

Highlights

Computational modelling of epithelial cell monolayers during infection with *Listeria monocytogenes*

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- Contraction and protrusion of uninfected cells are identified as the key mechanism to fight infection through mechanosensing.
- The protrusion level of the cell depending on the quantitative stress asymmetry in the cells results in better predictions of mound formation in infected monolayer than an on-off protrusion law.

Computational modelling of epithelial cell monolayers during infection with *Listeria monocytogenes*

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Abstract

Intracellular bacterial infections alter the normal functionality of human host cells and tissues. Infection can also modify the mechanical properties of host cells, altering the mechanical equilibrium of tissues. In order to advance our understanding of host-pathogen interactions, simplified *in vitro* models are normally used. However, *in vitro* studies present certain limitations that can be alleviated by the use of computer-based models. As complementary tools these computational models, in conjunction with *in vitro* experiments, can enhance our understanding of the mechanisms of action underlying infection processes. In this work, we extend our previous computer-based model to simulate infection of epithelial cells with the intracellular bacterial pathogen *Listeria monocytogenes*. We found that forces generated by host cells play a regulatory role in the mechanobiological response to infection. After infection, *in silico* cells alter their mechanical properties in order to achieve a new mechanical equilibrium. The model pointed the key role of cell-cell and cell-extracellular matrix interactions in the mechanical competition of

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bacterial infection. The obtained results provide a more detailed description of cell and tissue responses to infection, and could help inform future studies focused on controlling bacterial dissemination and the outcome of infection processes.

Keywords: Bacterial infection, mechanistic model, cellular and bacterial mechanobiology, finite element, *Listeria monocytogenes* .

1. Introduction

Listeria monocytogenes (*L.m.*) is a food-borne intracellular bacterial pathogen mainly affecting individuals with a weakened immune system such as elderly, pregnant women or newborns [1]. Its main route of transmission is through the ingestion of contaminated food, and its primary site of infection is the intestinal epithelium. *L.m.* can however breach this first physiological barrier *in vivo* and spread infection to secondary tissues, which often leads to fatalities in immunocompromised individuals, spontaneous abortion in pregnant women and neonatal death [2]. In 2017, 2480 cases of listeriosis were reported within the European Union, with a mortality rate of 13.8% [2]. In the same year, an outbreak in South Africa resulted in 216 deaths and 1060 confirmed cases [3]. To avoid these adverse outcomes, it is essential to advance our understanding of how *L.m.* interacts with host cells to facilitate its systemic spread and which mechanisms host cells adopt to restrict infection dissemination.

During infection of human cells, the homeostatic balance of host cells is often compromised and various alterations can occur at different scales [4, 5]. For instance, upon infection of a given epithelial cell in a monolayer *in vitro*, *L.m.* has the ability to spread to larger domains in several hours. To achieve intercellular spread, *L.m.* (and further intracellular bacterial pathogens like *Rickettsia parkeri*) reprograms infected host cells by secreting virulence factors that can alter the host cell-cell adhesion organization [6, 7]. This often leads to a weakening in intercellular force transduction thus making it easier for the bacterium to spread from one cell to another, since the stress it faces and which it needs to overcome to create and resolve a bacterial protrusion is lower [8, 9].

Although the biochemical signaling pathways that change during infection or that regulate the outcome of infection have been studied for decades, recent studies suggest that mechanical signals play also an important role

30 during host-pathogen interactions [8]. The biochemical and mechanical sig-
31 nals often crosstalk in yet to be identified ways. Human cells support their
32 shape and execute important functions, such as migration, through a set of
33 structural networks that span all over the cell and are largely composed by
34 polymeric filaments. Those filaments, together with the action of motor pro-
35 teins and adhesion complexes, allow cells to transmits forces to each other
36 but also to their surrounding microenvironment and often enable them to
37 sense it. Thus, in this complex network, multiple biomechanical interactions
38 take place between the extracellular matrix (ECM) and the cell membrane,
39 cytoskeleton, nucleus and other molecular entities [10].

40 We and others have shown that during infection with *L.m.* human cells
41 can change the organization of their cytoskeleton and their mechanical prop-
42 erties [11, 12]. Moreover, we recently showed that at late times post-infection
43 (>16 h post-infection) a mechanical competition emerges between infected
44 and nearby uninfected cells, where stiffer uninfected surrounding cells squeeze
45 and drive the extrusion of softer bacterially-infected cells [6, 13]. This battle
46 between infected and surrounding uninfected cells is to a large extent me-
47 chanical in nature, and is driven by changes in the interaction between com-
48 peting cell populations. However, the exact spatio-temporal changes in host
49 cell force generation and in biochemical signaling that occur during infection
50 and eventually lead to infected cell extrusion (*i.e.*, formation of mounds of
51 infected cells) are not fully understood yet.

52 In recent years, infection processes have been a main focus of research
53 due to the Covid-19 viral outbreak [14] but also because of the emergence
54 of multi-antibiotic resistant bacterial pathogens [15]. Despite the relevance
55 of developing computational tools to understand infection processes, few *in*
56 *silico* models have been formulated to unravel the biomechanical interac-
57 tions between human host cells, pathogens and/or their microenvironment.
58 Most infection computational models have focused on the dynamics of bac-
59 terial propagation in colonies considering contact forces, bacterial growth or
60 the interaction between bacteria and biomaterials, among others. However,
61 most of the models assume bacteria as particles [16] or two-dimensional (2D)
62 deformable bodies [5], thus ignoring its inherent three dimensional charac-
63 teristics.

64 In this context, for example, Jasevičius et al. presented an adhesive in-
65 teraction model where bacterial cells are simulated as discrete entities to
66 analyze the interaction of bacteria with flat surfaces within a liquid medium
67 [17]. Winkle et al. emphasized the importance of computational tools to ana-

68 lyze the spatiotemporal dynamics of bacterial populations. Accordingly, they
69 proposed an agent-based model taking into account the growth of the bacte-
70 ria and the mechanical interactions between bacteria, and between bacteria
71 and their environment [18]. Bacteria *N. gonorrhoeae* was studied by Bisht
72 and Marathe, who analyzed numerically the bacterial motility, with *tug-of-*
73 *war* models, on different surfaces or channels [16]. Ivančić et al. analysed
74 the formation of bioconvection patterns in suspensions of *Bacillus subtilis*
75 through a set of chemotaxis–convection–diffusion equations [19]. In order to
76 model bacterial micro-colonies interactions, Doumic et al. proposed a me-
77 chanical model studying the asymmetry of the bacteria and its friction with
78 the substrate [20]. Additionally, Delarue et al. compared *in vitro* and *in silico*
79 models by elucidating a collective mechanism in microbial populations, which
80 they called self-driven jamming [21]. A further combination of both *in vitro*
81 and *in silico* models was pursued by Grant et al. through the examination of
82 microcolonies of *Escherichia coli*. However, in this case authors investigated
83 the transition from 2D to 3D bacterial growth in microcolonies, they found
84 that mechanical forces between bacteria, and between bacteria and their en-
85 vironment are important for the transition of the bacterial microcolony from
86 2D to 3D growth [5]. *L.m.* interactions with human host cells were studied
87 by Ortega et al. through a computational model, focusing on the dynamics
88 of intercellular bacterial spread by modeling bacteria as particles within 2D
89 rigid (*i.e.*, non-deformable) host cells [22].

90 Only a few number of studies used a continuum approach by means of
91 the Finite Element Method (FEM), to simulate bacterial interaction with
92 biological tissues. For example, Limbert et al. presented a FEM for studying
93 *Staphylococcus aureus* biofilm colony formation based on microscopy imag-
94 ing. In this case, *S. aureus* colonies in contact with surgical sutures were
95 simulated. The aim of this study was to predict bacterial detachment when
96 the suture is deformed [23]. A combination of FEMs was used by Feng
97 et al. to compute bacterial biofilm growth [24]. Velic et al. analysed bacterial
98 growth on nanopatterned surfaces. This FEM allowed to unravel the interac-
99 tion between *Bacillus subtilis* and nanopatterned surfaces via a parametric
100 study [25]. Kandemir et al. presented an *in silico* approach for modeling
101 bacteria-hydrogel interplay, and together with *in vitro* experiments investi-
102 gated the mechanical alterations of the bacterial-hydrogel construct under
103 different conditions [26]. Volfson et al. used Discrete Element Simulations to
104 provide a multiscale analysis of *Escherichia coli* growth [27].

105 In this work, we extend our previous infection computational model [6] to

106 better understand how at late infection with intracellular bacterial pathogens
107 like *L.m.* uninfected and infected cells interact, and how the latter get ex-
108 truded out of the basal cell monolayer. We go a step forward, we formulate
109 a regulatory quantitative law of the mechanobiological interactions between
110 infected and uninfected cells. In addition, this mechanistic-law has been im-
111 plemented in a FE-based approach in order to test different hypotheses about
112 the way cell-cell and cell-ECM adhesions are distributed within the mono-
113 layer. For this aim, we have organized the paper as follows. In section 2,
114 we describe the mechanobiological context, focusing on the main mechanical
115 implications of infection on the biomechanics of host cells. In section 3, we
116 present the underlying mechanobiological model of the cell monolayer during
117 infection. Next, in section 4, we describe the numerical implementation of
118 this model. In section 5, the main results from simulations under different
119 conditions of infection are presented. Finally, in section 6, we discuss the
120 results and present the main conclusions of this work.

