

- 5G: Device-to-Device (D2D) networks,
- Security issues: potential strong malware propagation,
- Multi-Agent Simulation for complex systems.

# Objectives

- Build an agent based simulator for the Malware Propagation model,
- Identify the critical relations between the parameters,
- Study the virus propagation by the mean of simulation.

# The Malware Propagation Model

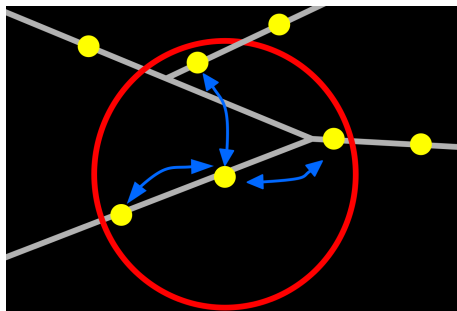
## Malware and Anti-malware Transmission

Devices  $a_1, a_2, \dots$  moving on a map.

### Connection

Two devices  $a_i, a_j$  are connected if

- $d(a_i, a_j) \leq r,$



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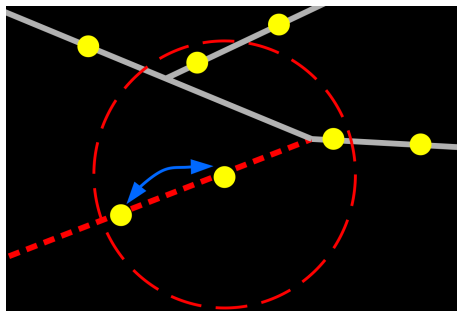
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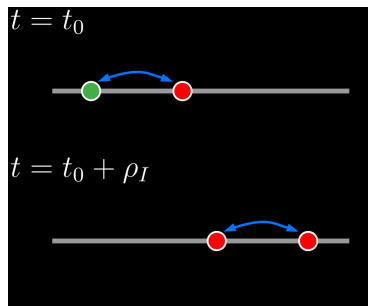
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### Malware Transmission Rule

Connection time greater than  $\rho$ .

### State of $a_i$ at time $t$

$\xi_i(t) := (\text{state of device } a_i \text{ at time } t)$   
 $\in \{\text{susceptible, infected}\}$

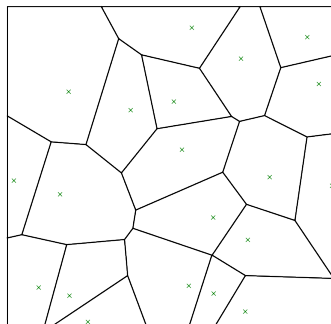
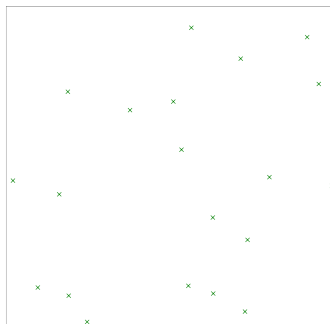


# Environment and Agents

## Poisson-Voronoi Tessellations

$\lambda$  : surface intensity of the Voronoi seeds,  $H$  : side size of the map.

- 1 Random Seeds number  $N$  : Poisson variable with parameter  $\lambda H^2$ ,
- 2 Random Seeds positions  $Q_1, \dots, Q_N \in [0, H] \times [0, H]$ ,
- 3 Voronoi cells  $C_i := \{X \in [0, H]^2 \mid \forall j \in \{1, \dots, N\}, \|X - Q_i\| \leq \|X - Q_j\|\}$ .



# Environment and Agents

## Initial Distribution of the Agents

$\theta$  : Length intensity of susceptible agents,

- On a street of length  $L$

- ➊ Random number  $N_S$  of agents: Poisson variable with parameter  $\theta L$ ,

- ➋ Random positions on the street  $X^{(1)}, \dots, X^{(N_S)}$ ,

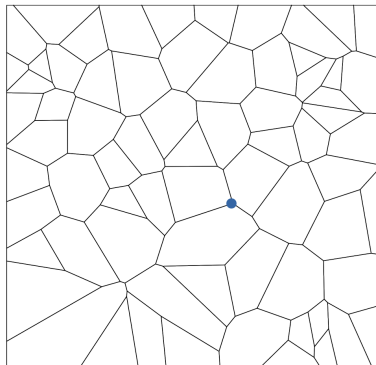
- One infected agent near the center of the map

# Environment and Agents

Mobility : WayPoint Algorithm

## Definition (WayPoint)

Each agent has a **Home**, and it moves back and forth between its home and a new destination every **Trip**.





