

# Risk-based security: From Theory to Practice

## Comparison of Rule vs Risk based security policies using the iCrowd Simulator



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# ACKNOWLEDGEMENTS



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**“FLYSEC:** Optimizing time-to-FLY and enhancing airport SECurity,” Programme: Horizon 2020, European Union Grant Agreement No. 653879, Duration: 01/05/2015 - 31/07/2018, <http://www.fly-sec.eu>. FLYSEC was the **first EU-funded project** to test RBS in the context of **airport security**

**“TRESSPASS:** Robust Risk Based Screening and Alert System for Travelers and luggage,” Grant Agreement No. 787120, Call: H2020-SEC-2016-2017-2, <https://www.tresspass.eu/The-project>. TRESSPASS was the first EU-funded project to generalize the testing of RBS to **all three Border Crossing Point (BCP) modalities: air, ground, and sea.**

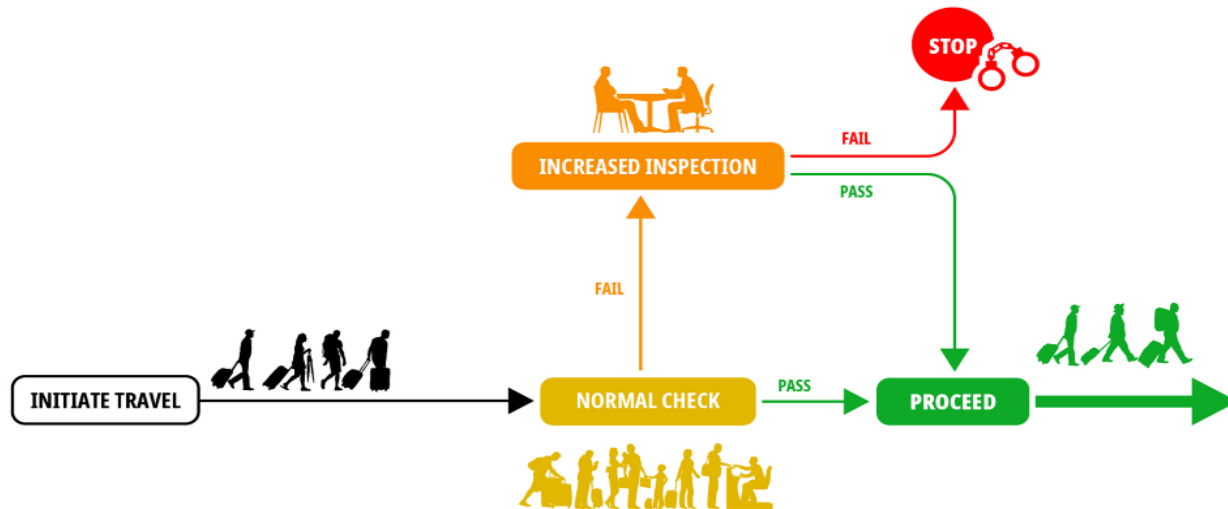
**“D4FLY:** Detecting Document frauD and iDentity on the fly,” Horizon 2020 Programme, Contract No. 833704, 2019-2022, funding organization: European Union, <https://d4fly.eu>. **First EU funded project** to put to **test a biometrics corridor** for on-the-fly biometrics ID testing.

**“SAFETY4RAILS:** Data-based analysis for SAFETY and security protection FOR detection, prevention, mitigation and response in trans-modal metro and RAILway networkS,” Horizon 2020 Programme, Call: H2020-SU-INFRA01, Contract No. 883532, 2020-2022, funding organization: European Union, <https://safe4rail.eu>. **First EU funded project** to create a **risk assessment tools dashboard** for rail & metro infrastructure protection.

The **iCrowd simulator** has been pivotal in all 4 projects for:

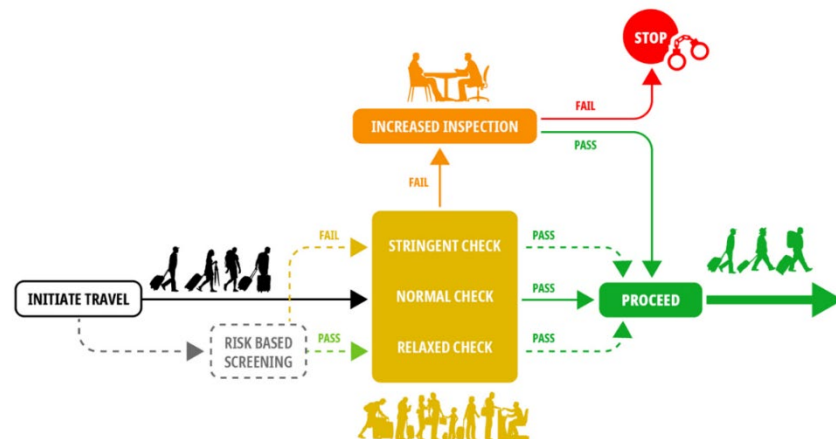
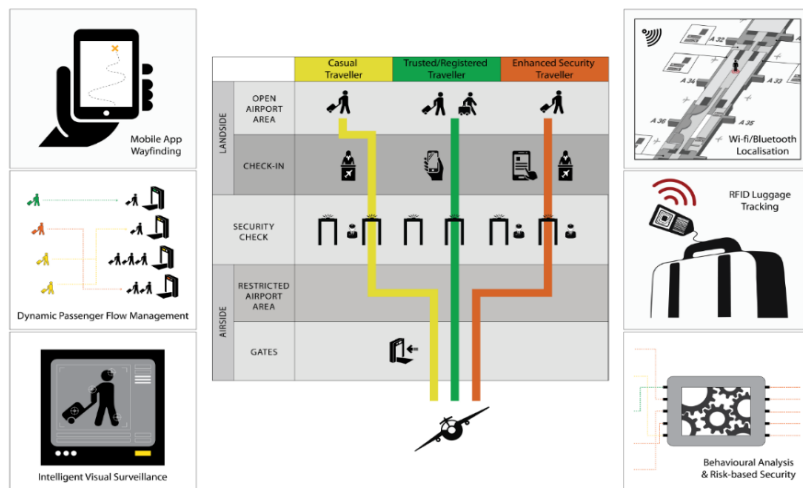
- testing RBS (Risk-based Security) scrutiny implementations,
- comparing RBS with rule-based security doctrines in air, land, and sea BCP's
- Testing new biometric-on-the-fly technologies and logistics concerning the rollout of biometric corridor
- Surveillance technologies (video cameras) for monitoring, tracking, and anomalies detection
- RFID luggage tracking implementation logistics
- Audio broadcast alerting system design and layout effectiveness testing

# Rule-based current security concept



- ✓ Less than 5% of travelers represent a threat to the security screening process of a BCP, yet same rule-based security checks, consisting of uniform non-discriminatory screening **with random enhanced checks**, apply equally to all travelers, leading to **low user experience and increased delays**.

# Risk-based security concept framework



## A. Intelligently combine:

- information obtained from observable aspects of human identity and possession;
- knowledge acquired about hidden aspects of human capability, and
- intent

## B. Assess risk and classify travelers into:

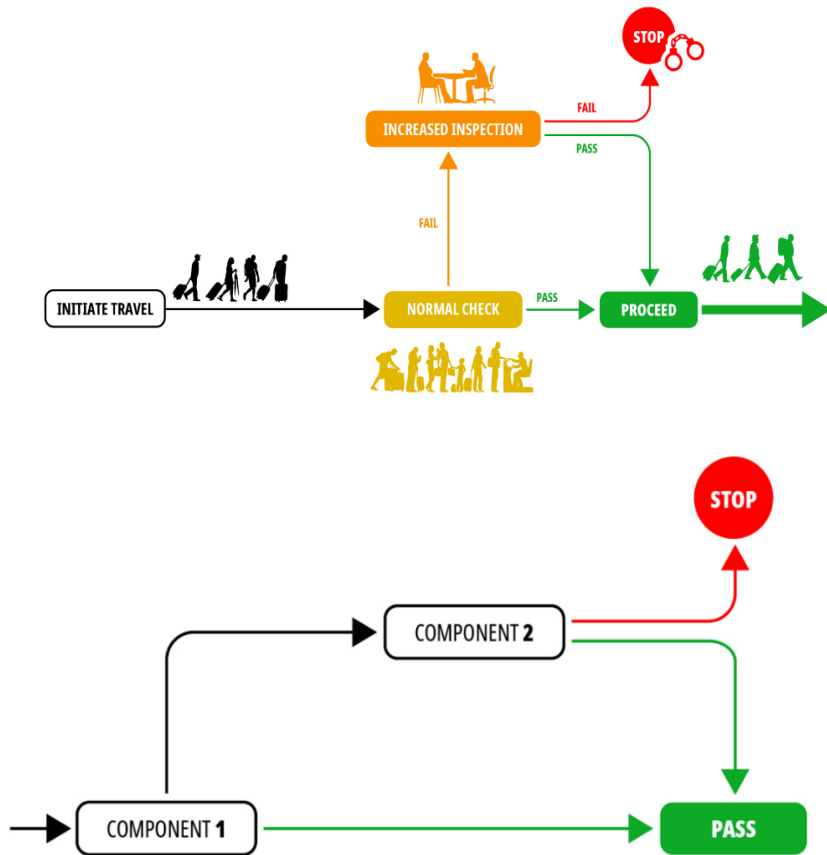
- ☐ *Casual, Trusted, or Enhanced* (FLYSEC – 3 categories),
- ☐ *Neutral, Bonafide, Malafide, or Unknown* (TRESSPASS – 4 categories)