121 **2. Mechanobiological Context: Mechanobiology of epithelial mono-** 122 **layers under conditions of *L.m.* infection**

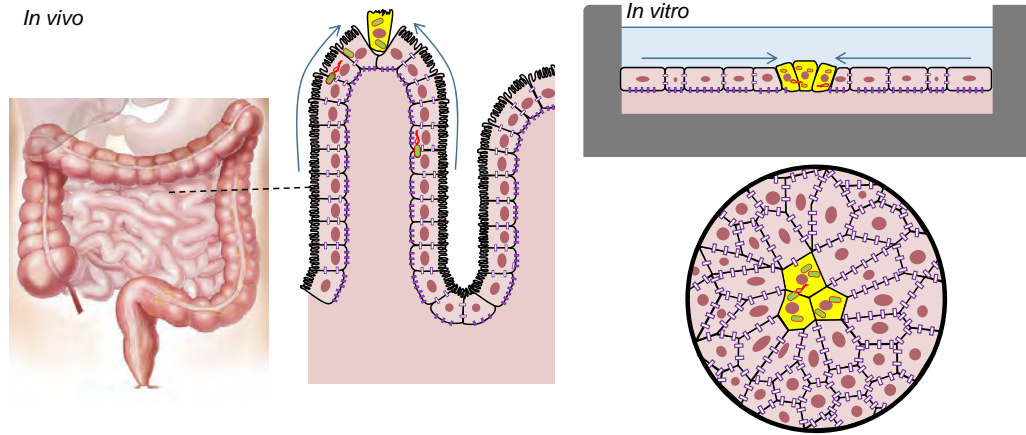
123 *L.m.* can cross the intestinal epithelial barrier in an attempt to spread
124 within the body . The intestinal epithelium consists of a single layer of cells
125 and acts as a protective barrier that separates the intestinal lumen from the
126 external environment (Figure 1.a left). To understand the mechanisms used
127 by intracellular *L.m.* to spread through neighbouring epithelial cells, and
128 to unravel the mechanical interactions between infected and neighbouring
129 non-infected cells, *in vitro* experiments are often performed [6]. The gold
130 standards of these experiments involve exposure of epithelial cells in mono-
131 layer to *L.m.* and examination over time of the spreading behavior of *L.m.*
132 along these monolayers. Accordingly, it was recently shown that at late
133 times post-infection with *L.m.*, a mechanical competition between infected
134 and neighbouring non-infected cells takes place. In infected monolayers, the
135 uninfected cells surrounding the infection site try to organise themselves to
136 expel the infected cells out of the monolayer, which in turn gives rise to the
137 formation of a mound of infected cells where infected cells pile on top of
138 each other (Figure 1.a right). The height of the mound appears to depend
139 on the intracellular replication of the bacteria and their spreading capacity
140 through the monolayer, as well as on the mechanical properties of the sub-
141 strate or ECM on which cells reside among other factors [28, 29]. Cell-cell

142 and cell-ECM adhesions play a crucial role in this process. In fact, when host
143 cells lack key proteins involved in proper formation of intercellular adhesions,
144 uninfected cells are unable to expel infected cells [6].

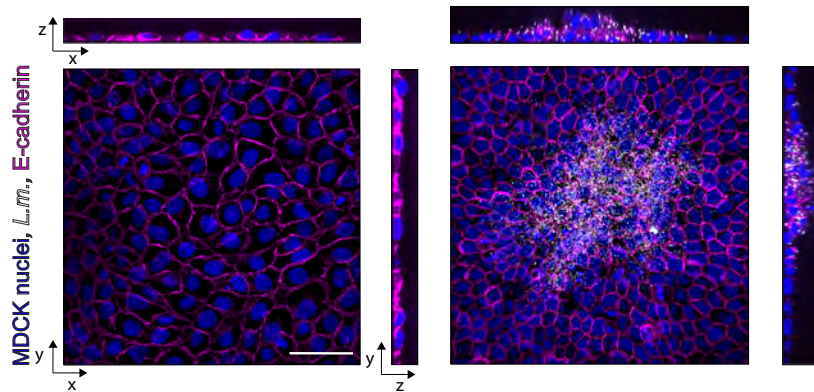
145 In epithelial monolayers, the mechanisms involving extrusion of single
146 apoptotic (dying), unfit or excess cells in the context of overpopulation, have
147 been relatively well studied [30]. Extrusion of cell(s) in the context of cancer,
148 infections and other pathologies have also been previously examined, mostly
149 from a biochemical perspective [31]. In fact, it is interesting to remark that
150 depending on the cell microenvironment, the way extrusion occurs may be
151 different. For example, single cell extrusion is observed *in vivo* in the intesti-
152 nal epithelium under conditions of *L.m.* infection [22, 32]. In this context
153 cells in the epithelial monolayer proliferate and migrate upwards, away from
154 the intestinal crypts, leading to the extrusion of single infected cells on the
155 tip of intestinal villi (Figure 1.a left). However, we previously observed that
156 *in vitro* in epithelial cell monolayers infected with *L.m.*, the extrusion occurs
157 later in infection through the formation of a mound of several infected cells,
158 thus features of massive collective cell extrusion are apparent in this case.
159 Despite of this collective behavior in monolayers infected with *L.m.*, other
160 types of host cells infected with intracellular bacteria also exhibit extrusion
161 in *in vitro* conditions. For example, single rather than collective extrusion
162 has been shown for epithelial cells infected with the intracellular bacterial
163 pathogen *Salmonella enterica* [33]. This disparity raises the question of what
164 controls infected cell extrusion, what determines whether extrusion will oc-
165 cur in single cell or collectives and whether the underlying mechanisms are
166 similar?

167 In the case of overpopulation or extrusion of apoptotic cells, the sur-
168 rounding cells typically create an actin-rich ring which contracts and even-
169 tually forces the extrusion of the cell they detect as a surplus [31, 34]. How-
170 ever, this ring has not been observed around foci of cells infected by *L.m.*
171 [6]. The precise mechanisms used by uninfected neighbouring cells to eject
172 *L.m.* -infected cells are not yet unambiguously delineated. Here, we extend
173 our previous mechanobiological computational model to simulate infection of
174 host cells in monolayer [6, 29] in order to understand the mechanisms that
175 lead to collective infected cell extrusion.

176 Several experimental observations have pointed to the important mechan-
177 ical alterations that occur in host cells during infection and lead to cell-cell
178 competition followed by infected cell extrusion. Atomic force microscopy
179 (AFM) measurements indicate that the stiffness of infected cells in mono-



(a)



(b)

Figure 1: (a) The intestinal epithelial cell monolayer acts as a protective barrier whose organization can change during intracellular bacterial infection. *In vivo* (left) and *in vitro* (right) representation of an epithelial cell monolayer during infection. The left sketch depicts the 3D topography of the epithelial cell monolayer in the small intestine during infection with *L.m.* The right sketch shows a simplistic representation of how *L.m.*-infected cells *in vitro* are squeezed due to the forceful action of their uninfected neighbours. Nuclei (red), infected cells (yellow), *L.m.* (green), cell-cell junctions (white) and cell-ECM adhesions (purple). (Intestine image from Pixabay by Elionas2). (b) Representative orthogonal views for MDCK epithelial cells from an uninfected well (left) and for *L.m.*-infected well around an infection focus at 24 hours post infection (right). Orthogonal views show host cell nuclei in blue, *L.m.* in white and E-cadherin to mark cell-cell junctions in magenta. Scale bar is 50 μm .

180 layer is reduced to approximately half the stiffness of the surrounding unin-
181 fected cells [6]. As a result of this reduction in cell stiffness accompanied by
182 alterations in the cells' cytoskeleton, infected cells exert lower traction forces
183 on the surrounding ECM. Concurrently, the neighbouring uninfected cells
184 adjacent to the infection domains stiffen and exert increased traction forces
185 on their ECM. These alterations lead to a competition between infected and
186 neighbouring uninfected cells due to a stress gradient generated along them
187 (Figure 1.b). We believe that one of the keys to understanding this dynamical
188 process is to determine the precise mechanical alterations that occur across
189 host cells during infection [12], the stresses to which host cells are subject
190 to and the interaction forces between cells and their ECM. This in turn can
191 shed light into the mechanobiological mechanisms that intracellular bacteria
192 employ to facilitate their spread, and conversely into the actions that host
193 cells can take to obstruct the dissemination of the infection.

194 **3. Mechanobiological model of a cell monolayer infected with *L.m.***

195 To reproduce the *in vitro* experiments, we formulate a model to mimic the
196 interaction of infected cell domains surrounded by uninfected cells when those
197 form a monolayer as described before [6]. The aim of our model is to simu-
198 late a particular stage of infection, arising between 8 to 16 h. post infection,
199 when *in vitro* a mechanical competition arises between bacterially-infected
200 versus surrounding uninfected cells. At this particular stage, uninfected sur-
201 rounding cells sense the mechanical gradient at the border of the infection
202 domain, and as a result polarise and collectively move towards the infection
203 focus squeezing and eventually forcing the extrusion of infected cells [6]. To
204 simulate this specific stage of infection, we take into account three important
205 experimental measurements we previously conducted during *in vitro* infec-
206 tion: (a) Uninfected surrounding cells exert large traction stresses on their
207 ECM since they grab the ECM and pull it away from the infection focus
208 as they migrate towards it. (b) Uninfected surrounding cells are polarized
209 and directionally migrate towards the infection focus. (c) There is a gradi-
210 ent in cellular traction stresses and monolayer stresses between infected and
211 surrounding uninfected cells [29]. To simulate the cell monolayer and the
212 mechanical interactions between infected and uninfected cells, we hypothe-
213 size a mechanotransduction mechanism based on these previous experimental
214 observations [6]:

215

- 216 1. First, each single cell contracts, which allows uninfected cells to sense
217 mechanical alterations in their microenvironment due to the presence
218 of infected cells nearby (phase 1 in Figure 2).
- 219 2. If cell-cell junctions are properly formed, the adhesions of the cell to
220 the ECM initially present a low stiffness, so that the cell displaces itself
221 relative to its ECM. If the relative displacements between the cell and
222 the ECM are large, the cell creates stiffer cell-ECM adhesions (phase 2
223 in Figure 2). This results in a collective cell behaviour, which is based
224 on previous works in which authors simulate monolayers migration in
225 response to a gradient of ECM stiffness [35, 36]. If new cell-ECM
226 adhesions are created the cell will contract again to sense the new
227 mechanical environment (phase 1).
- 228 3. If the cellular displacements relative to the ECM are small (with or
229 without stiff cell-ECM adhesions), then the given cell might or might
230 not experience a stress asymmetry depending on the mechanical state
231 of its neighbouring cells (phase 3 in Figure 2).
- 232 4. At this point, if the given cell experiences a stress asymmetry, it creates
233 a protrusion towards the side of minimal stress and thereby polarizes
234 in that given direction. In this work, we consider that the mechanical
235 states of the cell are guiding cell polarization as shown in previous works
236 [37, 38]. We hypothesize that the level of protrusion is proportional to
237 the level of stress asymmetry inside the cell (phase 4 in Figure 2).

