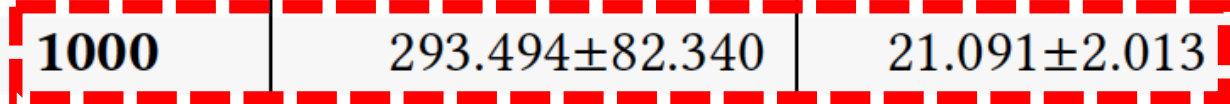


# Practicality of Privadome at city-scale

↓ Number of drones in city	<u>Query latency at citizen's device</u>	
	LAN (milliseconds)	WAN (seconds)
<b>100</b>	6.029±1.231	4.023±0.680
<b>200</b>	12.513±1.057	6.378±0.834
<b>500</b>	31.196±3.700	10.791±1.837
<b>1000</b>	293.494±82.340	21.091±2.013
<b>2000</b>	830.492±133.611	34.757±3.143
<b>10,000</b>	5161.938±1162.962	282.508±52.479

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# For more details

***“Privadome: Protecting Citizen Privacy from Delivery Drones”***, Gokulnath Pillai, Eikansh Gupta, Ajith Suresh, Vinod Ganapathy, and Arpita Patra.

Please email me if you're interested in reading a draft!



# Future opportunities

- Airbus study indicates a drone density of 16,667 drones per hour over a city the size of Paris by 2035 → MPC practical for short to medium term?
- Our threat model considers a semi-trusted model, targeting primarily delivery drones. How to deal with malicious operators?
  - Evil operators who attach a Go-Pro camera to the drone?
  - Non-regulated sector -- rogue drone operators?

# Thank you

Vinod Ganapathy

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<http://www.csa.iisc.ac.in/~vg>



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