## C. Apply security screening procedures commensurate to the assessed risk to

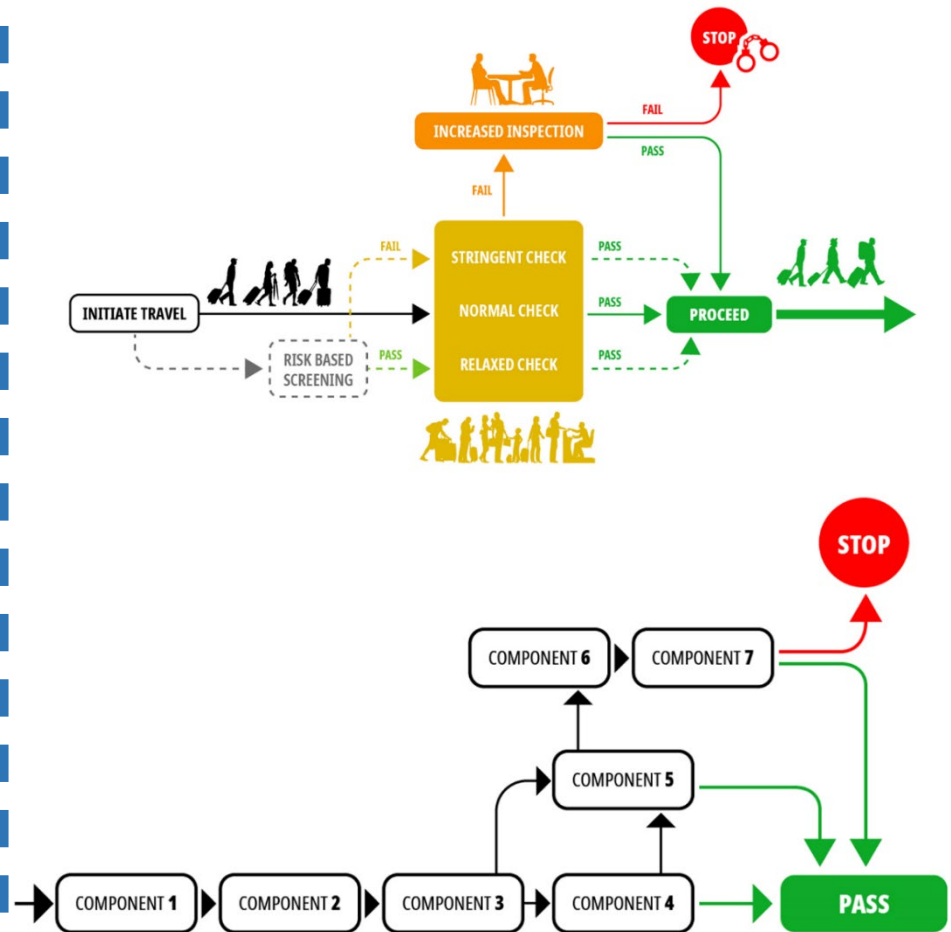
- speed up the security screening process;
- offer a more pleasant experience to travelers, and
- maintain or improve the level of security at the same time

# Rule-based & Risk-based BCP security configurations: **The need for simulation**

## 1. Rule-based security checking configuration



## 2. Risk-based security checking configuration



# Increase effectiveness vs delay

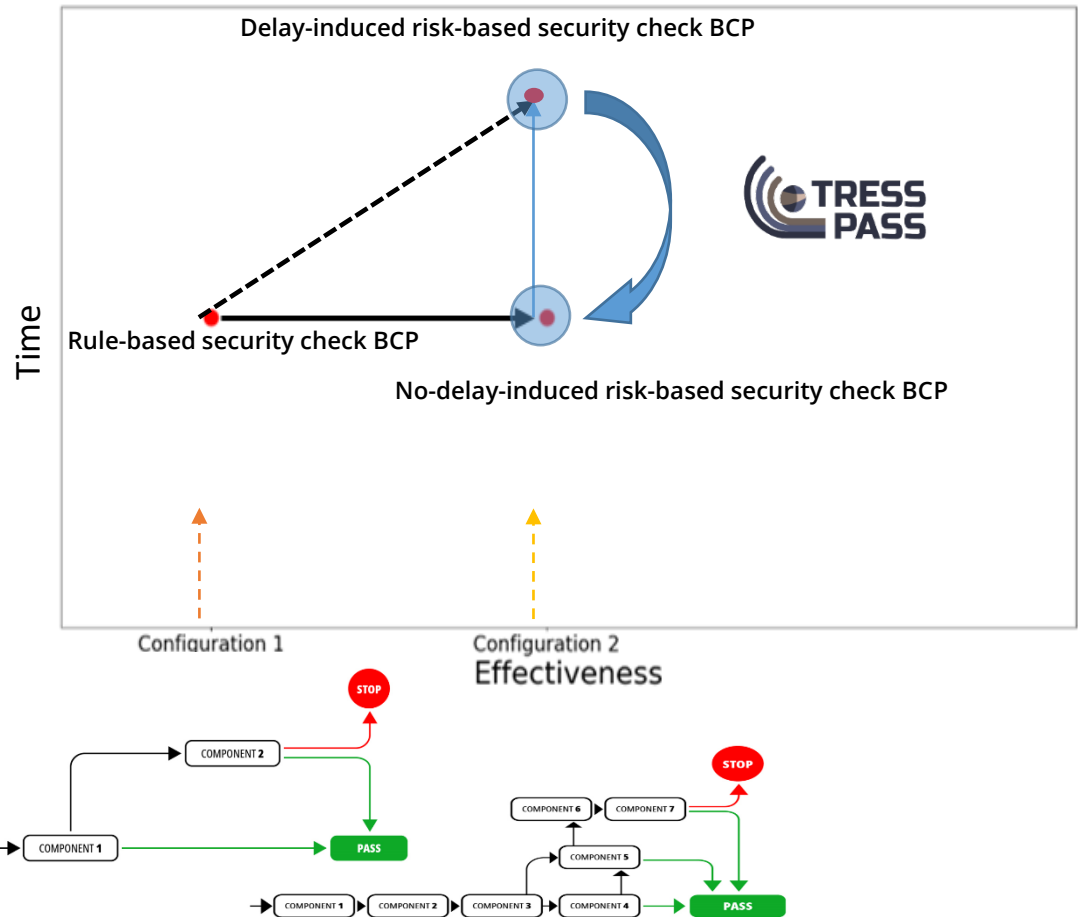
## Monte Carlo Simulation

- A BCP with 100 travelers
- Distribution of traveler types: [Normal, Suspicious]: [0.9,0.1]
- Alarm threshold for each component: 0.5
- Risk calculation: According to a script described in [14]
- **Effectiveness calculation:**

$\text{diff\_1} = (\text{mean of total suspicious people} - \text{total people stopped})$

$\text{effectiveness} = 1 / \text{absolute}(\text{diff\_1})$

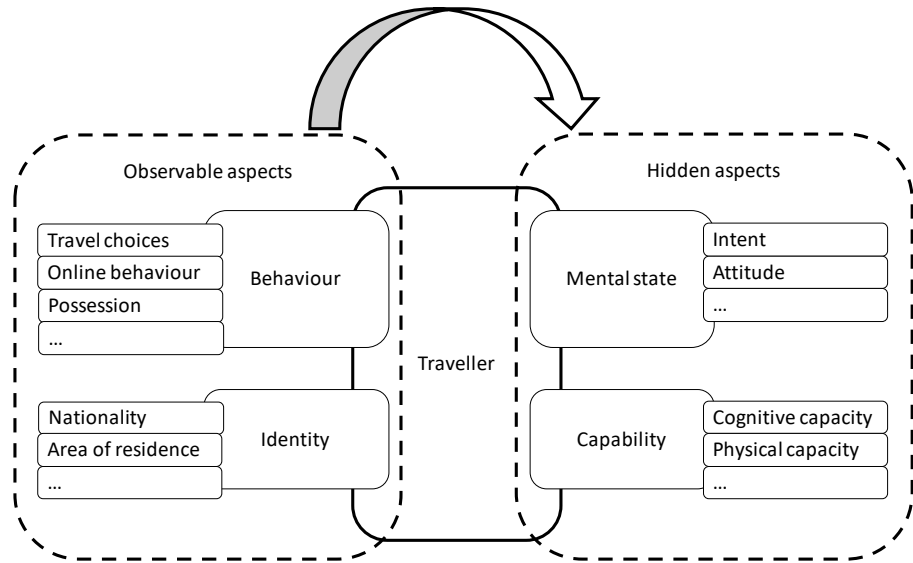
- Ran over 10000 iteration with 100 travelers each time for both the configurations.



- **Can effectiveness increase without increasing delays?**



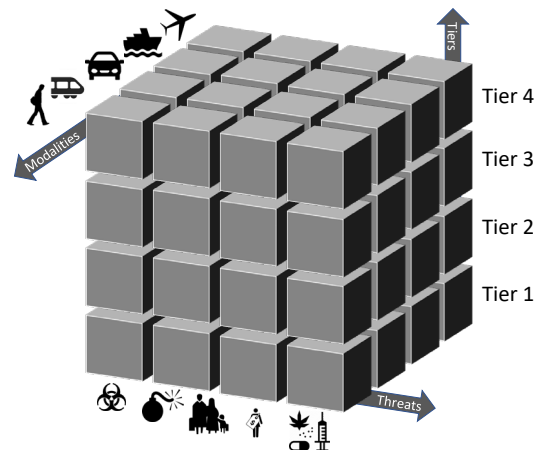
# Moving from rule-based to risk-based security: Challenges & Answers



## Observable and Hidden Risk Factors

### Multi-modal, multi-tier TRESSPASS Risk-assessment model

1. measures undertaken with third countries or service providers
2. cooperation with neighboring countries
3. border control and counter-smuggling measures
4. control measures within the area of free move



## Questions to address via simulation

- RBS vs RLBS efficiency
- Travelers satisfaction
- Delays
- Number of personnel needed for the same throughput of travelers
- Number of enrollment kiosks needed
- Number of ABC gates needed
- Surveillance infrastructure
- Detection & biometric technologies

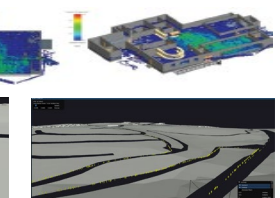
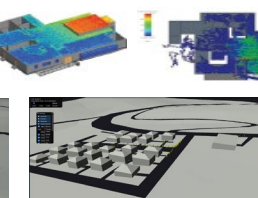
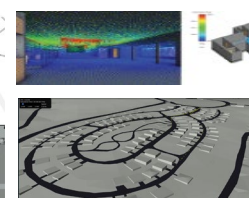
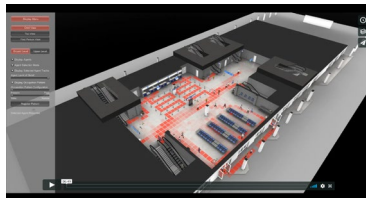
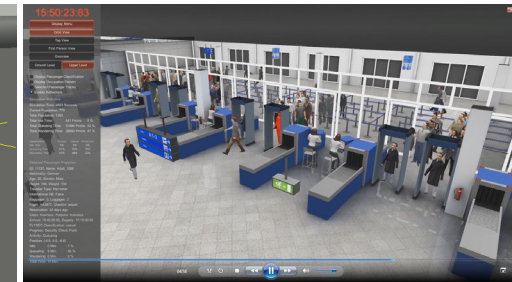
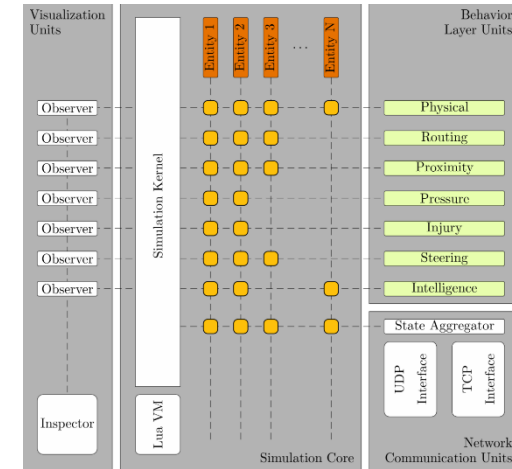
# Capabilities required for risk-based security