238 In the *in vitro* experiment, there is probably a tightly regulated interplay
239 between the polarization of a given cell and its contractile behaviour, but
240 whether protrusion of the cell follows strong contraction, and such a cycle
241 repeats quasi-periodically is not yet known. However, there is evidence in
242 other cellular systems, for example, in single or streaming *Dictyostelium dis-*
243 *coideum* cells and in immune cells, that protrusion of the leading edge is
244 followed by contraction of the cell in a motility cycle that appears periodic
245 [39, 40]. Therefore, our model, although not explicitly tested for MDCK cells
246 in monolayer, is based on behaviours observed in other cellular systems.

247 Apart from our proposed mechanotransduction mechanism, for both in-
248 fected and uninfected cells, we model the mechanical cell behavior, distin-
249 guishing between the passive and active behaviour. On the one hand, the
250 passive part represents the capacity of the cell to be passively deformed and
251 can be mainly attributed to the cell cytoskeleton. On the other hand, the
252 active behaviour of the cell is defined by their capacity to generate forces

253 through the active action of the actomyosin contractile apparatus [41, 42].
 254 Within the mechanotransduction mechanism, the active response of the cell
 255 to sudden changes in stress is meant to generate a protrusion in the front
 256 part of the cell and an asymmetry in the cell configuration. In our previ-
 257 ous model, the protrusion [6] was implemented as on-off law. By using this
 258 model, if there is an asymmetry in stresses the cell always protrudes to the
 259 same degree, no matter how small or large the stress asymmetry is. Here
 260 we hypothesize that the cell protrudes proportionally to the stimulus that
 261 it is sensing. When the asymmetry of the cell is higher, the protrusion re-
 262 sponse of the cell is also higher as opposed to lower levels of stress asymmetry.
 263 Therefore, a linear protrusion law is proposed as a function of the difference
 264 in stresses (equation 1). We also assume that uninfected surrounding cells
 265 are polarized towards the infection domain, where the traction and mono-
 266 layer stresses are weakened. Through *in vitro* detailed analysis we previously
 267 showed that in *L.m.*-infected cell monolayers, neighbouring uninfected cells
 268 exhibit a strong radial alignment pointing towards the centre of the infection
 269 focus, where additionally the traction and monolayer stresses are weakened
 270 [6, 29]. Thus, in our model the protrusion occurs in the front part of the cell
 271 (the part of the cell in which maximal principal stresses are lower), and this
 272 protrusion is proportional to the stress asymmetry inside the cell:

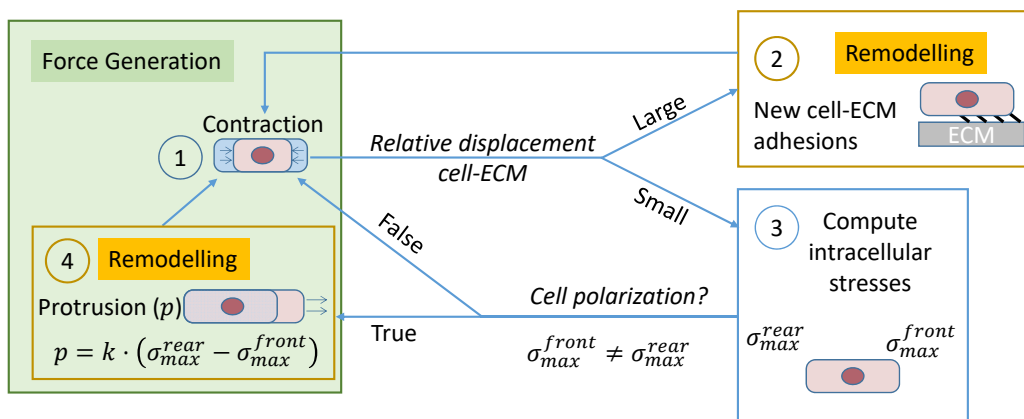


Figure 2: Cell mechanotransduction scheme. We propose two active phases (contraction (1) and protrusion (4)) and one passive phase, where the cell behaves depending on the mechanical stimulus that it is sensing. Cell protrudes (4) only under two conditions: when cellular displacements relative to the ECM are small (3) and if there is stress asymmetry in the cell.

$$p = k \cdot (\sigma_{max}^{rear} - \sigma_{max}^{front}) \quad (1)$$

273 where p is the level of protrusion, k is constant and σ_{max}^{front} and σ_{max}^{rear} are
 274 the averaged maximum principal stress of the front and rear part of the cell,
 275 respectively. The range of values of the parameter related to the level of
 276 protrusion (k) are chosen to obtain a sufficient level of cell protrusion so that
 277 squeezing of infected cells would emulate the corresponding experimental
 278 stage of infection just prior to infection mound formation.

279 To simulate either the contraction or the protrusion of the cell, we assume
 280 both of them produce volumetric changes of the cell in the plane of the mono-
 281 layer. We consider three configurations, the undeformed (Ω_0), the deformed
 282 (Ω_t) and one intermediate (Ω_i), and these configurations can result either
 283 due to contraction or to protrusion (which in general are non-compatible)
 284 [43, 44]. The total deformation gradient which maps the point of the unde-
 285 formed configuration (\mathbf{X}) to the points in the deformed (\mathbf{x}) is:

$$\mathbf{F} = \frac{\partial \mathbf{x}}{\partial \mathbf{X}} \quad (2)$$

286 We make use of the multiplicative decomposition [45] of the total defor-
 287 mation gradient \mathbf{F} :

$$\mathbf{F} = \mathbf{F}_e \cdot \mathbf{F}_i \quad (3)$$

288 where \mathbf{F}_e represents the pure elastic deformation, whereas \mathbf{F}_i is the growth
 289 deformation gradient produced by the volume change due to the contraction
 290 or protrusion of the cell:

$$\mathbf{F}_i = \begin{cases} \begin{pmatrix} (1 + \frac{p}{2}) & 0 & 0 \\ 0 & (1 + \frac{p}{2}) & 0 \\ 0 & 0 & 1 \end{pmatrix}, & \text{protrusion} \\ (1 - c)\mathbf{1}, & \text{contraction} \end{cases} \quad (4)$$

292 where c is a constant related to the volumetric contraction of the cell which
 293 is assumed equal in all cells, $\mathbf{1}$ is the second order unit tensor.

295 The Cauchy-Green Tensor \mathbf{b} [46] is related to the total deformation gra-
 296 dient by:

$$\mathbf{b} = \mathbf{F} \cdot \mathbf{F}^T \quad (5)$$

297

298 A decoupled representation of the strain energy function is adopted here
 299 since we consider both active and passive cell contributions, we assume the
 300 deformation of both are equal:

$$W(\mathbf{b}) = W_{passive}(\mathbf{b}) + W_{active}(\mathbf{b}) \quad (6)$$

301 where $W(\mathbf{b})$ is the strain energy function, $W_{passive}(\mathbf{b})$ and $W_{active}(\mathbf{b})$ are the
 302 corresponding passive and active strain energy functions, respectively. There-
 303 fore, the stress tensor associated to each passive and active part is defined
 304 as:
 305 as:

$$\sigma_{passive} = 2J^{-1}\mathbf{b} \frac{\partial W_{passive}(\mathbf{b})}{\partial \mathbf{b}} \quad (7)$$

306

307

$$\sigma_{active} = 2J^{-1}\mathbf{b} \frac{\partial W_{active}(\mathbf{b})}{\partial \mathbf{b}} \quad (8)$$

308

309 where J is the Jacobian determinant.

310 4. Mechanical model implementation

311 We simulate a cell monolayer in which cells in the center are infected with
 312 *L.m.* to reproduce a particular stage of infection (Figure 3.a). For the sake
 313 of simplicity, we assume the deformations and strains in the cell monolayer
 314 and its substrate are small. In fact, we focus on the short-term reaction of
 315 uninfected cells to infection, rather than on the long-term reaction or the
 316 complete extrusion of infected cells out of the monolayer. Thus, the model
 317 is implemented under the infinitesimal strain theory.

