

# On a Spatial Epidemic Propagation Model

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# Outline

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

- 1 Epidemic models
- 2 Properties of the mathematical model
- 3 Numerical solution and its properties
- 4 Numerical tests
- 5 Summary, future work

# Epidemic models

# Mathematical models of diseases

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

## Basic assumptions.

- the population is presumed to be constant in size;
- they are divided into three classes:
  - 1 **I**(t): infected individuals who can pass on the disease to others;
  - 2 **S**(t): susceptibles who have yet to contract the disease and become infectious,
  - 3 **R**(t): members who have been infected but cannot transmit the disease for some reason, e.g., they have been isolated from the rest of the population.

# Mathematical models of diseases(cont'd)

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

## Kermack and McKendrick, 1927

$$S' = -aSI,$$

$$I' = aSI - bI,$$

$$R' = bI,$$

$I = I(t)$ : number of infective,

$S = S(t)$ : number of susceptible and

$R = R(t)$ : number of recovered (removed) members.

$a > 0$ : contact rate;  $b > 0$ : recovery coefficient

This model has been improved several times taking into the account also *births*, *deaths*, *latent periods*, *reinfections*, *incubations* etc.

# Inclusion of spatial dependence

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

How spatial dependence can be introduced into the model?

- Consider subpopulations that are connected into a network.
- Allow the motion of the individuals in the population.
- We will consider another approach:
  - the speed of the motion of the individuals can be neglected (compared to the speed of the disease)
  - a member of the population can infect only members in its well defined spatial neighbourhood.

# Inclusion of spatial dependence

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

## Mathematical model with spatial dependence

$$S'_t(x, t) = - \left( \int_{N(x)} W(|x' - x|) I(x', t) dx' \right) S(x, t),$$

$$I'_t(x, t) = \left( \int_{N(x)} W(|x' - x|) I(x', t) dx' \right) S(x, t) - bI(x, t),$$

$$R'_t(x, t) = bI(x, t),$$

$S = S(x, t)$ ,  $I = I(x, t)$  and  $R = R(x, t)$  are now spatial dependent densities.

The nonnegative weighting function  $W$  depends only on the distance of the points  $x'$  and  $x$ , and  $N(x)$  is a prescribed neighbourhood of the point  $x$ .

# Inclusion of spatial dependence

Simplifications [Jones, Sleeman, 2011]:

- We consider 1D problems.
- $N(x) = [x - \delta, x + \delta]$ .
- $I$  is approximated with its second order spatial Taylor series.

Simplified mathematical model with spatial dependence

$$\begin{aligned}S'_t &= -S(\theta I + \phi I''_{xx}), \\I'_t &= S(\theta I + \phi I''_{xx}) - bI, \\R'_t &= bI,\end{aligned}$$

where

$$\theta = \int_{-\delta}^{\delta} W(|u|) \, du, \quad \phi = \frac{1}{2} \int_{-\delta}^{\delta} u^2 W(|u|) \, du$$

are positive constants that can be computed from the model.



On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

# Properties of the mathematical model

# Some qualitative properties of the model

## Simplified mathematical model with spatial dependence

$$\begin{aligned}S'_t &= -S(\theta I + \phi I''_{xx}), \\I'_t &= S(\theta I + \phi I''_{xx}) - bI, \\R'_t &= bI.\end{aligned}$$

Our requirements are:

### P1 Additivity property

$S + I + R$  is constant at a fixed spatial position.

### P2 Monotonicity property

- $S$  monotone decreases in time
- $R$  monotone increases in time

### P3 Nonnegativity property

$S > 0, I \geq 0, R \geq 0$  at  $t = 0$

↓

$S, I, R \geq 0.$

# Some qualitative properties of the model

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

**Lemma.** If the condition

$$\theta I + \phi I''_{xx} \geq 0 \quad (1)$$

is satisfied then properties [P2] and [P3] are true. Property [P1] is true without any restrictions.

**Remark.** The condition (1) is also necessary.

**Remark.** The above condition is hardly checkable: it depends on the values of the solution  $I$  in the whole solution domain.