- **Risk Assessment Framework** (FLYSEC & TRESSPASS)
- Control, Command & Information **Fusion System** (OCULUS C2I)
- **Technologies for on-the-fly risk assessment** without inducing delays:
  - Location sensors & cameras for crowd tracking and anomaly detection
  - PNR data (A passenger name record (PNR) is a record in the database of a computer reservation system (CRS) that contains the itinerary for a passenger or a group of passengers travelling together)
  - Web intelligence
  - Across boarder intelligence
  - RFID luggage tracking
  - On-the-fly biometrics with biometrics corridor
  - ...
- **Simulation tools** (iCrowd Simulator, Monte Carlo RBBCP Simulator)



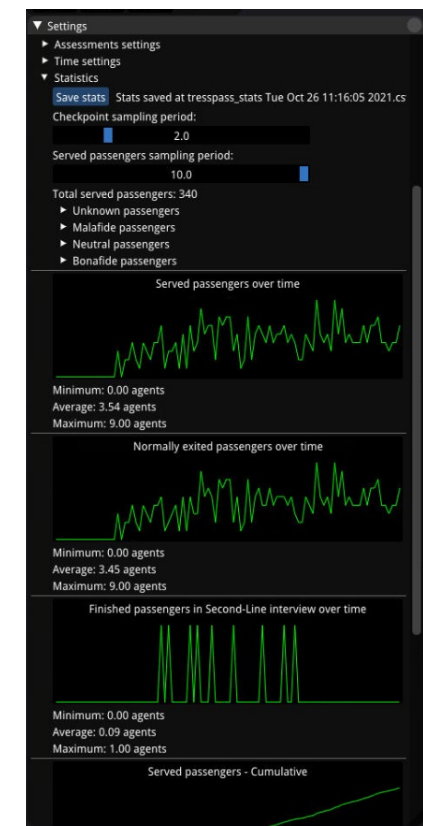
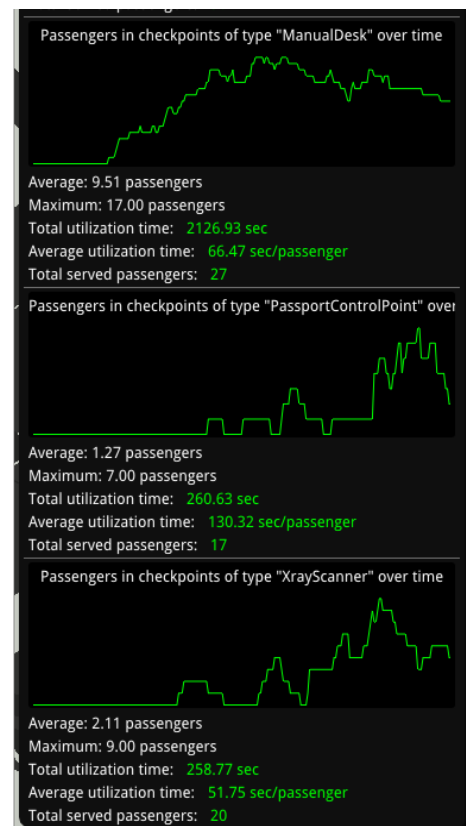
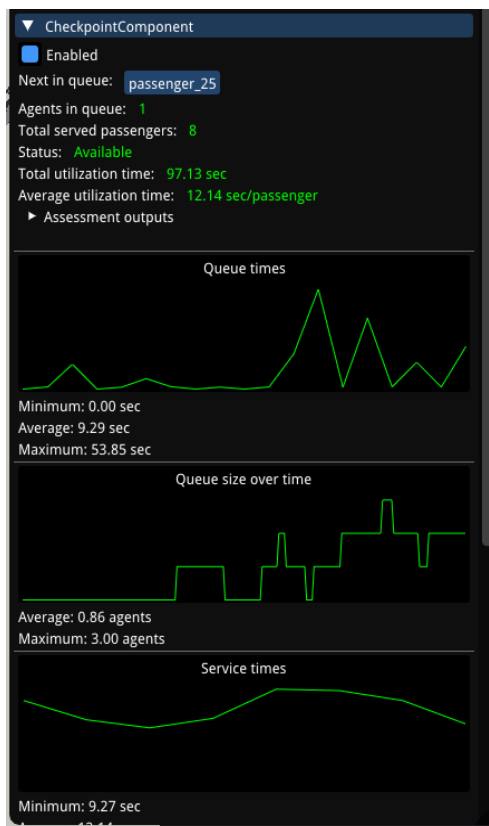
# Simulation testing of RBS with iCrowd: A few words about the iCrowd Simulator

- **Agent-based simulator**
- **User-defined simulation scenarios**
- Sophisticated crowd engine and collision avoidance
- **Multiple and complex behavior models**
- **Distributed simulation**
  - Provides a cross-simulation platform
  - Enables coexistence of multiple engines and behavior models within the same simulation
  - Distributes the simulation load to several machines (neighborhood/buddy/combo simulation)
- **Simulation-as-a-Service (SaaS)**
- **KPI's monitoring and display**
- **Native and photo-realistic 3D visualization of environment and agents**
- OCULUS C2I Portal Integration
- Integration with third-party simulators
- Anomaly detection for risk-based security performance evaluation
- Cyber-physical simulation



# Graphical monitoring of KPI's

- A **wealth of graphical means** to **monitor KPI's on real time** and provide evaluation output results in the form of cvs files and graphs



# Simulation-as-a-Service (SaaS) capability

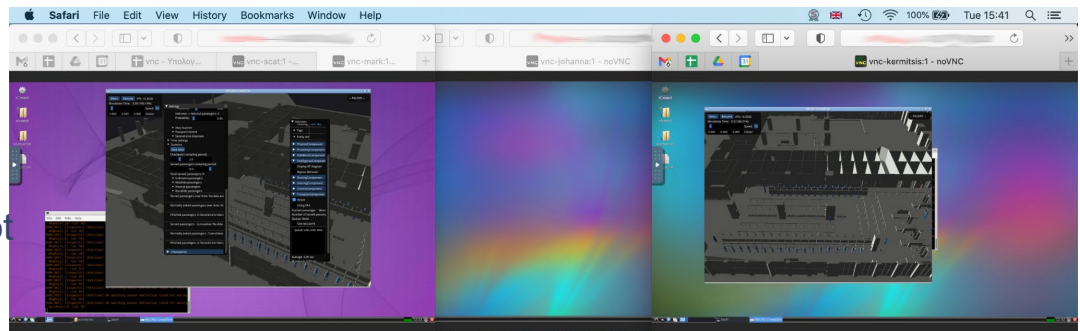
- Development of an instructional framework for training end users in understanding and operating RBS



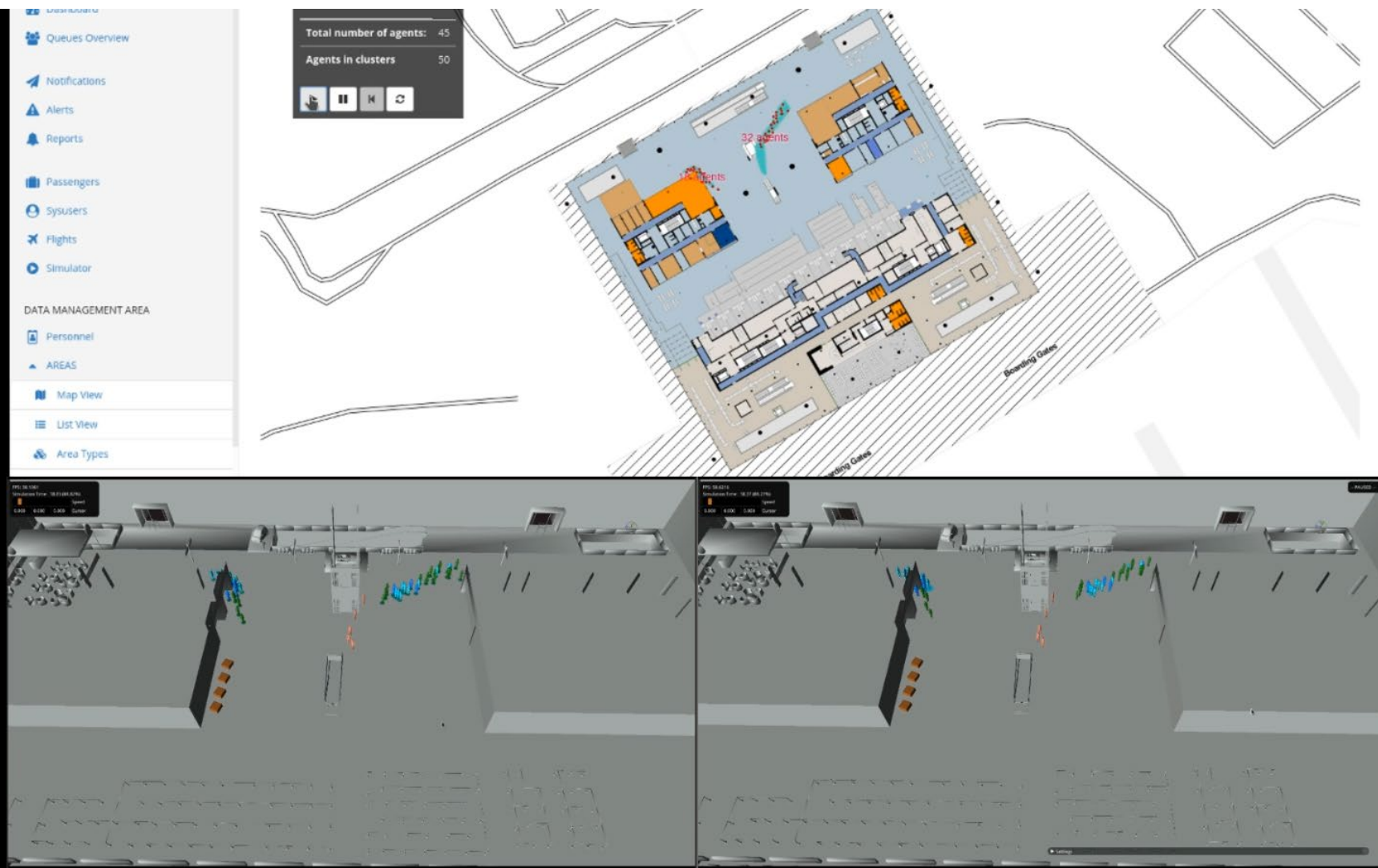
- Development of the iCrowd **Simulation-as-a-Service** (SaaS) capability used to:

(a) train the TRS end user remotely using dockerized VMC's over secure VPN lines; and