318 4.1. Cell model

319 To simulate the cell domain, we assume both parts of the cell (the active
 320 and passive one) work in parallel, assuming a linear elastic material where
 321 the total stress Cauchy tensor of the cell, under the small strain assumption,
 322 is the sum of the passive and the active contributions:

$$\boldsymbol{\sigma}_{cell} = \boldsymbol{\sigma}_{passive} + \boldsymbol{\sigma}_{active} \quad (9)$$

323 we assume same deformations for both passive and active parts:

$$\boldsymbol{\varepsilon}_{cell} = \boldsymbol{\varepsilon}_{passive} = \boldsymbol{\varepsilon}_{active} \quad (10)$$

324 where $\boldsymbol{\sigma}_{cell}$ is the total Cauchy stress tensor of the cell, $\boldsymbol{\sigma}_{passive}$ and $\boldsymbol{\sigma}_{active}$
 325 are the Cauchy stress tensors of the passive and active part of the cell re-
 326 spectively; $\boldsymbol{\varepsilon}_{cell}$, $\boldsymbol{\varepsilon}_{passive}$ and $\boldsymbol{\varepsilon}_{active}$ are the Cauchy strain tensors of the cell,
 327 its passive and active part respectively.

328 According to the experimental AFM measurements we previously con-
 329 ducted [6], we consider that infected cells get softer than surrounding unin-
 330 fected cells. We set the total elastic modulus (E_{cell}) to $1000Pa$ for uninfected
 331 cells and $250Pa$ for infected cells. As a first approach, we assume that both,
 332 passive ($E_{passive}$) and active (E_{active}) elastic moduli, are $500Pa$ for uninfected
 333 cells and $125Pa$ for infected cells, values that are consistently close to experi-
 334 mental observations [6]. A sensitivity analysis of the effect of differential cell
 335 stiffness between infected versus surrounding uninfected cells on promoting
 336 infection mounding can be found elsewhere [29].

337 The Poisson's ratio for the passive part is set to 0.48, thus we assume it is
 338 nearly incompressible [42]. The active part mainly represents the actomyosin-
 339 generated cell contraction and actin polymerization; we consider that con-
 340 traction is not isotropic but it mainly occurs in the plane of the monolayer
 341 [47]. Thereby, the Poisson's ratio is assumed 0 to uncouple the vertical di-
 342 rection of the active part of the cell and the monolayer plane effects. Hence,
 343 we assume the cytoskeleton is organized to induce the maximum contraction
 344 in the plane of the monolayer.

345 To simulate contraction, protrusion and cell adhesion in a simple way, we
 346 divide the cell body in three differentiated zones: contractile, adhesive and
 347 protrusive zones respectively (Figure 3.b). The contraction of the cell is sim-
 348 ulated in the cell center, where we assume that the acto-myosin apparatus is
 349 located. At the side edges of the cell we assume F-actin polymerization takes
 350 place thus regulating cell protrusion. Between the contractile and protru-
 351 sive zones, we set the adhesive zone, where the cell can adhere to the ECM.
 352 Finally, we add cell-cell junctions assuming that all cellular side areas are
 353 connected to neighboring cells. This domain separation or the division of the
 354 cell body is assumed in order to consider in one geometrical continuum cell
 355 model the two main processes that generate forces: contraction and protru-
 356 sion. The simulations were run with a value of the parameter k (equation 1,
 357 protrusion law) equal to $3.5 \cdot 10^{-5} \text{ mPa}^{-1}$. Higher values of the parameter k
 358 lead to larger protrusions p and convergence issues in the cell-ECM contact

359 surfaces since some cells might penetrate the ECM. Additionally, to deter-
 360 mine cell polarization, each cell is divided into six triangular prisms in order
 361 to define the front and the rear part of a given cell. Afterwards, the average
 362 maximum principal stress is computed in each of these prisms. The prism
 363 subjected to the highest maximum averaged principal stress is defined as the
 364 rear part of the cell, whereas the prism opposite to this one is the front part
 365 of the cell.

366 4.2. Cell-cell and cell-ECM adhesions

367 Regarding the cell mechanical interactions, we consider both cell-cell and
 368 cell-ECM adhesions. On the one hand, cell-cell junctions are modelled by
 369 introducing in the geometry of the model a continuum element between both
 370 neighbouring cells (Figure 3.b). This element is a thin sheet modelled with
 371 a linear elastic constitutive behaviour. Following the experimental work of
 372 Bastounis et al.[6], we simulate the inhibition of cell-cell junctions by de-
 373 creasing the Young’s modulus of the cell-cell junctions to values close to zero
 374 (Table 1). By doing so, the force transmission between neighbouring cells is
 375 disrupted. Thus, when cell-cell junctions cannot get established because im-
 376 portant relevant proteins are knocked out, cells do not interact anymore. On
 377 the other hand, cell-ECM adhesions are simulated as cohesive contacts. The
 378 cohesive contact used in the model follows the uncoupled traction-separation
 379 law, where the contact exhibits a linear behavior that is defined by the stiff-
 380 ness in three directions: normal direction to the contact surface and the two
 381 in-plane shear directions. Therefore, the elastic behavior can be written as
 382 follows:

$$\mathbf{t} = \begin{Bmatrix} t_n \\ t_s \\ t_t \end{Bmatrix} = \begin{bmatrix} K_{nn} & 0 & 0 \\ 0 & K_{ss} & 0 \\ 0 & 0 & K_{tt} \end{bmatrix} \begin{Bmatrix} \delta_n \\ \delta_s \\ \delta_t \end{Bmatrix} = \mathbf{K}\boldsymbol{\delta} \quad (11)$$

383 where \mathbf{t} is the the stress vector, \mathbf{K} is the stiffness matrix and $\boldsymbol{\delta}$ the separation
 384 of the cohesive contact. Subscripts n , s and t denote the normal and shear
 385 directions to the surface. It should be noted that the cohesive behavior is
 386 not introduced as elements, but as a cohesive contact. Therefore, the units
 387 of stiffness are [*Force/volume*].

388 This type of contact allows the bonding of two different meshes and the
 389 control of stiffness in the normal and shear direction of this cell-ECM ad-
 390hesion. In this case, we also consider two possible behaviors depending on
 391 whether cell-cell junctions are properly formed or not. If cell-cell junctions

392 are formed in our simulation (and thus cells behave as a collective), the
 393 cell-ECM adhesion forces are weaker compared to the case where cell-cell
 394 junctions cannot form. In this latter case, cells behave more as individual
 395 entities. When we assume weaker cell-ECM adhesion, the stiffness in the
 396 normal direction is $10nN/\mu m^3$ and negligible in the shear direction. On the
 397 contrary, when we consider more rigid cell-ECM traction forces, the stiffness
 398 in the normal and shear direction is $1000nN/\mu m^3$. Each cell has a total con-
 399 tact area of $31.61\mu m^2$ (six zones of $5.268\mu m^2$). Therefore, the total active
 400 adhesion forces (traction forces) of each cell to the ECM are $31.61nN/\mu m$
 401 and $31608nN/\mu m$ for the lower and higher rigid adhesion, respectively. This
 402 behavior has been observed experimentally in previous works measuring the
 403 traction forces of cells exerted on their ECM when migrating on an ECM
 404 that exhibits a gradient of stiffness [36]. In this study, cells are thought to
 405 work collectively which allows them to detect different ECM stiffness and
 406 move towards the stiffer ECM side (durotaxis). This assumption has been
 407 successfully implemented in a previous computational work [35]. Finally, all
 408 the adhesion properties are summarized in Table 1. The cell-ECM adhesion
 409 parameter is estimated through a sensitivity analysis and is calibrated to
 410 obtain the sufficient level of adhesion between the ECM and the cell, but we
 411 find that up to a certain value, the alterations in cell displacements in the
 412 model are minimal.

		Base case scenario	Cell-cell contact inhibition	New cell-ECM adhesion
Cell-cell Junction	Elastic Modulus (Pa)	1000	0	1000
	Shear Modulus (Pa)	500	0	500
Cell-ECM Adhesion	Normal direction ($nN/\mu m^3$)	10	1000	1000
	Shear direction ($nN/\mu m^3$)	0	1000	1000

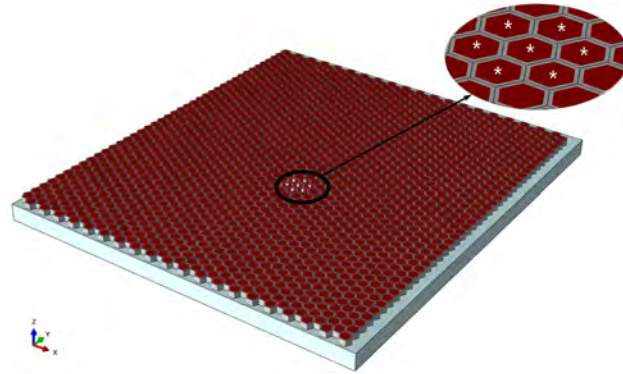
Table 1: Summary of cell-cell junction and cell-ECM adhesion properties. We consider the cell-cell contact inhibition when cells are not able to form cell-cell junctions and cells exhibit an increase in their cell-ECM adhesion strength. Additionally, we also consider the creation of new cell-ECM adhesions near the infection focus following the mechanotransduction mechanism. The new cell-ECM adhesion only increases the stiffness of the adhesion in neighbouring uninfected cells.