# Travelling wave solutions

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

In order to model epidemic waves we are looking for travelling wave solutions. Let us set

$$S(x, t) = \tilde{S}(x - ct), \quad I(x, t) = \tilde{I}(x - ct), \quad R(x, t) = \tilde{R}(x - ct),$$

where  $c$  is the constant wave speed,  $\tilde{I}$  and  $\tilde{S}$  have the properties

$$\lim_{\xi \rightarrow \pm\infty} \tilde{I}(\xi) = 0, \quad \lim_{\xi \rightarrow \pm\infty} \tilde{I}'(\xi) = 0, \quad \lim_{\xi \rightarrow \infty} \tilde{S}(\xi) = \tilde{S}^\infty > 0.$$

# Travelling wave solutions

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

After some manipulations we get:

Form of the system after inserting the wave form solutions

$$\tilde{S}' = \frac{c}{\phi} \log(\tilde{S}/\tilde{S}^\infty) - \frac{\theta c}{b\phi} (\tilde{I} + \tilde{S} - \tilde{S}^\infty),$$

$$\tilde{I}' = \frac{b}{c} \tilde{I} - \frac{c}{\phi} \log(\tilde{S}/\tilde{S}^\infty) + \frac{\theta c}{b\phi} (\tilde{I} + \tilde{S} - \tilde{S}^\infty),$$

$$\tilde{R}' = -\frac{b}{c} \tilde{I}.$$

# Travelling wave solutions

Let us introduce the notations

$$\tilde{S}^{-\infty} = \lim_{\xi \rightarrow -\infty} \tilde{S}(\xi), \quad \tilde{S}^{\infty} = \lim_{\xi \rightarrow \infty} \tilde{S}(\xi).$$

**Lemma.** The necessary condition of the travelling wave solution is

$$\tilde{S}^{\infty} > b/\theta.$$

Moreover

$$\tilde{S}^{-\infty} < b/\theta,$$

that is the epidemic wave does not leave enough susceptible members back to be able to sustain a new wave. If the necessary condition is satisfied then

$$c \geq 2\sqrt{\tilde{S}^{\infty} \phi(\tilde{S}^{\infty} \theta - b)}$$

is a lower bound for the wave speed.

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

# Numerical solution and its properties

# Finite difference scheme

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

We define a uniform spatial grid

$\omega_h = \{x_k \in [0, L] \mid x_k = kh, k = 0, \dots, N, h = L/N\}$  and a positive time step  $\tau > 0$ .

We apply the notations  $s_k^n \approx S(kh, n\tau)$ , etc.

We define the difference scheme as follows.

$$\frac{s_k^{n+1} - s_k^n}{\tau} = -s_k^n \left( \theta i_k^n + \phi \frac{i_{k-1}^n - 2i_k^n + i_{k+1}^n}{h^2} \right),$$

$$\frac{i_k^{n+1} - i_k^n}{\tau} = s_k^n \left( \theta i_k^n + \phi \frac{i_{k-1}^n - 2i_k^n + i_{k+1}^n}{h^2} \right) - bi_k^n,$$

$$\frac{r_k^{n+1} - r_k^n}{\tau} = bi_k^n,$$

$k = 0, \dots, N, s_{-1}^n = s_1^n, s_{N+1}^n = s_{N-1}^n$ , etc.



# Properties of the numerical solution

**Lemma.** The finite difference scheme satisfies the discrete version of [P1], and if the relation

$$0 \leq \theta i_k^n + \phi \frac{i_{k-1}^n - 2i_k^n + i_{k+1}^n}{h^2}$$

is true for all possible indices  $k$  and  $n$ , and the time step satisfies the condition

$$\tau \leq \min \left\{ \frac{1}{M(\theta + 4\phi/h^2)}, 1/b \right\},$$

where  $M = \max_{x \in [0, L]} \{S(x, 0) + I(x, 0) + R(x, 0)\}$ , then the discrete versions of the properties [P2] and [P3] are also satisfied. Under the above conditions the scheme is stable in maximum norm.