(b) perform simulations of different pilot configurations on their own and obtain quantitative RBS performance results



# iCrowd & OCULUS C<sup>2</sup>I: An Embedded Simulation & C<sup>2</sup>I System

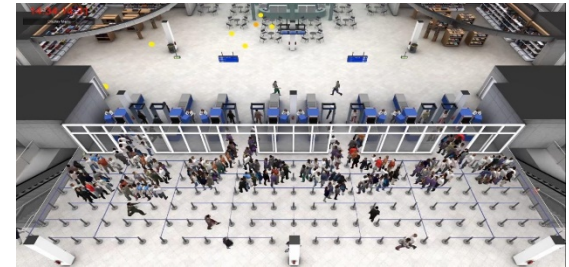




## Questions to address via simulation

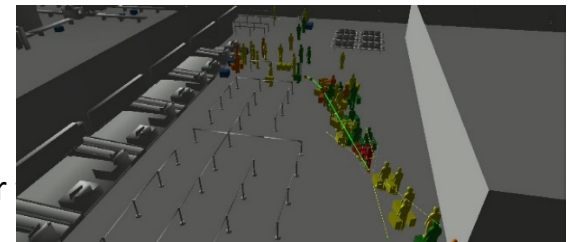
### A. Comparison of Risk-based vs Rule-based security check strategies using iCrowd

- RBS vs RLBS efficiency in terms of travelers' throughput
- Waiting time (Delays) and Queue Length
- Travelers satisfaction
- Number of personnel needed for RBS vs RLBS for the same throughput
- Number of ABC gates needed (cost) to meet a given service level



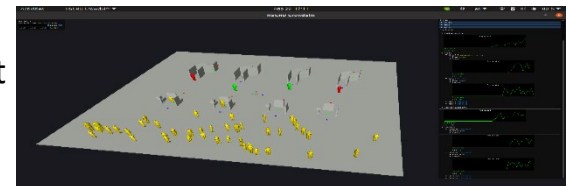
### B. Anomaly (suspicious behavior) detection vs investment on camera infrastructure using iCrowd

- Anomaly detection AI algorithms and testing via simulation
- Robustness testing in noise and missing data using simulation
- Estimation of surveillance camera investment cost vs performance in anomaly detection
- Assessment of cost effectiveness of investment on surveillance and/or alerts' infrastructure vs performance

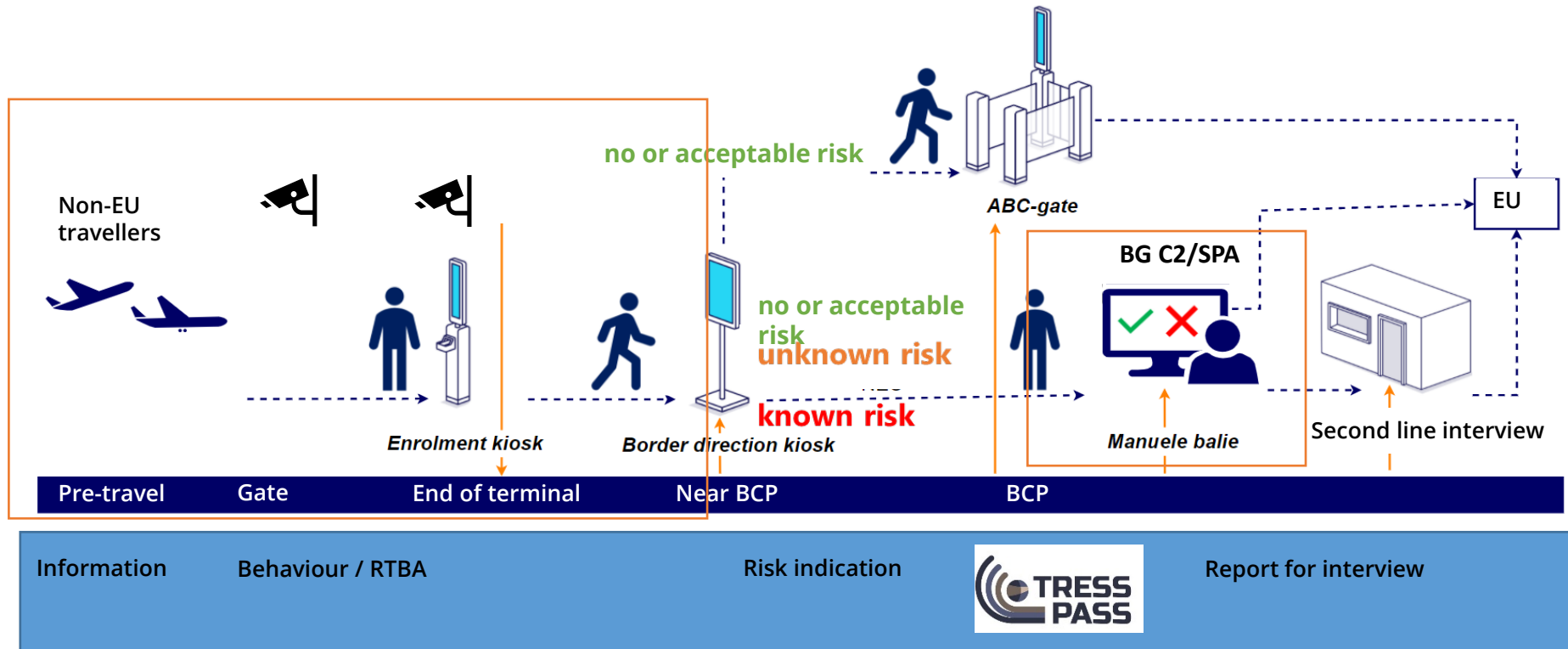


### C. Biometrics corridor and biometrics on-the-go technology performance assessment using iCrowd

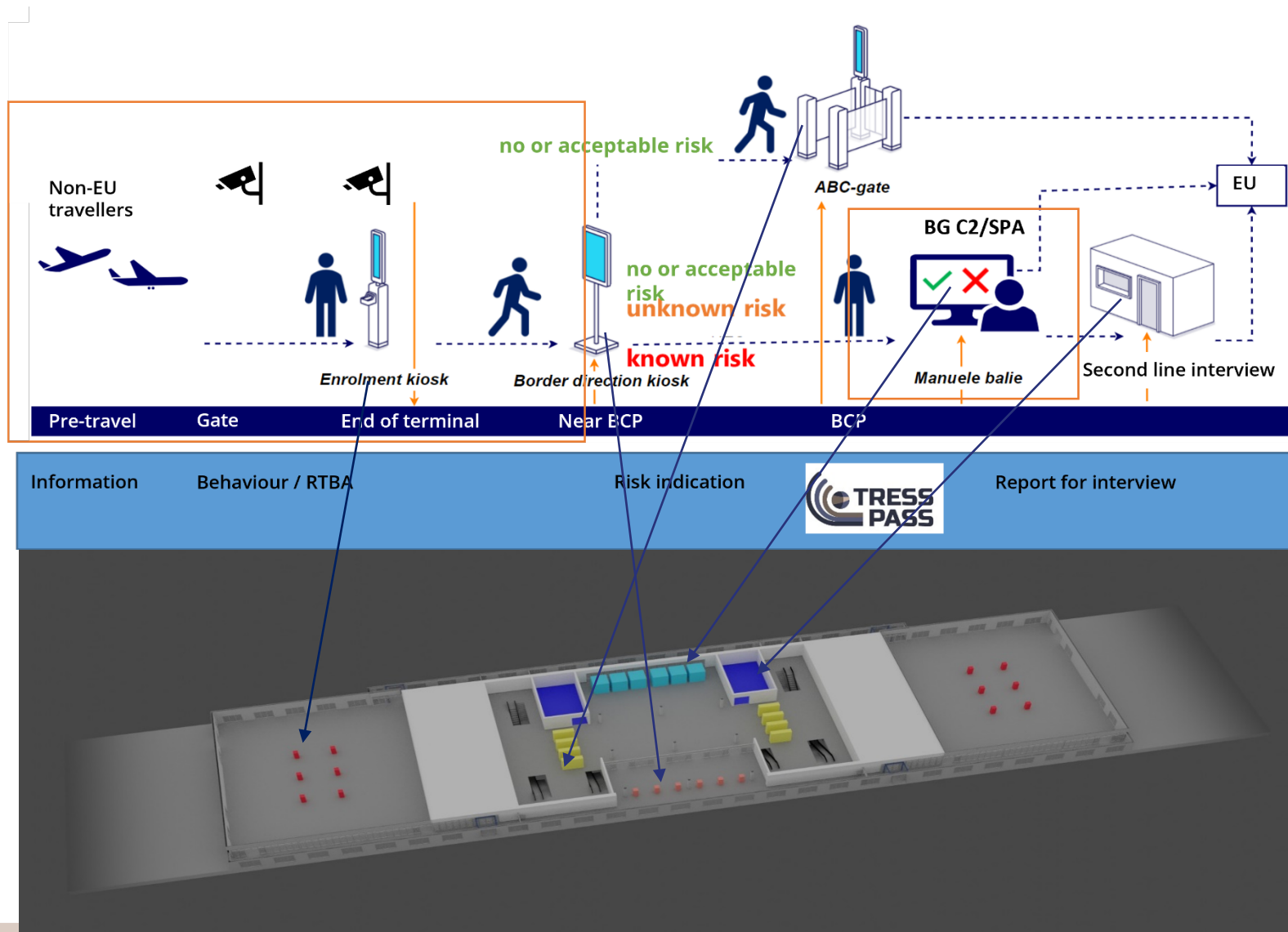
- Biometrics flow simulation and performance assessment
- Biometrics-on-the-fly logistics simulation and performance assessment
- Multi-biometrics corridor performance assessment for BCP on-the-fly traveler ID verification