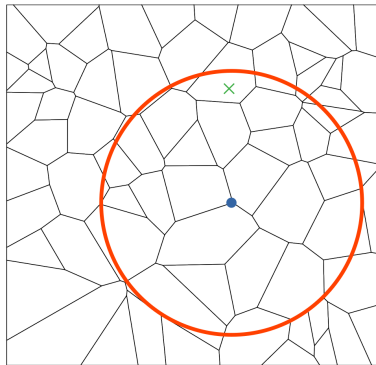
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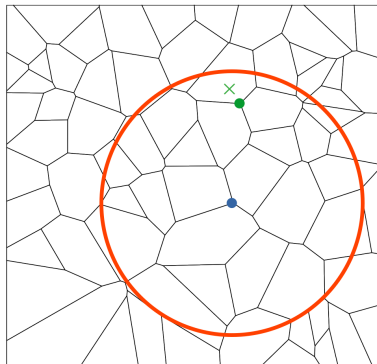
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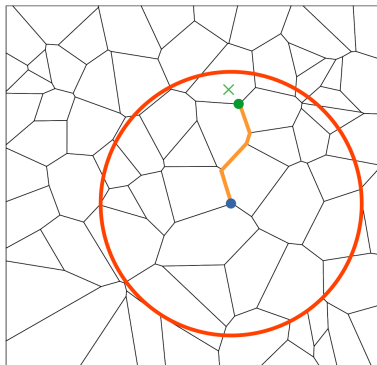
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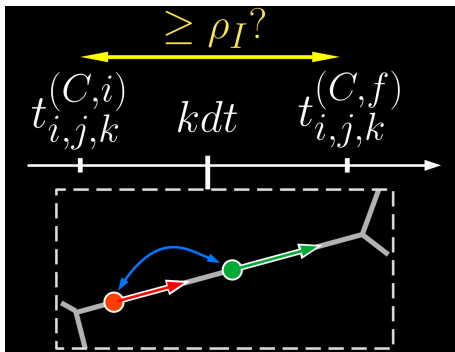
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- Set the **destination** as the closest map node to  $(x_d, y_d)$ ,
- Go to **destination** and go back **Home** via a "good" path.



# The Simulator

## Track the Virus Propagation

- If  $a_i$  and  $a_j$  are connected at  $kdt$ , we can compute the connection interval  $[t_{i,j,k}^{(C,i)}, t_{i,j,k}^{(C,f)}] \ni kdt$  using their movement equations,
- If  $a_i$  is infected, InfectNeighbors( $a_i$ ) [Algorithm 2]: updates  $T_{j,k}^{(I)}$  for each susceptible neighbor  $a_j$  of  $a_i$



# Choice of parameters and simulation results

## What Values for the Parameters ?

**Simplified Model.** The initially infected  $a_{l_0}$  visits a succession of streets  $\hat{\mathcal{E}}_0, \hat{\mathcal{E}}_1, \dots$ , each having an independent length  $L_{\lambda,i} \sim f_{\lambda,L}$ , where  $f_{\lambda,L}$  is the density function of the edges lengths in a PVT having a seeds intensity equal to  $\lambda$ . No white-knights in this model.

(We deduced  $f_{\lambda,L}$  from  $f_{1,L}$  using a length unit change)

Proposition (Kenneth A. Brakke. "Statistics of Random Plane Voronoi Tessellations")

$$\text{If } L_\lambda \sim f_{\lambda,L}, \text{ then } \mathbb{E}[L_\lambda] = \frac{2}{3\sqrt{\lambda}}.$$

What can we say about  $T^{(l)} := \inf\{t \geq 0 \mid \exists a_j \neq a_{l_0} \text{ such that } \xi_{j,t} = l\}$  ?

Lower Bounds for  $\mathbb{E}[T^{(l)}]$

$$\mathbb{E}[T^{(l)}] \geq \frac{2}{3\sqrt{\lambda}v} \cdot (e^{\lambda\rho^2v^2} - 1), \quad \mathbb{E}[T^{(l)}] \geq \frac{1}{2\sqrt{\lambda}v} (\sqrt{\lambda}/\theta - 4/3).$$

**Note.**  $\sqrt{\lambda}\rho v \gg 1 \iff \rho v \gg \mathbb{E}[L_\lambda], \quad \sqrt{\lambda}/\theta \gg 1 \iff \theta\mathbb{E}[L_\lambda] \ll 1.$