413 *4.3. Finite element model*

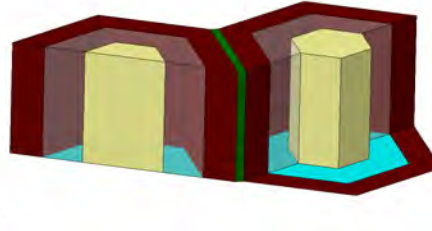
414 We simulate a cell monolayer formed by 1 600 cells on a flat planar ECM
415 (Figure 3.a). We assume that cells are arranged in the monolayer as regular
416 hexagons with side length and thickness of $7\mu\text{m}$ [48]. To simulate the in-
417 fection, we initially consider an infection focus comprised by seven infected
418 cells in the center of the monolayer. Thus, the boundary effects in the region
419 of interest are neglected, since the domain is large enough to assume Saint-
420 Venant’s principle in the region of interest (infected cells and uninfected cells
421 close to the site of infection). In addition, we apply a non-displacement
422 boundary condition on the exterior side of the cells that are at the border of
423 the monolayer, thus we assume that the displacements far from the infection
424 are negligible. The ECM is also large enough to avoid border effects, we
425 assume it as a linear elastic material (elastic modulus 3kPa and Poisson’s
426 ratio 0.3). In terms of time scale, we only analyze a short period of time
427 in which only one mechanotransduction cycle is simulated. This cycle could
428 be repeated several times and the displacements would be more prominent.
429 Nevertheless, from the mechanical point of view, one cycle is sufficient to
430 analyze the behavior of cells at this particular stage of infection when com-
431 petition occurs.

432 The model is implemented in the commercial finite element software (FE-
433 based) ABAQUS [49] (Figure 3.a). To simulate the passive and active be-
434 havior of the cell, we create two overlapping meshes sharing the nodes of
435 the cells. This mesh is discretized with linear wedge elements of average
436 size $2\mu\text{m}$ and 270 elements for each part of the cell, active and passive (540
437 total elements for each cell). The cell-cell junctions are modeled with nine
438 linear hexahedral elements per contact face and the ECM is modeled with
439 117 600 linear hexahedral elements. The total number of elements in the
440 model is 1 024 800 and 606 232 nodes. We performed a refinement analysis of
441 the mesh size, and we conclude that the current mesh is suitable due to the
442 computational cost and the results we retrieve, since the stress distribution
443 and magnitude are closely similar to other finer meshes. We should keep in
444 mind that our aim is to analyse the qualitative differences during infection
445 in the various mechanical scenarios in order to find the causal relationships
446 that modulate the outcome of the competition between bacterially-infected
447 or uninfected cells.

448 Overall, we initialize our computational model taking into account the
449 previous considerations to simulate the behavior of a cell monolayer com-
450 prised of an infection focus of seven infected cells and adhering on an ECM.



(a)



(b)

Figure 3: (a) Computational model of the cell monolayer composed by 1 600 cells and their ECM. Cells are in red oxide and gray (gray color for the protrusion zone of each cell to make easier cells' visualization) and the ECM in light blue. The zoomed region corresponds to infected cells (marked with an asterisk). (b) Scheme of the cell parts considered: contractile (yellow), protrusive (red oxide), adhesive (light blue) and cell-cell junction (green).

451 The computational domain is defined by the geometry of the model (the cell
 452 and ECM), whose mechanical properties are considered based on our experi-
 453 mental observations [6], assuming a linear elastic material behavior. The dif-
 454 ferent domains are connected through specific mechanical interactions (cell-
 455 cell and cell-ECM adhesions) and implemented in two differentiated meshes
 456 for the cell domain (active or passive behaviors). Altogether, this approach
 457 allows us to run a FEM analysis and examine the displacements and princi-
 458 pal stresses in both the ECM and the cell domain during a particular stage
 459 of infection. The computational scheme is summarized in Figure 4.

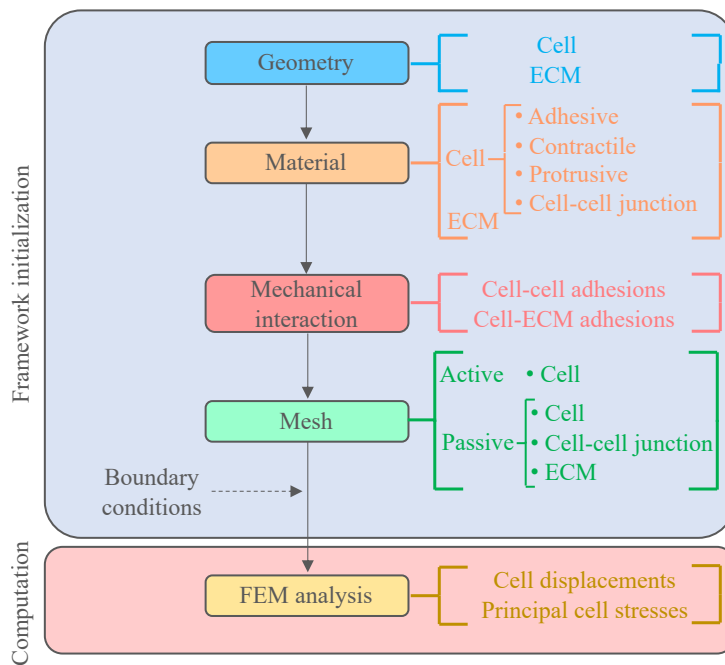


Figure 4: Computational scheme of the mechanical model

460 *4.4. In silico simulations*

461 Given the complexity and dynamics of bacterial infection, we aim to test
 462 quantitatively and independently at this stage: (1) whether the existence of
 463 strong cell-ECM adhesions at the border of the infection domain influences
 464 the squeezing of infected cells, since cell monolayer stresses are concentrated
 465 at the interface between infected and surrounding uninfected cells [29], (2)
 466 whether inhibition of cell-cell junctions that are distant from or near to the
 467 site of infection disrupts the intercellular force transmission, therefore at-
 468 tenuating the collective squeezing and subsequent extrusion of infected cells,
 469 (3) the influence of our proposed stress asymmetry-dependent protrusion law
 470 in the squeezing of infected cells and subsequent formation of the infection
 471 mound and how the *in silico* model compares to our previous model that was
 472 based on an on-off protrusion law.

473 We analyse four scenarios with the new proposed protrusion law. Addi-
 474 tionally, we compare these scenarios with our previous results [6] where the
 475 new protrusion law was not considered, since protrusion was determined by
 476 an on-off law. In the first two scenarios our attention is focused on whether

477 cell-ECM adhesions are relevant to cell remodelling during bacterial infec-
478 tion, whereas in the third and fourth scenarios we analyse the role of cell-cell
479 junctions in the collective cell behavior during infection. The size of the in-
480 fection is fixed to seven cells in the center of the monolayer in all the cases,
481 and those are the cells that present different mechanical properties (less stiff
482 than uninfected cells). The different scenarios are enumerated as follows:

- 483 • *Case 1*: no new cell-ECM adhesions are produced around the site of
484 the infection. Thereby, the cellular remodelling due to creation of new
485 cell-ECM adhesions is not activated in the model when uninfected cells
486 sense relative large cell-ECM displacements (Figure 2). The adhesion
487 properties correspond to the base case scenario in Table 1.
- 488 • *Case 2*: the general cell-ECM adhesion properties correspond to the
489 base case scenario (Table 1). However, when uninfected cells close to
490 the infection site detect large displacements relative to their ECM, they
491 create new strong cell-ECM adhesions. The new cell-ECM adhesion
492 properties of neighbouring uninfected cells close to infection are shown
493 in Table 1.
- 494 • *Case 3*: cell-ECM adhesions and consequently, the cell remodelling
495 close to the infection site are considered to be the same as case 2.
496 However, cell-cell junctions formed by cells far from the infection site
497 are inhibited (*i.e.*, distal cell α in Figure 5.a). The new cell-cell contact
498 inhibition properties are illustrated in Table 1.
- 499 • *Case 4*: cell-ECM adhesion properties are selected based on case 2.
500 However, cell-cell junctions close to the infection site (*i.e.*, proximal
501 cell β in Figure 5.a) are inhibited as opposed to the situation in case 3.

502 5. Results

503 5.1. Epithelial cells exhibit different mechanical states when infected which 504 depend on their location

505 First, we address the question of whether all the cells of the monolayer
506 that reside on a planar elastic ECM are able to sense the mechanical differ-
507 ences produced by the infection with *L.m.* To do so, we analyze the scenarios
508 introduced before.

509 The mechanotransduction cycle we present consists of different phases.
510 During the contraction phase, we observe stress asymmetry in all four scenarios
511 (Figure 5.b, left). By stress asymmetry, we imply that cells are sensing a
512 gradient of stresses. However, the degree of asymmetry is different depending
513 on the specific scenario. We can distinguish two types of stress asymmetry:
514 (1) a local cell stress asymmetry, considering the cell itself as an entity, or
515 (2) a global monolayer stress asymmetry, where cluster of cells exhibit different
516 levels of stress. The global asymmetry in stresses is more pronounced in
517 the scenarios where new strong cell-ECM adhesions are formed around the
518 infection focus, in response to large cell-ECM displacements (cases 2, 3 and
519 4 in Figure 5.b, left). For example, in those cases, the stress distribution of
520 distal cells (α cells) contrasts significantly with respect to proximal cells (β
521 cells).

522 Given the fact that new cell-ECM adhesions are formed, cases 2, 3 and
523 4 also exhibit different global stress distributions. In case 2, all the cell-
524 cell junctions are simulated whereas in case 3 and 4 we inhibit the cell-cell
525 junctions distal and proximal to the infection focus, respectively. The result
526 is that in case 2 the stress distribution between distal (α) and proximal (β)
527 cells is more similar than in cases 3 and 4. The inhibition of cell-cell junctions
528 leads to a low level of stresses, meaning that cells are not able to transmit
529 forces between each other. The cell that senses low level of stresses is the
530 distal (α) cell in case 3 and the proximal (β) cell in case 4, corresponding to
531 the cells that present inhibited junctions.