# Risk-BS Simulation Scenario @ Airport Arrivals BCP

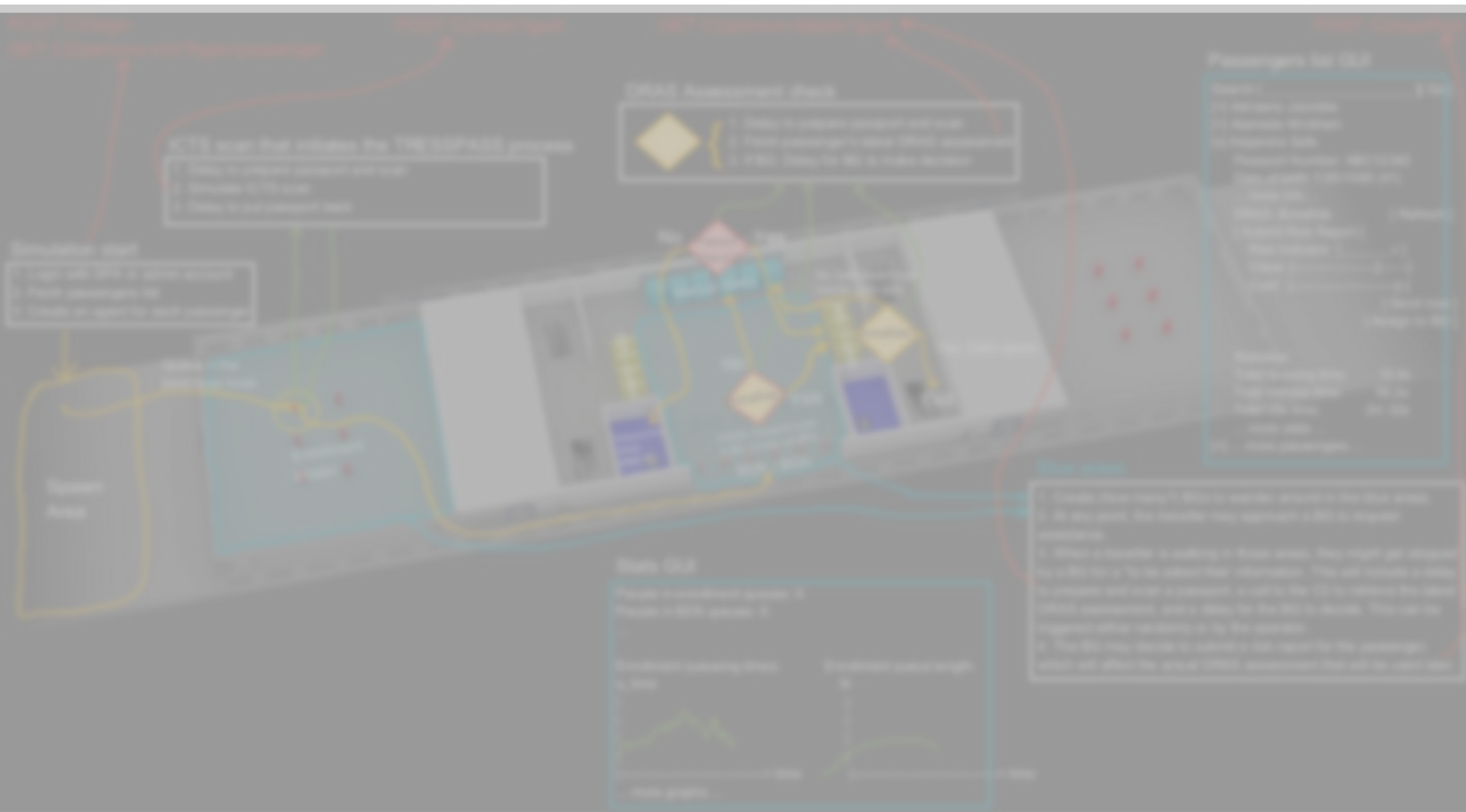


# Airport Arrivals BCP Simulation Model for Risk-BS Logistics Assessment





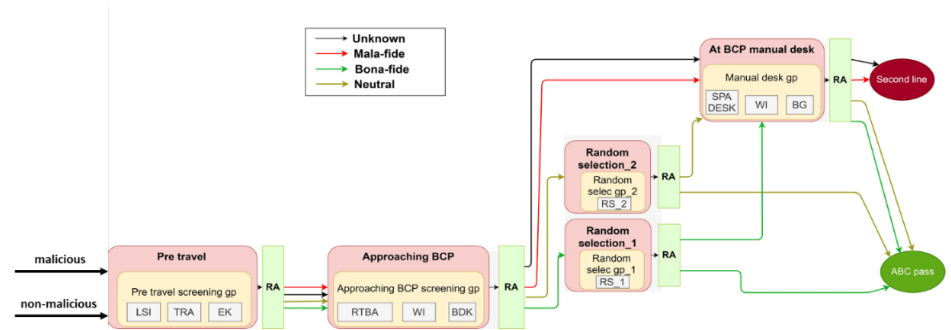
# Risk vs Rule BS simulation testbed configuration parameters setup



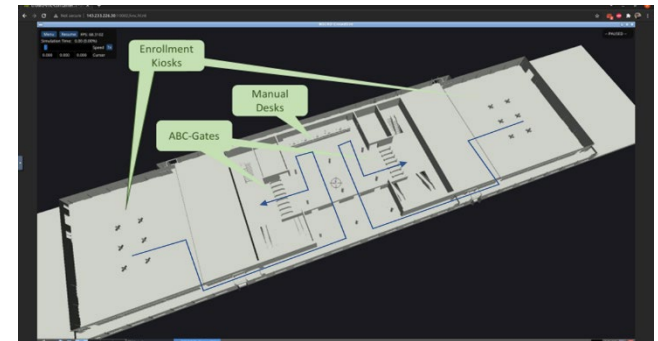
# Simulation Parameters Definition

- Provided **detailed quantitative evaluation** of the performance of an RBS system using a wide spectrum of KPI's ranging from risk, service times, operational flows, labor estimates, cost analysis, ...

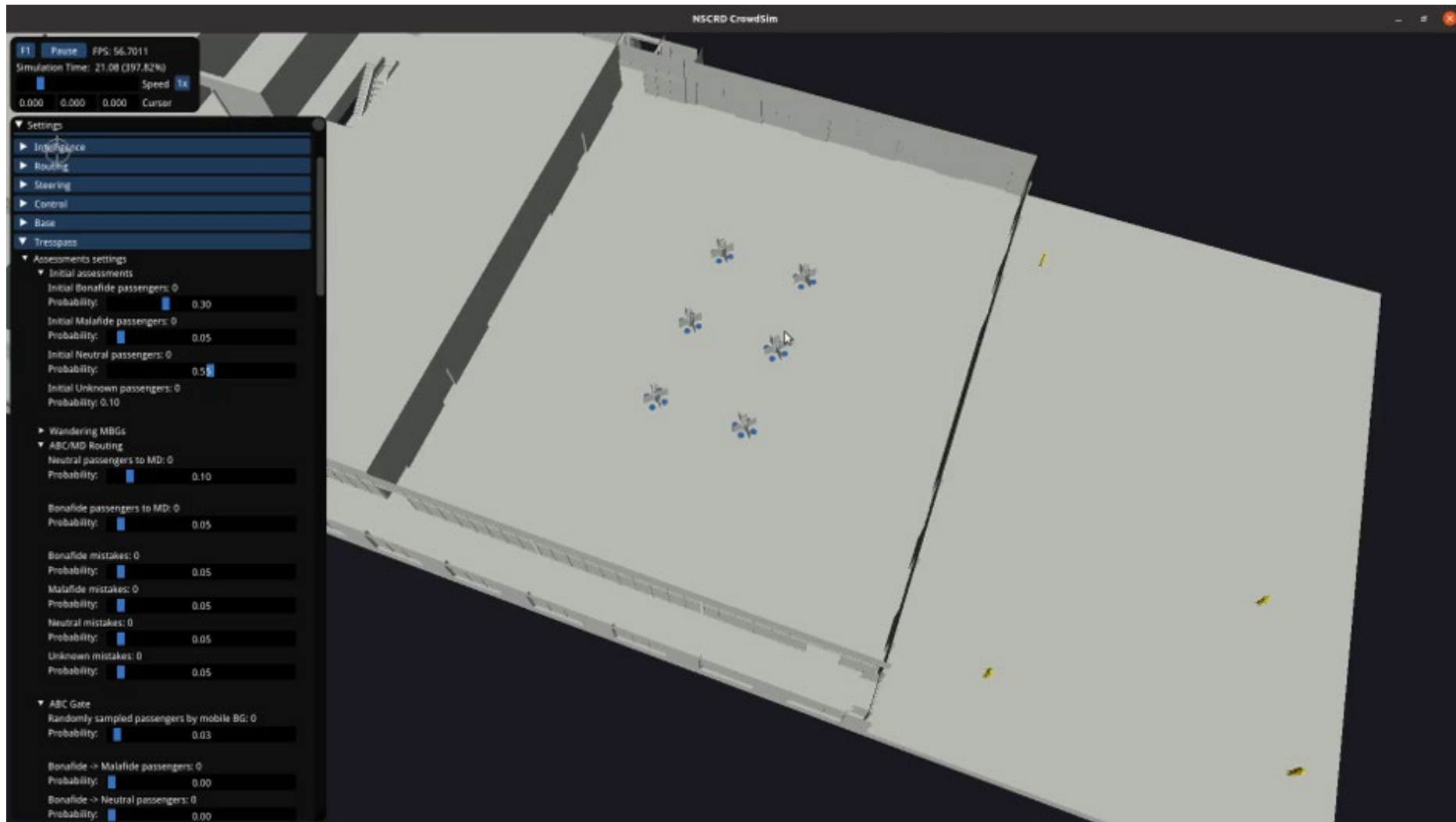
|          | Low performance | Medium performance | High performance |
|----------|-----------------|--------------------|------------------|
| Bonafide | 15%             | 40%                | 80%              |
| Neutral  | 55%             | 45%                | 13%              |
| Malafide | 5%              | 5%                 | 2%               |
| Unknown  | 25%             | 10%                | 5%               |



| Arrival rate per hour | Total number of travellers | EU/non-EU (tresspass) | EU (direct ABC gate) |
|-----------------------|----------------------------|-----------------------|----------------------|
| Busy                  | 1100                       | 550                   | 550                  |
| Regular               | 400                        | 200                   | 200                  |
| Quiet                 | 120                        | 60                    | 60                   |



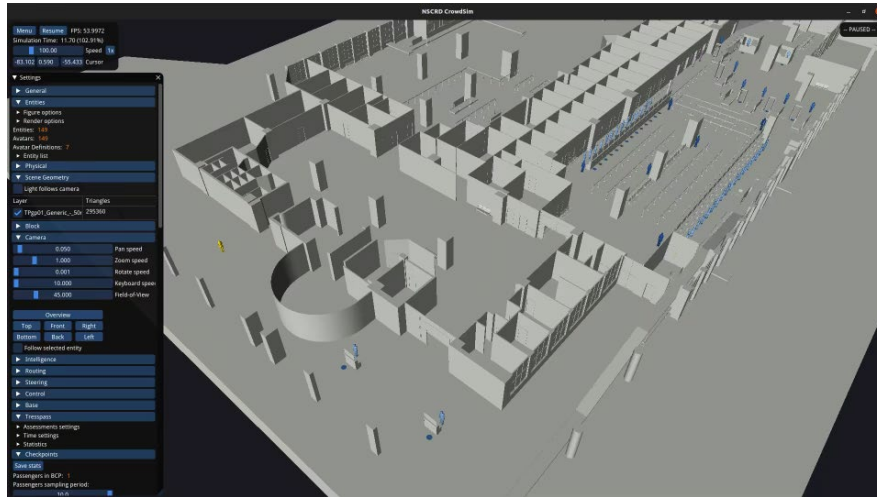
# Risk-BS vs Rule-BS iCrowd simulation: Airport Arrivals BCP testbed



