

1 Ultrametric model for covid-19 dynamics: an
2 attempt to explain slow approaching herd
3 immunity in Sweden

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6 **Abstract**

7 We present a model of infection dynamics that might explain slower
8 approaching the herd immunity during the covid-19 epidemic in Swe-
9 den than it was predicted by a variety of other models; see graphs Fig.
10 2. The new model takes into account the hierarchic structure of social
11 clusters in the human society. We apply the well developed theory
12 of random walk on the energy landscapes represented mathematically
13 with ultrametric spaces. This theory was created for applications to
14 spin glasses and protein dynamics. To move from one social cluster
15 (valley) to another, the virus should cross a social barrier between
16 them. The magnitude of a barrier depends on the number of social
17 hierarchy's levels composing this barrier. As the most appropriate
18 for the recent situation in Sweden, we consider linearly increasing
19 (with respect to hierarchy's levels) barriers. This structure of barriers
20 matches with a rather soft regulations imposed in Sweden in March
21 2020. In this model, the infection spreads rather easily inside a so-
22 cial cluster (say working collective), but jumps to other clusters are
23 constrained by social barriers. This model's feature matches with the
24 real situation during the covid-19 epidemic, with its cluster spread-
25 ing structure. Clusters need not be determined solely geographically,
26 they are based on a number of hierarchically ordered social coordi-
27 nates. The model differs crucially from the standard models of spread
28 of disease, such as the SIR-model. Our model describes such a spe-
29 cialty of spread of covid-19 virus as the presence of "super-infectors"
30 who by performing a kind of random walk on a hierarchic landscape

31 of social clusters spreads infection. In future, this model will be com-
32 pleted by adding the SIR-type counterpart. But, the latter is not a
33 specialty of covid-19 spreading.

34 **keywords: covid-19, epidemy, infection spreading, herd**
35 **immunity, hierarchy of social clusters, energy landscapes,**
36 **random walk, trees, ultrametric spaces, social barriers, linear**
37 **growing barriers**

38 1 Introduction

39 The dynamics of propagation of the covid-19 pandemy has many un-
40 usual features that were not reflected by classical modeling of epidemic
41 dynamics (see, e.g., [1]-[4]). In spite the tremendous efforts [5]-[11],
42 we still do not have a mathematical model describing adequately this
43 dynamics. In this complex situation, one can consider models reflect-
44 ing some *specialties of propagation of covid-19 infection* throughout
45 the human society. This paper is a step in this direction. We want
46 *to explain essentially slower than expected approaching the herd im-*
47 *munity¹ in Swedish population* (see, e.g., [12]-[14] for reports from
48 Public Health Institute of Sweden, [7]-[9] for attempts of mathemati-
49 cal modeling and [32]-[36] for reports from massmedia).² Our model
50 is purely theoretical. It is based on the advanced mathematics, theory
51 of random walks on hierarchic structures. We use the results of the
52 well known paper [19] on random walk on p -adic trees, the simplest
53 hierarchic structures endowed with ultrametric.

54 The main output that can be interesting say for epidemiologists
55 are the graphs presented in section 4 showing $t^{-\alpha}$ dynamics of prob-
56 ability to be infected in clustered society. The model differs crucially
57 from the standard models of spread of disease, such as the SIR-model
58 [4]. Our model describes such a specialty of spread of covid-19 virus as
59 the presence of “super-infectors” who by performing a kind of random
60 walk on a hierarchic landscape of social clusters spreads infection. In
61 future, this model will be completed by adding the SIR-type coun-
62 terpart. But, the latter is not a specialty of covid-19 spreading. We
63 hope that this paper may attract attention of experts in epidemiology

¹In particular, the mathematical model of covid-19 epidemy dynamics of Tom Britton that was used by Swedish State Health Authority predicted that the herd immunity will be approached already in May.

²As is well known and widely debated in mass-media, the Swedish government chosen its own way to handle covid-19 epidemy, namely, without any kind of lock-down. The main aim of such a policy is approaching the herd immunity, see appendixes 1,2 for some details.

64 and sociology (the model explores the structure of social connections
65 in the society) who may stimulate its further development.

66 Our basic assumption (that, in fact, led to consideration of the ul-
67 trametric mathematical model) is that infection's distribution in the
68 society has the structure of disjoint social clusters. Such a cluster can
69 be a collective of some enterprise or a state department, say clerks
70 of community office of some town or the personal of some hospital.
71 Inside such a cluster people still have relatively high degree of social
72 connections (see appendix 2). However, even the mild isolation pol-
73 icy of Swedish authorities erected sufficiently high *barriers between*
74 *clusters*, because people terminated many sorts of social contacts. In
75 particular, the government did not recommend travels inside the coun-
76 try or abroad. (They were not strictly forbidden, but the majority of
77 citizens followed these recommendations.) Another characteristic fea-
78 ture of the model is that connections between social clusters that can
79 be used by the virus to spread have *the hierarchic structure*. For ex-
80 ample, the community office has higher level in the social hierarchy
81 than the working place. Any worker can have some things to do with
82 community even during the period of epidemy.