532 Altogether these findings suggest that the cell-ECM and cell-cell adhe-
533 sions close to the infection focus crosstalk and guide the response of cells
534 in the monolayer in response to infection, experiencing a major gradient of
535 stresses.

536 5.2. *The level of cell stress asymmetry depends on cell adhesions*

537 We have shown that cells close to the infection focus play a critical role
538 in guiding the infection process and ultimate outcome [6]. Therefore, we
539 wondered how can uninfected cells surrounding the infection site sense their
540 mechanical microenvironment and how does this mechanical input affect the
541 stress asymmetry of the cell?

542 Given the protrusion law we propose, here we examine the role of the
543 level of cell protrusion (p) in modulating the behavior of the infected cell
544 monolayer. Particularly, we are interested in the local cell stress asymme-
545 try that proximal (β) cells present, since those are the cells that surround

546 the infection focus. Once a cell contracts, following our proposed mechan-
547 otransduction cycle, the protrusion only occurs when the maximum principal
548 stresses between the front and rear part are distinct. In this context, we ob-
549 serve that the modulation of the adhesions influences the level of protrusion.

550 The local stress asymmetry in proximal (β) cells is low for cases 1 and
551 4, where new cell-ECM adhesions or cell-cell junctions at the site of the in-
552 fection are inhibited, respectively. For that reason, the displacements during
553 the protrusion phase are low (Figure 5.b, right), as well as their stress asym-
554 metry or protrusion level (Figure 6.a). For example, in case 1 the degree
555 of asymmetry is low (lower than 0.01%) and so is the protrusion. However,
556 when new cell-ECM adhesions are formed at the border of the infection and
557 cell-cell junctions are not inhibited in that region (case 2 and 3), proximal
558 β cells exhibit larger local cell stress asymmetry leading to larger displace-
559 ments towards the infection, producing a longer protrusion (Figure 5.b). In
560 case 2 all the cell-cell junctions are bearing loads whereas in case 3 only the
561 ones close to the infection site. This fact results in a different local stress
562 asymmetry between both cases, being 2 the case that produces a higher level
563 of protrusion (Figure 6.a).

564 Additionally, in order to compare the behaviour of the computational
565 model between the new condition (protrusion law, equation 1) and the pre-
566 vious work (on-off constant protrusion [6]), we compare the displacements
567 of infected cells during the protrusion phase. The evaluated variable is the
568 mean vertical displacement of infected cells. As explained before, the level
569 of protrusion is proportional to the level of asymmetry. We set that the
570 larger protrusion that cells can experience is the protrusion that case 2 ex-
571 hibits. This case shows larger stress asymmetry and larger displacements in
572 the original model, so we normalize the level of protrusion with respect to
573 this case. Thus, the mean vertical displacements in case 2 are the same with
574 constant protrusion or the linear protrusion law (Figure 6.b), whereas in the
575 other three cases the result might differ. For example, in case 1 infected cells
576 move due to a slight protrusion with the on-off model, whereas through the
577 new protrusion law, the displacements are negligible. In the same way, the
578 protrusion obtained in case 3 (55 % level of protrusion) is less pronounced as
579 compared to the original model. Finally, the level of protrusion in case 4 (18
580 %) is not enough to present differences between both models (Figure 6.b).

581 When simulating case 2 and 3 with the on-off protrusion law, the model
582 is able to yield infected cell squeezing in both cases. The model predicts the
583 same amount of squeezing (0.8 μm , Figure 6.b) when there is no inhibition

584 of cell-cell junctions (case 2) or when cell-cell junctions of distal uninfected
585 cells are inhibited (case 3). In previous experimental work [6], we observed
586 that when two populations of cells are mixed (wild-type cells and α E-catenin
587 knockout cells which cannot form proper cell-cell junctions), the cells that are
588 able to form cell-cell junctions move towards the infection focus contributing
589 to infected cell squeezing. However, the volume of the resulting infection
590 mound is lower than that of a mound of wild-type cells. The previous on-off
591 model predicts the same amount of infected cell squeezing in both cases (2
592 and 3), whereas the new linear protrusion law is able to predict less infected
593 cell squeezing in case 3, improving the performance of the model and being
594 more consistent with our experimental observations [6]. This difference is
595 due to the different degree of asymmetry in mechanical stress inside the
596 cell, being 20% and 10% in case 2 and 3, respectively. This result suggests
597 that when all neighbouring cells are able to transduce intercellular forces
598 and act collectively, infected cell squeezing is enhanced, whereas when some
599 neighbouring cells cannot transduce intercellular forces, the collective cellular
600 response that leads to infected cell squeezing is attenuated.

601 The findings shown here make more remarkable some of the results ob-
602 served in previous works [6]. First, the relevance of the formation of new
603 adhesions to the ECM in the cells close to the infection (case 1 vs case 2) in
604 order to create a gradient of stresses. Second, the monolayer exhibits a lower
605 gradient of stresses when only few uninfected cells are able to create cell-cell
606 adhesions (case 2 vs case 3). Third, the lower ability of uninfected cells to
607 protrude against infected cells when cell-cell junctions close to the infection
608 are inhibited (case 3 vs case 4).

609 *5.3. The collective cell response reproduces mound formation in a particular* 610 *stage of infection*

611 All the previous results point to the importance of cell-cell and cell-ECM
612 adhesions in guiding (or not) the protrusive behavior of uninfected cells to-
613 wards infected ones in monolayers. To test how these protrusions affect the
614 behavior and kinematics of the cell monolayer, we examined the displace-
615 ments after one cycle of contraction-protrusion.

616 We found that the larger displacements are exhibited in cases 2 and 3,
617 where the level of protrusion is high enough to produce the squeezing of
618 infected cells. The degree of asymmetry, and consequently, the degree of
619 protrusion in cases 1 and 4, is remarkably low, thereby no large displace-
620 ments are shown by infected cells (Figure 7). On the contrary, case 2 and

621 case 3 exhibit large displacements due to the efficient force generation from
622 uninfected surrounding cells. As we mentioned before, case 2 exhibits even
623 larger displacements than case 3 due to the fact that all cell-cell junctions
624 are active in the whole cell monolayer.

625 We can conclude that when the force generation machinery works cor-
626 rectly, the cell monolayer presents a collective behavior whereby uninfected
627 cells surrounding the infection are polarized towards the center of the infec-
628 tion, squeezing infected cells and allowing the formation of the mound.

629 6. Discussion and conclusions

630 In this work, we have expanded and mathematically formulated our pre-
631 vious computational model that simulates the mechanical interactions of
632 bacterially-infected and surrounding uninfected cells in a monolayer [6]. The
633 model reproduces the mechanical gradient in the cell monolayer at a partic-
634 ular stage of infection when some cells are infected, but collective extrusion
635 of infected cells is not yet observed (8-16 h. post-infection). Additionally,
636 we have also inferred how cellular mechanical variables such as cell-cell junc-
637 tional forces, cell-ECM adhesion forces or the cell protrusion law regulate
638 the outcome of infected cell squeezing and cell protrusion. According to our
639 initial objectives, we have delineated: (1) the importance of cell-ECM ad-
640 hesions in ruling the mechanical competition of cells in infected monolayers;
641 (2) the relevance of cell-cell junctions in force transduction between cells and
642 its influence on the formation of infection mounds; (3) the new quantitative
643 protrusion law, which improves the performance of the model since the level
644 of protrusion is proportional to the stress gradient that the given cell senses
645 and not to on-off values fixed by the user.

646 Despite the new findings, our model still presents some limitations that
647 are discussed below and can be the focus of future work. First, we are only
648 simulating one single mechanotransduction cycle of contraction and protru-
649 sion in the cell, whereas in *in vitro* experiments, cells are constantly mov-
650 ing and deforming. In spite of this limitation, the protrusion of uninfected
651 surrounding cells is sufficient in enabling us to observe *in silico* the initial
652 squeezing of infected cells that drives the formation of the infection mound.
653 In addition, the linear protrusion law (which is a simplification of the complex
654 mechanical interactions of cells in the monolayer) improves the performance
655 of the model as compared to the previous on-off law. The degree of infected
656 cell squeezing in the new proposed model is more consistent with our previous

657 experimental observations in terms of cell-ECM adhesions, cellular traction
658 stresses and presence or absence of cell-cell junctions [6]. With the implemen-
659 tation of the new model, the level of protrusion, and consequently, the degree
660 of infected cell squeezing depends on the cell’s mechanical stress asymmetry,
661 and not on the biased user-dependent choice of the level of protrusion. Sec-
662 ond, we consider a fixed number of infected cells for each simulation. This is
663 a simplification since the number of infected cells changes over time due to
664 *L.m.* replicating and disseminating intercellularly over the course of the in-
665 fection. Thus in our current model we do not consider bacterial intercellular
666 dissemination or replication. Future directions should be focused on incor-
667 porating into the model the ability of the bacteria to spread and replicate
668 within the host cells and on understanding the mechanical alterations this
669 produces. Third, new cell-cell junctions cannot be formed since the geometry
670 of the junction is fixed, *i.e.*, since we do not model dynamic cell-cell interac-
671 tions. This is a current limitation of our model, since we can only interfere
672 directly in the mechanical parameters (material properties) assigned to the
673 cell-cell junction. Future works could implement the formation of new cell-
674 cell junctions by modelling cell-cell forces as external cues or by combining
675 continuum models with agent-based models [50].