# Benchmarking Risk-based vs Rule-based Security for Airport BCP using iCrowd

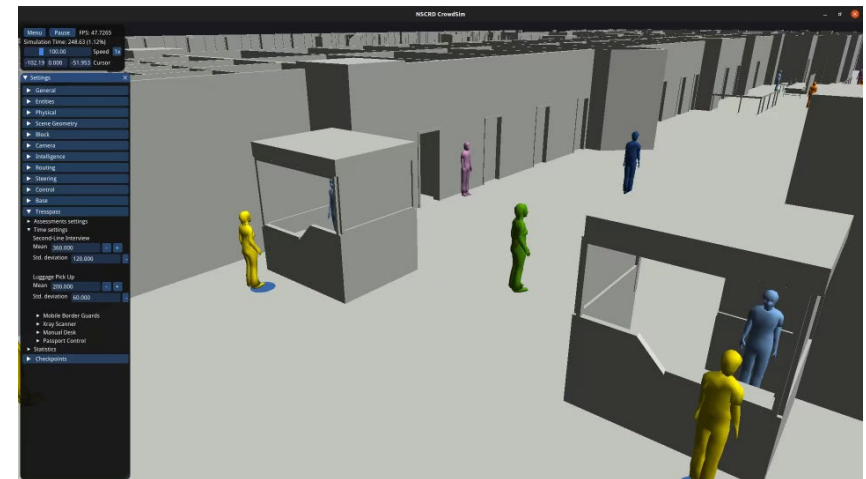
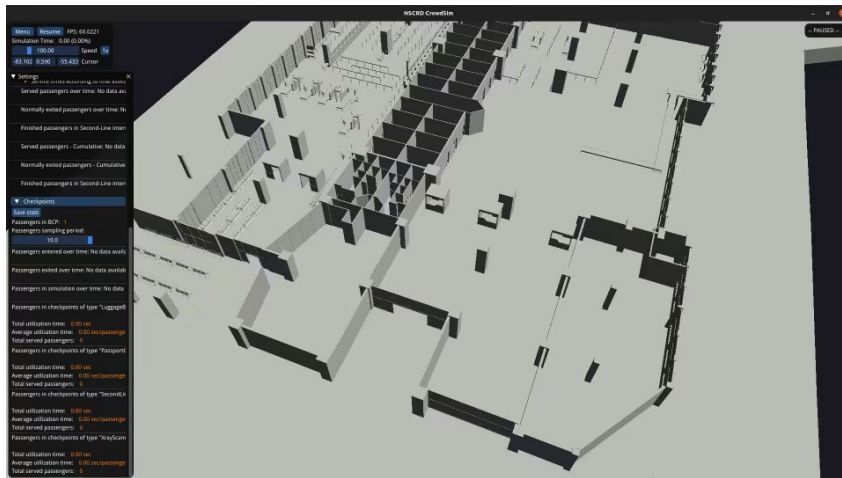
- Allowed to compare the performance of risk-based security by benchmarking it **against** rule-based security policies at BCPs
- **Performance Comparison:**
  - *Within allowing accumulating queues up to 100 per hour with fixed # of border guards,*
    - ➔ **RBBM can handle 1 (LP) to 3 (HP) times higher flowrate than the current rule-based situation.**
  - *Without allowing any queues and varying the number of borderguards for that,*
    - ➔ In case of a **low performance system** the **same number of borderguards are needed**, but
    - ➔ **1/3** in case of a **high-performance system**

# Risk-based Security Assessment at Sea Port BCP using iCrowd: Departures





# Sea Port Greek Pilot using iCrowd Simulator: Arrivals Terminal

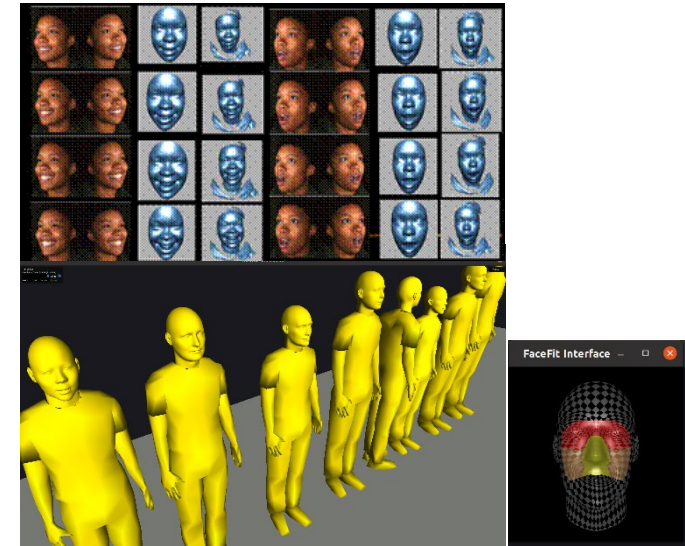
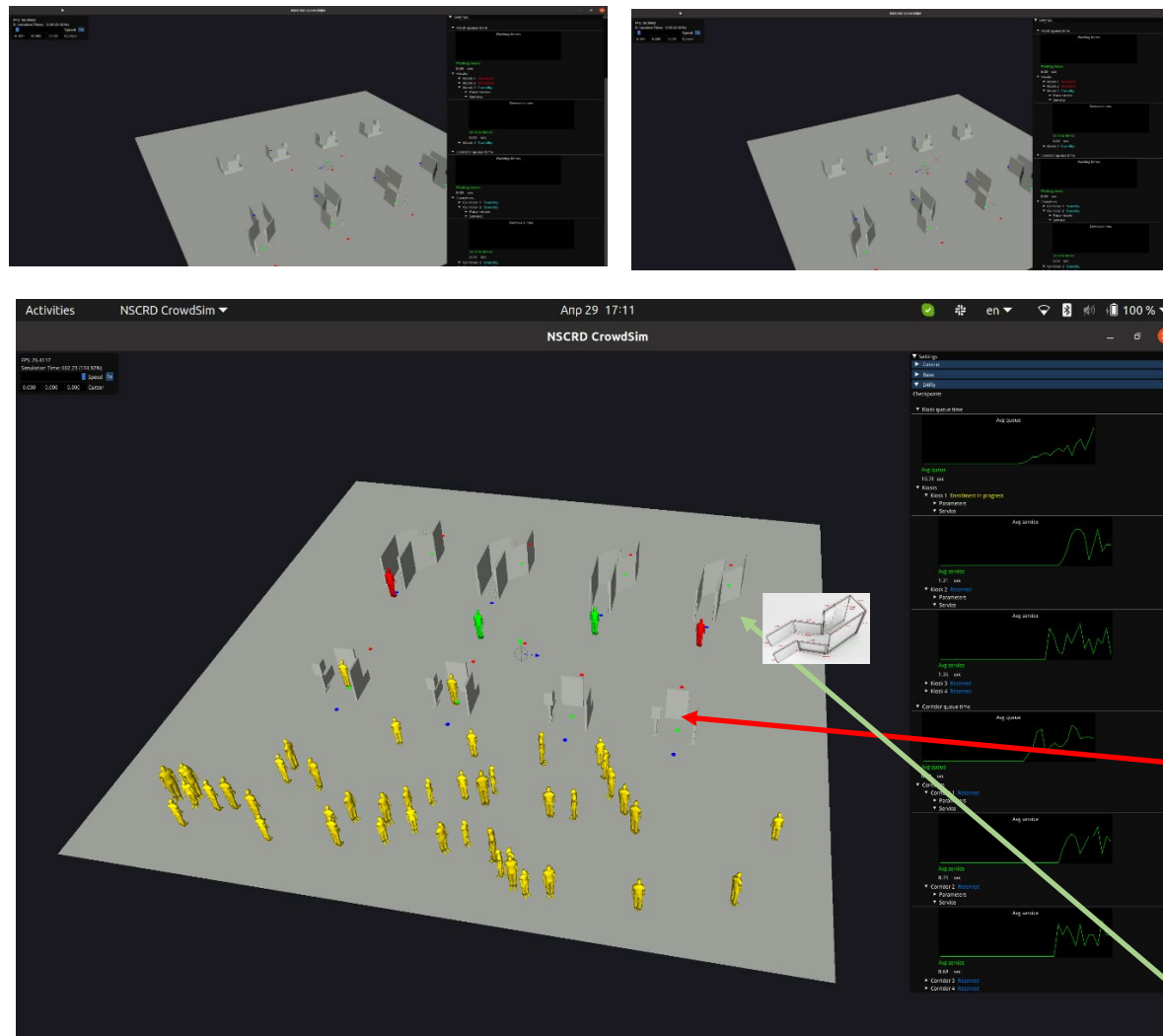


## BCP PERFORMANCE INDICATORS

| Indicators                  | Description   |
|-----------------------------|---|
| Effectiveness               | Success-rate of stopping unauthorised travellers when they attempt to cross the border at the BCP                     |
| Flow-rate                   | Speed of the flow of travellers as they approach and cross the border at the BCP                                      |
| Efficiency                  | Number of resources required at the BCP to achieve a certain degree of effectiveness and/or certain minimal flow-rate |
| Level of ethical compliance | Extent to which a BCP mitigates negative ethical impact on the travelling public and on the public in general         |

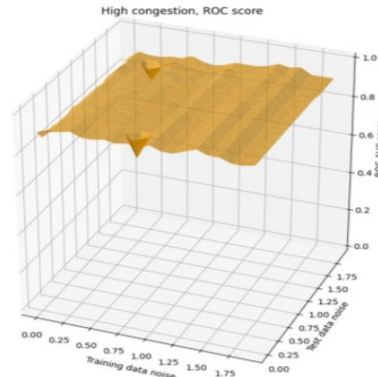
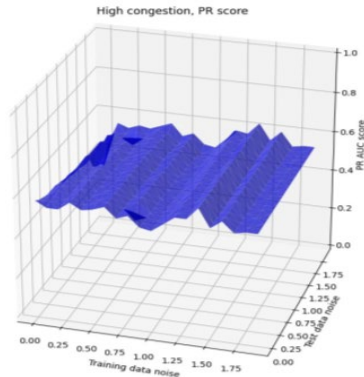


# Biometrics flow simulation with iCrowd

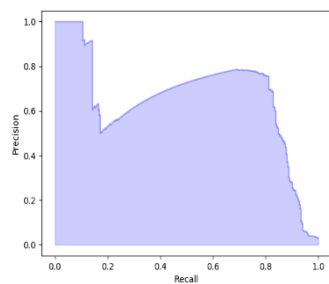


- 3D Faces from BU-3DFE db are associated with iCrowd agent mannequins
- **2-Stage Process**
  - **Stage 1: Enrollment & Match** against criminal 3Df db
  - **Enrollment:** Faces are “scanned” and converted to 3D face biometric templates
  - **Matching:** Agent 3Df template matched against known criminal 3Df templates db
    - Negative id → **Green**
    - Positive id → **Red**
  - **Stage 2:** Biometric corridor verification – functional and adaptable to the functional specs of each pilot.