# Properties of the numerical solution (cont'd)

The condition

$$0 \leq \theta i_k^n + \phi \frac{i_{k-1}^n - 2i_k^n + i_{k+1}^n}{h^2}$$

is an a'posteriori condition. How to guaranty it a'priori?

We introduce the notation:

$$j_k^n := \theta i_k^n + \phi \frac{i_{k-1}^n - 2i_k^n + i_{k+1}^n}{h^2}.$$

Suppose that there are positive numbers  $P, Q, p, q > 0$  such that

$$Q|u - \delta|^q \leq W(u) \leq P|u - \delta|^p, \text{ if } u \in [0, \delta]. \quad (2)$$

# Properties of the numerical solution (cont'd)

**Lemma.** Assume that we have

$$\tau \leq \min \left\{ \frac{1}{M(\theta + 4\phi/h^2)}, 1/b \right\},$$

or

$$h \geq \sqrt{2P/Q} \frac{\delta^{p/2-q/2+1} \sqrt{q+1}}{\sqrt{(p+1)(p+2)(p+3)}}$$

and the time-step satisfies

$$\tau \leq \min \left\{ \frac{1}{M(\theta + 4\phi/h^2)}, 1/\left(b + \frac{2\phi M}{h^2}\right) \right\}.$$

Then the nonnegativity of  $i_k^n, s_k^n, r_k^n$  and  $j_k^n$  imply the nonnegativity of the next approximations  $i_k^{n+1}, s_k^{n+1}, r_k^{n+1}$  and  $j_k^{n+1}$ .

# Properties of the numerical solution (cont'd)

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

**Lemma.** Assume that we have

$$h \geq \sqrt{2P/Q} \frac{\delta^{p/2-q/2+1} \sqrt{q+1}}{\sqrt{(p+1)(p+2)(p+3)}}$$

and

$$\tau \leq \min \left\{ \frac{1}{M(\theta + 4\phi/h^2)}, 1/b \right\},$$

or the time-step satisfies

$$\tau \leq \min \left\{ \frac{1}{M(\theta + 4\phi/h^2)}, 1/\left(b + \frac{2\phi M}{h^2}\right) \right\}.$$

Then the nonnegativity of  $i_k^n, s_k^n, r_k^n$  and  $j_k^n$  imply the nonnegativity of the next approximations  $i_k^{n+1}, s_k^{n+1}, r_k^{n+1}$  and  $j_k^{n+1}$ .

# Properties of the numerical solution (cont'd)

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

Hence we have:

**Theorem.** Under the conditions of the previous lemma, the nonnegativity of the initial values  $i_k^0, s_k^0, r_k^0$  and  $j_k^0$  imply the discrete versions of the qualitative properties [P2] and [P3], and the scheme is stable in the maximum norm, too.

**Remark.** For the asymptotic case ( $h \rightarrow 0$ ) the condition has the form:

$$\frac{\tau}{h^2} \leq \frac{1}{4\phi M}.$$

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

# Numerical tests

# Parameter setting to the numerical tests

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

## Numerical simulation

We solve the problem on the interval  $[0,10]$  with standard finite difference schemes.

In the epidemic case the parameters are as follows:

- Model parameters:  $b = 0.5$ ,  $\phi = 2.86e-005$ ,  $\theta = 0.7$ .
- Mesh parameters:  $\Delta x = 1/199$ ,  $\Delta t = 1$  ( $\Delta t_{\max} = 1.34$ )
- Condition of the wave propagation:  $b/\theta > 0.71$

# Summary

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

- We have formulated the basic qualitative properties of the continuous and discrete epidemic models.
- We gave necessary and sufficient condition for the continuous model.
- We gave a priori checkable sufficient condition for the discrete model.
- We analyzed the travelling wave solutions in the continuous models and in the numerical examples.



# Future work

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

- More complex discrete models (not only diffusion).
- $1D \Rightarrow 2D, 3D$ .
- Other qualitative properties?
- Other semidiscretization?

On a Spatial  
Epidemic  
Propagation  
Model

Faragó  
Horváth

Epidemic  
models

Properties of  
the  
mathematical  
model

Numerical  
solution and  
its properties

Numerical  
tests

Summary,  
future work

# Thank you for your attention