676 Various studies on cancer cells [51] as well as bacterially-exposed host cells
677 [52, 53], have shown that alterations in human cell gene transcription can lead
678 to production of matrix degrading enzymes, which can alter the composition
679 and mechanical properties of the underlying ECM. That can lead to changes
680 in the organization of the cytoskeleton and in the mechanical properties of
681 the cells [51]. The polyacrylamide hydrogels that we manufacture are inert
682 materials and thus cannot be degraded, therefore their stiffness cannot be
683 altered. However, to enable cell attachment, polyacrylamide hydrogels are
684 coated at their surface with collagen I. Therefore, host cells in principle could
685 either degrade or deposit proteins onto it. This in turn could modulate ad-
686 hesion of cells onto their matrix and in turn lead to alterations in the host
687 cell cytoskeleton. However, at present we do not have data supporting this
688 and RNA sequencing analysis of infected cells did not reveal upregulation
689 of matrix metalloproteinases (typical matrix degrading enzymes) [6]. Future
690 studies could determine whether infected cells have the ability to alter the
691 composition of their ECM which in turn could modulate the organization of
692 the cell cytoskeleton and biomechanics. If that turns out to be true, in the
693 future we could account for changes in ECM mechanical properties in our
694 model. Irrespective of the above, alterations in the cytoskeletal organization

695 of infected and surrounding uninfected cells as compared to cells never ex-
696 posed to infection have been previously characterized and quantified in *in*
697 *vitro* experiments [6]. The same applies to changes in the traction forces
698 and monolayer stresses of both cell populations as compared to cells never
699 exposed to infection [29].

700 As a future step, it is essential to incorporate the dynamic response of
701 the cells into the model, as there are important changes in the configuration
702 and the mechanical properties of the cell monolayer that are not accounted
703 for in the current model. For example, *in vitro* experiments clearly demon-
704 strate that the collective movement of infected cells is very different from
705 that of cells never exposed to bacteria [29]. The monolayer of cells not ex-
706 posed to infection is solid-like, since cells move very slowly, randomly and
707 subdiffusively under confluence when they are caged by their neighbours.
708 However upon infection, a transition takes place and cells start moving much
709 faster and with a certain directionality (towards the center of the infection
710 focus). The cells are in a superdiffusive state during infection and the whole
711 monolayer behaves more like a fluid. This phase transition is a result of al-
712 terations in the interaction forces between cells [6]. This solid-to-fluid phase
713 transition has also been observed in bronchial epithelial cell monolayers when
714 exposed to compressive forces such as those that occur during bronchospasm
715 in asthmatic patients [54]. Such phase transitions are thought to be related
716 to changes in cell-cell and cell-ECM adhesions which can result in response
717 to extracellular physical cues but also in response to infection [6]. A previ-
718 ous study simulated this phase transition [55] in endothelial monolayers that
719 migrate during wound closure, by a combination of continuous and discrete
720 models (agent-based models and finite element methods). However, phase
721 transitions that can occur in the context of infection have not yet been stud-
722 ied through numerical modelling. This can be the focus of future *in silico*
723 studies.

724 Understanding also how bacterial infections modify the mechanical prop-
725 erties of cells is important to unravel how bacteria manage to disseminate,
726 and how physical cues crosstalk with biochemical signals. The alteration
727 of host cell mechanics by intracellular bacteria has recently been the focus
728 of investigations thanks to new technological developments (*e.g.* traction
729 force microscopy, atomic force microscopy, FRET sensors) [8]. Yet how the
730 cellular monolayers as a whole, that is, the reaction of both infected and
731 surrounding uninfected cells, change is still not fully uncovered. New tools
732 and approaches to address the problem at the multicellular scale will help

733 answer these questions.

734 Different types of bacteria can alter in different ways the physical forces
735 produced by their host cells to promote their own dissemination through tis-
736 sues. In turn, the biochemical and physical environment surrounding host
737 cells and bacteria can also distinctly impact those interactions [8]. In this
738 work, we have developed our computational model to simulate intracellular
739 infection with *L.m.* as a common intracellular bacterial pathogen model.
740 Most of the input parameters of our model are based on measurements con-
741 ducted during *in vitro* infection of host cells with *L.m.* However, our *in silico*
742 model could be modified to study infection processes triggered by other in-
743 tracellular bacterial pathogens. Based on previous experimental observations
744 of *L.m.*-infected monolayers [6], in our simulations neighbouring uninfected
745 cells protrude towards the infection focus centre. However, in different types
746 of cellular competition there might be different types of cell motion observed.
747 For example, in the context of cell overpopulation or during oncogenic trans-
748 formation of cells, it is possible that the two competing cell groups might
749 move in different ways compared to the ones considered herein [56]. In that
750 case our model could be modified following a different protrusion law.

751 In the context of bacterial infection, mound formation has been observed
752 *in vitro* in cell monolayers that were infected with *L.m.* and a mutant of
753 *Rickettsia parkeri* (*R.p.*) [6]. The pathogenicity mechanisms of intracellular
754 bacteria are sophisticated and diverse, and even bacteria that employ actin-
755 based motility to spread from one host cell to another (like *Rickettsia parkeri*,
756 or *Shigella flexneri*) do so employing distinct strategies some of which are still
757 to be discovered [8]. We recently showed that the changes in host cell force
758 transduction that *L.m.*-infected host cells undergo are modulated by innate
759 immune signaling, and particularly NF- κ B activation, and thus intracellu-
760 lar bacteria that suppress host cell NF- κ B activation like *Rickettsia parkeri*
761 do not elicit formation of infection mounds at late times post-infection [6].
762 However, following infection with a mutant of *R. parkeri* that lacks the outer
763 surface protein B (OspB) and therefore cannot suppress NF- κ B activation,
764 we did observe mounds. Whether additional intracellular pathogens that
765 also activate NF- κ B, including viruses, would induce infected cell extrusion
766 using mechanisms similar to those observed during infection with *L.m.*, has
767 not yet been explored but it is highly possible and remains to be uncovered
768 [57, 58]. To that end, one would have to perform infection assays with dif-
769 ferent intracellular bacterial pathogens and characterize the changes in the
770 biomechanics that emerge during the course of infection (*e.g.*, cell stiffness,

771 cell shape, cell motility traction forces, monolayer stresses) and accordingly
772 modify the parameter inputs of the computational model.

773 By introducing other new modifications, the model could reproduce new
774 scenarios such as more complex geometries by considering substrate curva-
775 ture [59] or a geometry that is more similar to the *in vivo* condition (forma-
776 tion of crypts and villi structures). *In vivo*, not only the 3D topology of the
777 intestinal epithelium is different but also the many other extracellular phys-
778 ical forces which cells are exposed to, and which are crucial in modulating
779 cellular functions and intestinal barrier integrity [8]. In recently published
780 work, using the on-off model we examined how the stiffness of the extracel-
781 lular matrix where cells reside impacts the competition that arises between
782 infected and uninfected cells [29]. The model predicted more infected cell
783 extrusion on stiffer as opposed to softer substrates which we then confirmed
784 experimentally. The model was also able to predict that increased traction
785 stresses of surrounding uninfected cells on stiffer as opposed to softer ma-
786 trices drive the enhanced collective extrusion of infected cells. Integrating
787 into our model additional forces acting *in vivo* in the intestinal epithelium
788 (*e.g.*, shear fluid flows, peristaltic strains) and examining *in silico* and *in*
789 *vitro* how those impact infection processes is along our future goals. We be-
790 lieve that computational models will play a key role in linking *in vivo* and
791 *in vitro* experiments, since one can get new insight from the results of the
792 simulations and reach casual conclusions that can be then tested experimen-
793 tally. Nevertheless, the 3D *in vivo* conditions in the intestinal monolayer are
794 more complex than the conditions in 2D *in vitro* monolayers [60], but the
795 application of 3D intestinal organoids *in vitro* can serve as a more tractable
796 intermediate step [61]. Unlike *in vivo* bacterial infections, where so many
797 variables change concurrently, using organoids or organ-on-chip devices one
798 can emulate infection in a much more controllable system. Such systems can
799 also more easily allow us to measure different biomechanical properties and
800 are thus preferred for feeding in the future our computational model.

801 From the results of this computational work, we have learned:

- 802 1. When placed in close proximity to an infection domain, neighbouring
803 uninfected cells need to exert higher traction stresses on their ECM to
804 migrate towards and to squeeze infected cells. This process is essential
805 for the collective extrusion of infected cells that follows. The lack of
806 those strong cell-ECM adhesions makes cells unable to generate the
807 displacements of infected cells and consequently the formation of the

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mound.

2. Cell-cell junctions are required for the communication and force transduction between cells. To act collectively and force the squeezing of infected cells, neighbouring uninfected cells close to the infection focus require cell-cell contacts and the ability to transduce forces through them. In the absence of these cell-cell junctions, cells are not able to sense their mechanical environment and to elicit the collective extrusion of infected cells out of the monolayer.
3. The new protrusion law that we propose takes into account the stress gradient that neighbouring cells sense, being more unbiased (user - dependent) and consistent with previous cell mechanosensing mechanisms [37] than the simple on-off law we used previously.

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Overall, our *in silico* model elucidates how changes in mechanical parameters of cells or their environment impact infected cell squeezing which is necessary for the collective infected cell extrusion we observe *in vitro*. We find that the protrusion and the behavior of surrounding uninfected cells as well as the modulation of cell-cell and cell-ECM adhesions crucially modulate this competition that arises during infection. However, there are still open questions related to how cell mechanics and signaling in concert impact such cell competitions and how the physical microenvironment can further modulate those. A better understanding of these processes will help future studies to discover new therapeutic strategies to fight infection.