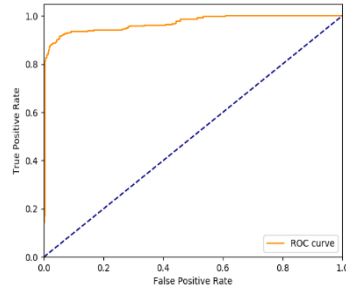
# Anomaly detection using RNN and iCrowd



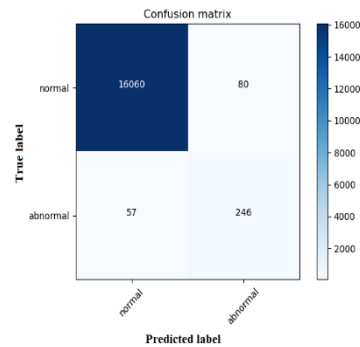
Training with high congestion data and different noise levels.  
Testing with low-to-medium congestion data



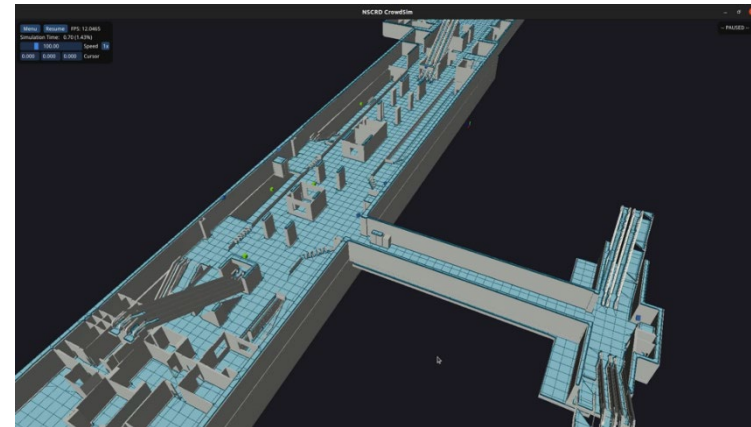
Precision-Recall Diagram



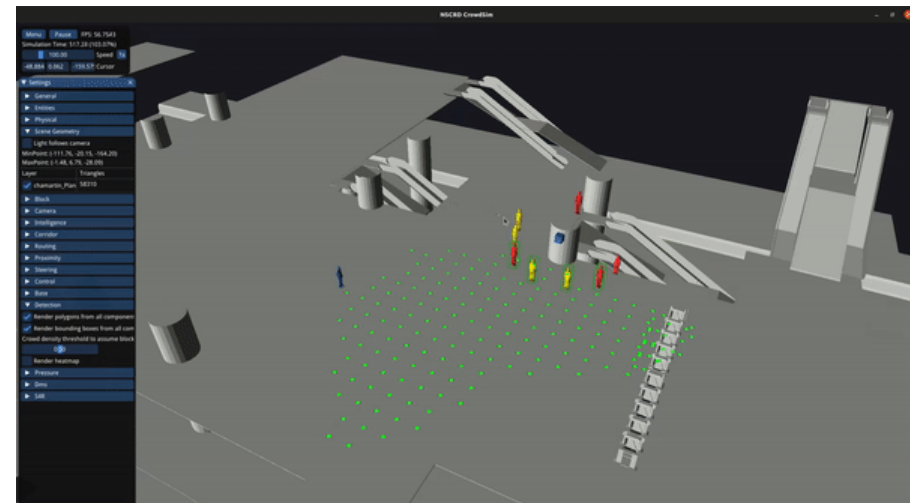
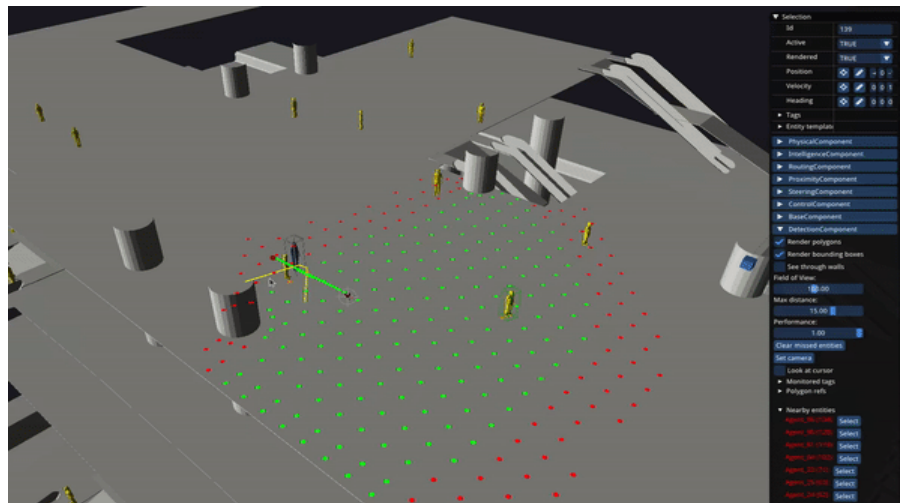
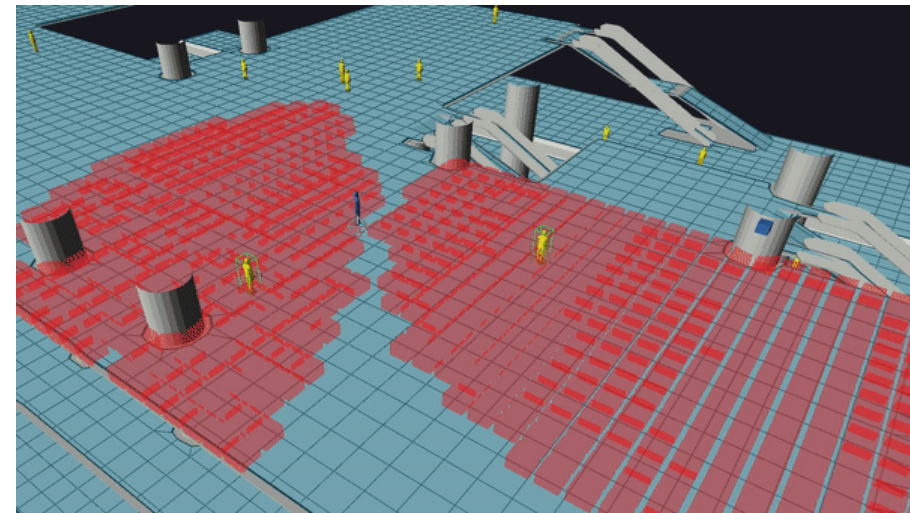
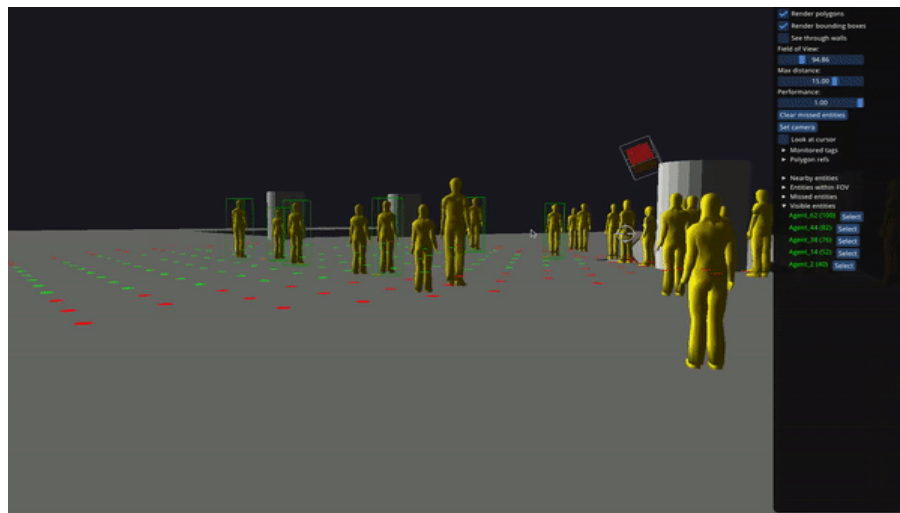
ROC Curve



Confusion Matrix



# Assessing Surveillance Infrastructure Effectiveness and Cost Effectiveness with iCrowd Simulator



# Conclusions

- Risk-based security (RBS) is a promising concept for providing security with convenience to passengers
- Risk Assessment is a complex process and should adhere to GDPR rules
- RBS can increase effectiveness but delay must be controlled as well
- Realistic testing is a challenging task and requires an integrated C2I and Simulation environment to test algorithms, protocols, procedures and technologies associated with risk assessment
- OCULUS C2I and the embedded iCrowd Simulator offer such a comprehensive implementation and testing environment for RBS
- Extensive simulation and field pilot tests used in TRESSPASS to test the risk assessment provided strongly supported evidence that RBS increases effectiveness and efficiency at security check points.
- A multi-biometrics corridor can be an effective means for on-the-fly ID testing
- A Robust anomaly detection RNN algorithm in conjunction with well designed and tested via simulation video surveillance system can detect suspicious behaviours and justify investment in video infrastructure & analytics.