# Choice of parameters and simulation results

## Propagation Indicators

- $\tau_u := \inf\{t \geq 0 \mid \exists a_j \in \mathcal{I}(t) : \|X_j(t) - X_{l_0}(0)\| \geq u\}.$

## Propagation Speed

The speed with which the virus spreads in space.

$$\mathcal{V} := \limsup_{u \rightarrow +\infty} u \mathbb{E}[1/\tau_u],$$

## Infection Rate

the rate of agents infected inside the area reached by the virus.

$$\mathcal{R} := \limsup_{u \rightarrow +\infty} \frac{|\mathcal{I}(\tau_u)|}{|\{X_j(\tau_u) \mid a_j \in \mathcal{A}\} \cap B(X_{l_0}(0), u)|},$$

# Choice of parameters and simulation results

## Default Parameters' Values and Stop Condition

Unless otherwise stated, the parameters will have the following values

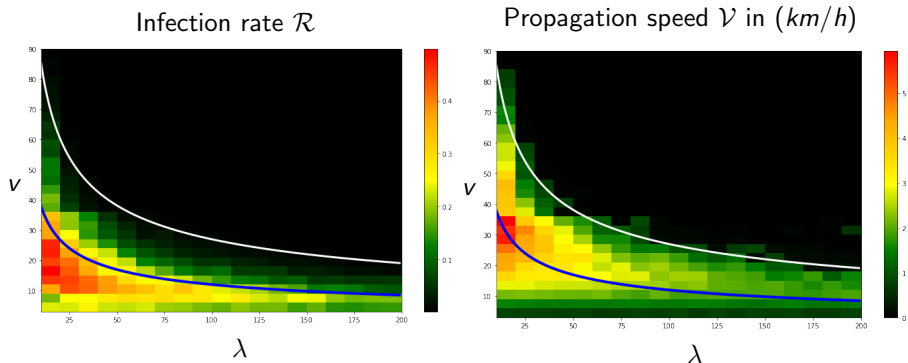
$$u = 3.5km, \quad H = 10km, \quad \lambda = 50km^{-2}, \\ \theta = 3km^{-1}, \quad v = 5km/h, \quad \rho = 20s, \quad r = 200m.$$

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Let  $u_k := \max\{\|X_{j,k} - X_{l_0}(0)\| \mid a_j \in \mathcal{A}\}$ , (max propagation radius)

Stop at step  $k$  if :  $(u_k \geq u \quad \text{or} \quad u_k/(kdt) < 0.05km/h \quad \text{or} \quad |\mathcal{I}_k| = 0)$ .

# Choice of parameters and simulation results



**Figure:**  $\lambda \in [10, 200](km^{-2})$ ,  $v \in [3, 90](km/h)$ . The blue curve:  $\sqrt{\lambda}\rho v = 2/3$  ( $\rho v = \mathbb{E}[L_\lambda]$ ), and the white one:  $\sqrt{\lambda}\rho v = 3/2$



# Choice of parameters and simulation results

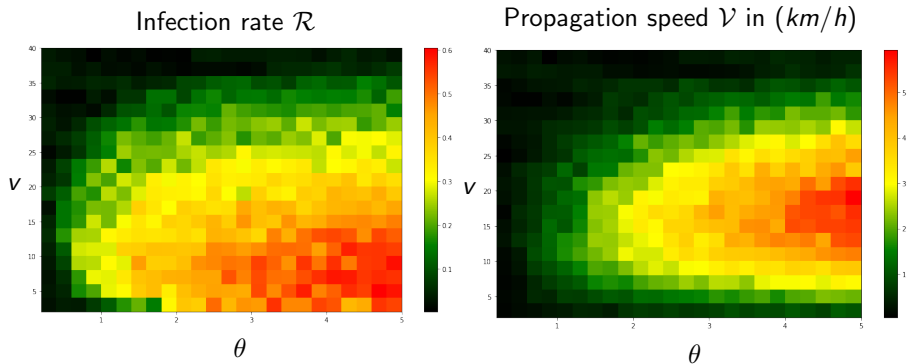


Figure:  $\theta \in [0.2, 5](km^{-1})$ ,  $v \in [2, 40](km/h)$ .

## Conclusion

- Agent based simulation is a powerful tool to study D2D network systems,
- The virus does not propagate when  $\sqrt{\lambda\rho\nu} > 1.5$ ,
- The propagation is maximal for  $\sqrt{\lambda\rho\nu} \approx 2/3$

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## Future Work

- Introduce "white knights"
- Study the survival/extinction of the malware
- Predict what happens on real maps