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7. Declaration of Competing Interest

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The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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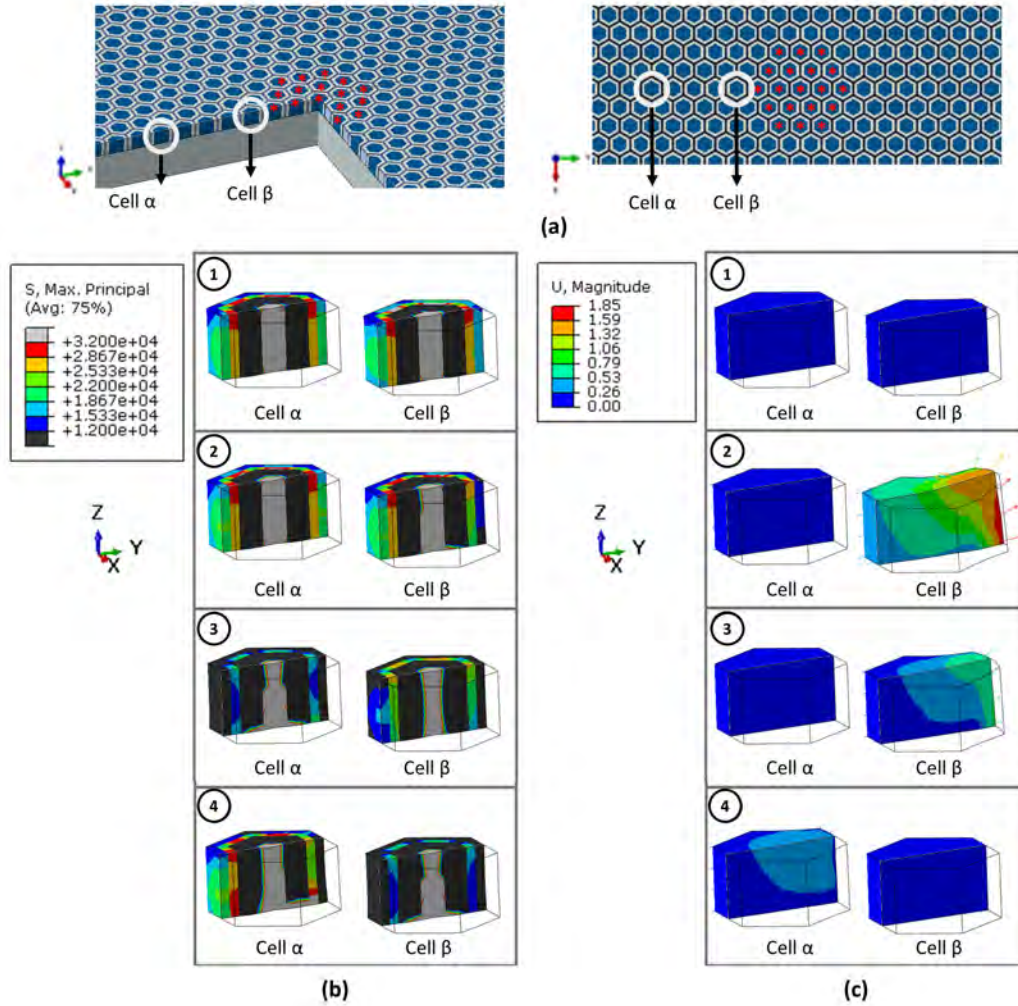


Figure 5: Maximum cellular principal stresses (Pa) and displacements (μm) in the cells when including the quantitative protrusion law proposed in equation 1. (a) Whole model in which the position of the two uninfected surrounding cells analysed is indicated (distal α and proximal β), red asterisks denote the infected cells. (b) Maximum principal stress (Pa) distribution in the passive part of cells α (distal) and β (proximal) during the contraction phase. (c) Displacements of α (distal) and β (proximal) cells during the protrusion phase. Different cases analysed: (1) uninfected cells cannot form new cell-ECM adhesions, (2) uninfected surrounding cells or β (proximal) cells can form new cell-ECM adhesions, (3) only uninfected cells close to the infection are able to create cell-cell junctions, (4) only uninfected cells far from the infection are able to create cell-cell junctions.

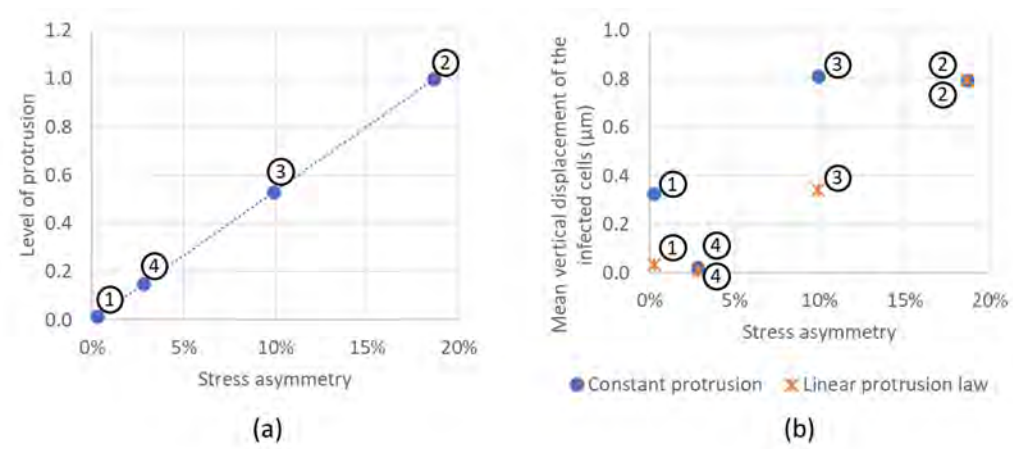


Figure 6: Protrusion degree and infected cell squeezing: (a) Plot showing the level of cellular protrusion (y -axis) versus degree of maximum stress asymmetry in the cell (x -axis) for the four cases considered; (b) Plot of the mean infected cell height (μm , y -axis) versus percentage of stress asymmetry (x -axis) considering the on-off protrusion law (blue points) and the asymmetry dependent protrusion-law (orange crosses) for the four cases analyzed. Different cases analysed: (1) none of the uninfected cells can form new cell-ECM adhesions; (2) only proximal uninfected surrounding cells can form new cell-ECM adhesions and all cells form cell-cell junctions; (3) only proximal uninfected surrounding cells are able to form cell-cell junctions but not distal ones; (4) only distal uninfected surrounding cells are able to create cell-cell junctions, but not proximal ones.

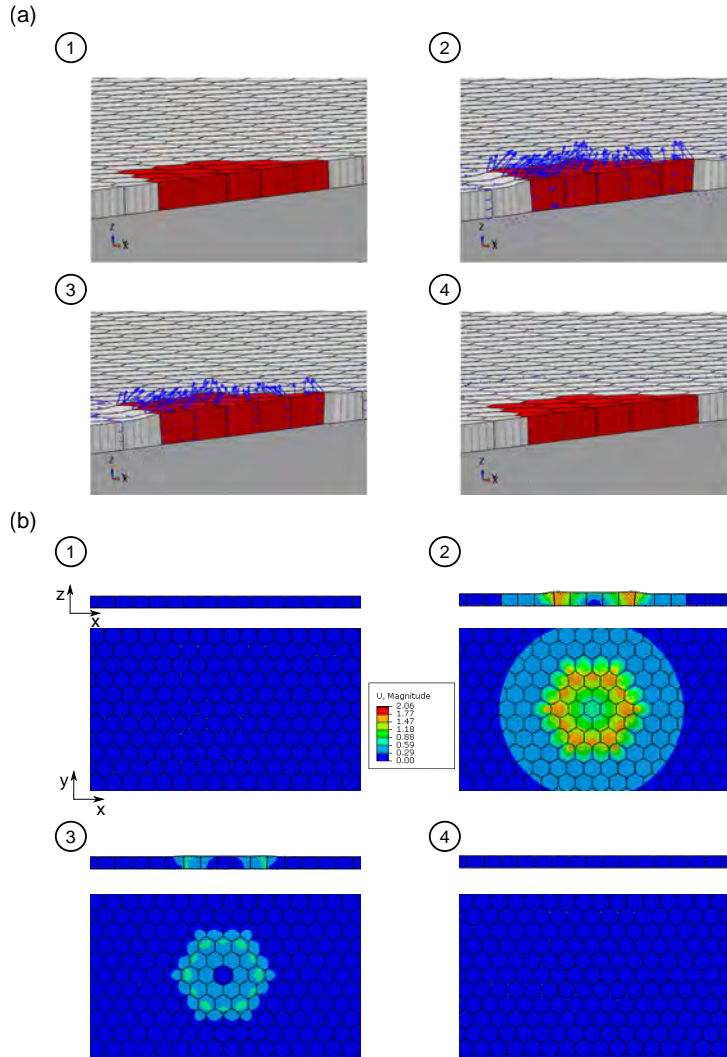


Figure 7: Simulation of cell competition results in infected cell squeezing. (a) Cross-sectional view of the cell monolayer and of the ECM on which cells reside. Blue arrows indicate cellular displacements during the protrusion phase which lead to infected cell squeezing. Infected cells are in red and uninfected cells in gray. Different cases analysed (1) uninfected cells cannot create new cell-ECM adhesions, (2) uninfected surrounding cells can create new cell-ECM adhesions, (3) only uninfected cells close to the infection focus are able to create cell-cell junctions, (4) only uninfected cells far from the infection focus are able to produce cell-cell junctions. (b) Cell monolayer displacements after one cycle of contraction and protrusion. Orthogonal view maps of the magnitude of cellular displacements. Top (x-y) and side (x-z) maps are shown in all the cases.