# Contact information

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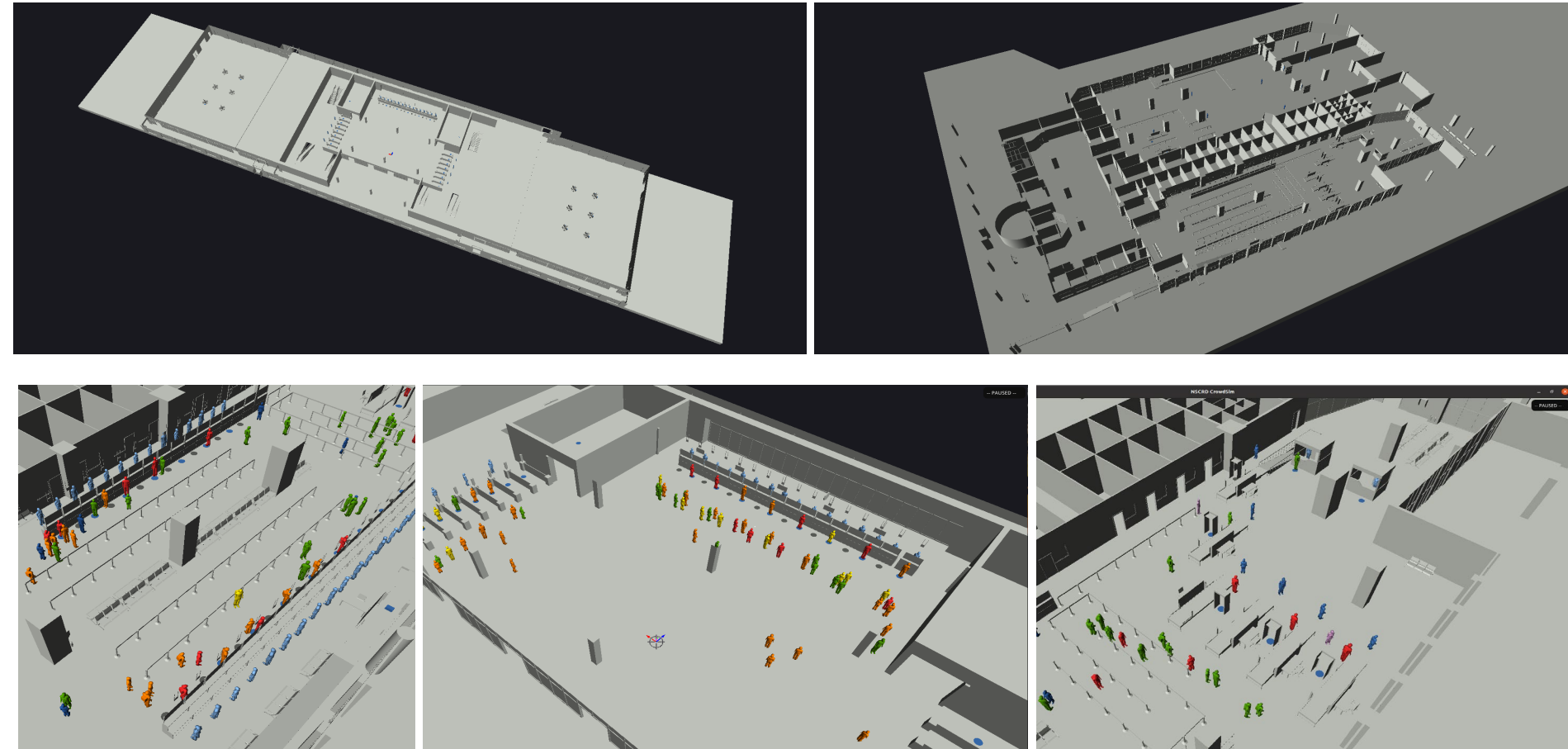
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fax: +301-6532175

## **ISL video channel on vimeo:**

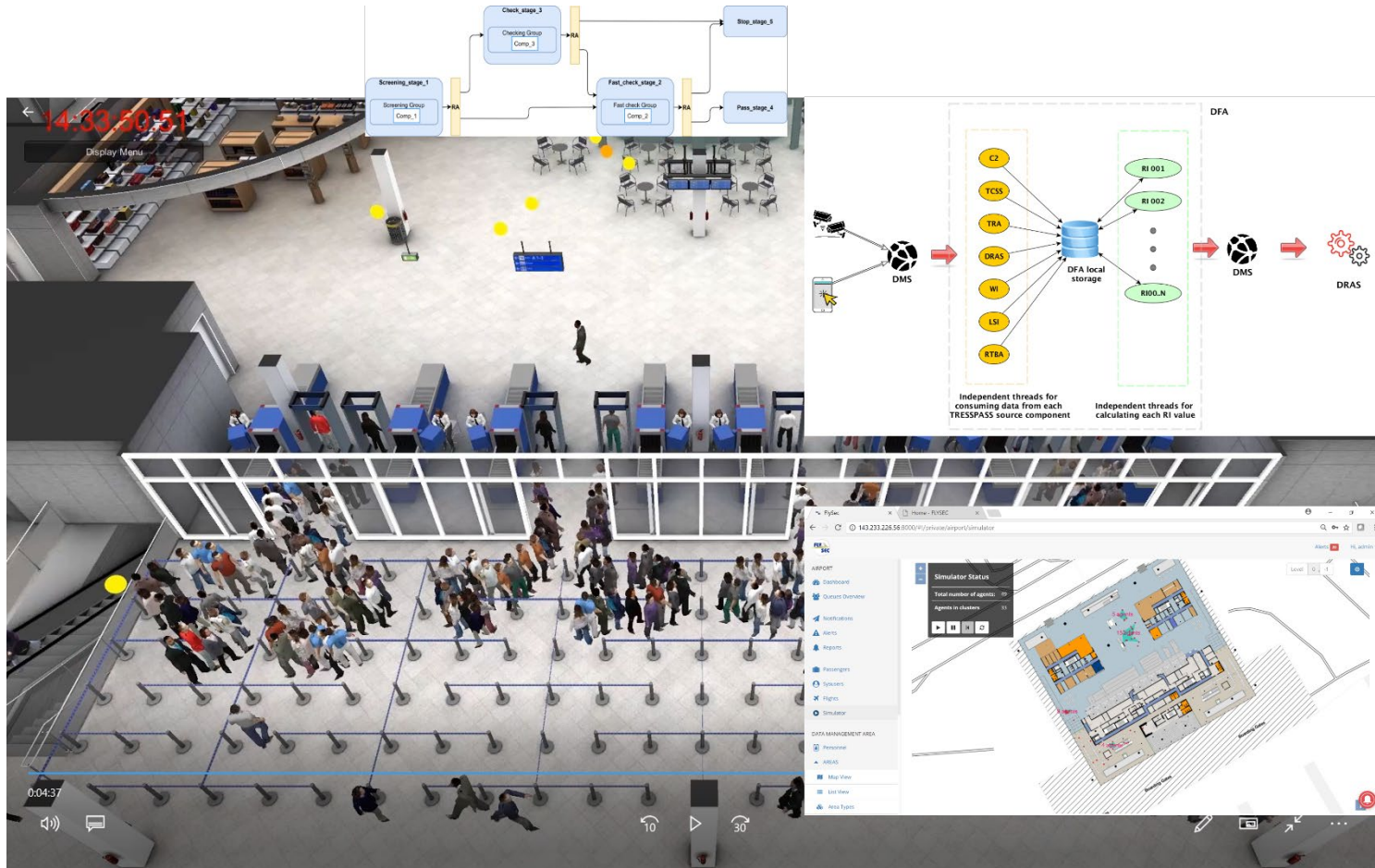
<https://vimeo.com/isldemokritos/videos/page:1>

# Development of detailed 3D models for iCrowd Simulations



# Integrated simulation environment

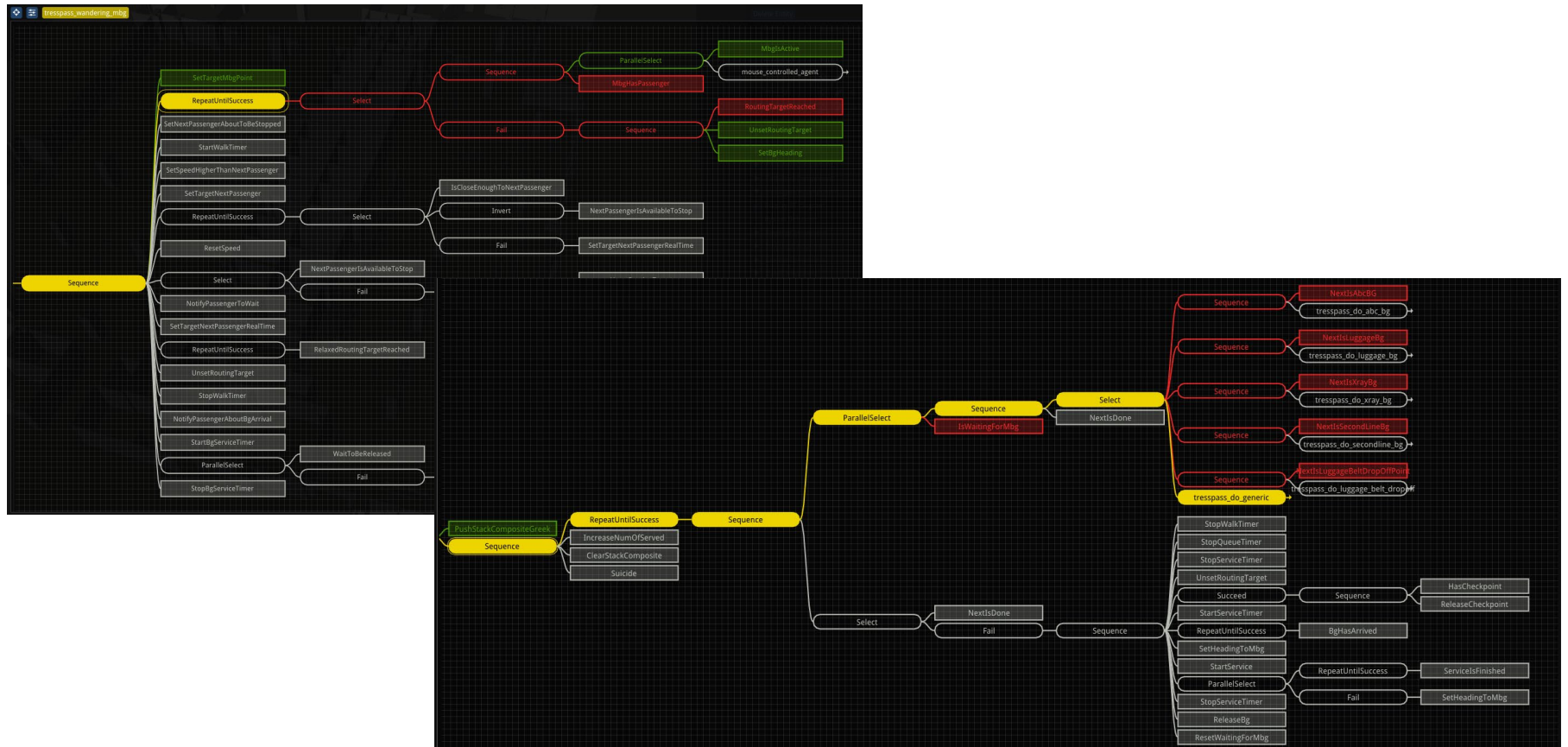
- Development of the integrated TRS Simulation Environment





# iCrowd complex behavioral models

- Development of new and complex behavioral models of passengers and border guards in iCrowd Simulator



# iCrowd Simulation-as-a-Service (SaaS)

## Simulation Phase: iCrowd Simulation-as-a-Service (SaaS) Environment

- The end-users were given access to a VM prepared with their submitted configurations.
- Training was done remotely using the **TRS e-learning platform** that consisted of a teleconference platform for teaching and a secure VPN connection providing each end user trainee direct access to the iCrowd simulator on a separate and private VM under the supervision of the instructor/trainer.
- The end-users had the opportunity to execute **remotely & securely** their scenarios, adjust them and run them again, and extract the results in .csv files, until the results were acceptable.
- The end-user, as the operator of the simulator, can observe the execution of the simulation in real time, get metrics of the desired indicators, and manipulate checkpoints and agents.