83 Thus the basic assumption of our model is the following one:

84 **Assumption:** *Infection distribution in population has the hierar-*
85 *chic social cluster structure.*

86 Starting with this assumption, we design a mathematical model
87 implying

88 **Consequence 1.** *Slower than predicted approaching of the herd*
89 *immunity.*

90 **Consequence 2.** *Slow decay of epidemy.*

91 The problem of approaching the herd immunity is especially impor-
92 tant in the light of Swedish experience and its consequences for states'
93 policies in preparation to the second wave of covid-19 or other similar
94 viruses. The herd immunity is mathematically formalized through the
95 average probability for a person to become infected at time t , $P_I(t)$.

96 To model cluster dynamics, we use random walk on ultrametric
97 spaces [19]. It was widely used in studied in physics and microbiology,
98 see [19], [20]-[25] and references herein. Geometrically ultrametric
99 spaces have the treelike structure. The simplest trees are homogeneous
100 trees with the fixed number of branches p leaving each vertex, p -adic
101 trees.

102 Random walks on trees describe dynamics on energy landscapes.
103 There are given energy barriers Δ_m separating valleys, movement from

104 one valley to another valley is constrained by necessity to jump over
105 a barrier between them.

106 In our model of the covid-19 epidemy, originally the virus (or its
107 carrier) is perform a random walk in socially clustered society, it
108 spreads relatively easily inside a clustee, but to approach other so-
109 cial clusters it should “jump over social barriers”. Dynamics depends
110 heavily on two parameters: on the magnitudes of the social barriers
111 (the type of their growth between different levels of hierarchy) and on
112 the social analog of temperature. The magnitude of a social barrier
113 depends only on the number of hierarchy levels composing it, not on
114 a social cluster. This is the very important constraint on the pop-
115 ulation, it should be sufficiently homogeneous socially. (In spite of
116 the recent waves of immigration, Swedish society is still socially very
117 homogeneous.)

118 The configuration space of dynamics is the tree of social connec-
119 tions between people. In epidemy modeling, it is natural to assume
120 the presence of the hierarchic structure in social clustering of people,
121 by ranging basic social parameters coupled to infection. This rep-
122 resentation of individuals, as *vectors of hierarchically ordered social*
123 *coordinates* have been already used by the author and his collabora-
124 tors in a series of studies in cognition and psychology [26]-[31].

125 Just before submission of this preprint, I discovered the recent pa-
126 per of Britton et al. [15]. One of its authors, Britton, initiated inten-
127 sive mathematical modeling of spreading of covid-19 in Sweden and,
128 in particular, he is famous in Sweden for his prognoses of approach-
129 ing herd immunity in Swedish population [7]-[9]. These prognoses did
130 not match with the real data. In the new modeling [15], Britton et al.
131 started to take into account heterogeneity of population (cf. [16]-[18]).
132 This is a step towards coupling with our model. Before to discuss sim-
133 ilarities and differences of two models in more detail, I should study
134 article [15] more carefully.

135 2 Social trees

136 We represent the human society as a system of hierarchically coupled
137 disjoint clusters. There are many ways of creation of such representa-
138 tions. We present one of these possibilities that was used in my works
139 of ultrametric modeling in cognition and sociology (see, e.g., [26]-[30]).
140 The treelike representation of *social types* is based on selection of hier-
141 archically ordered social factors enumerated as $m = 0, 1, 2, 3, \dots$; factor
142 $m = 0$ is the most important, $m = 1$ is less important and so on. A

143 social type is represented by a vector

$$x = (x_0, x_1, \dots, x_{n-1}), \quad (1)$$

144 where its coordinates x_m take (typically) discrete values quantifying
 145 the m -th factor. In the simplest case, x_m takes two values, “yes”/“no”,
 146 or 1/0. We call numbers (x_m) *social coordinates*. The vector represen-
 147 tation of social types and individuals is widely used in sociology and
 148 psychology. The main distinguishing feature of our model is endowing
 149 the space of vectors with the special metric reflecting the hierarchic
 150 structure corresponding the order of social factors (see, e.g., [26]-[30]
 151 on application to cognition and psychology). The space of all vectors
 152 of the form (4) is called the hierarchic social space.

153 Since in the covid-19 situation the state plays the crucial role as
 154 the policy determining organ, it is natural to select $m = 0$ as the
 155 state that population is under consideration. However, since the ma-
 156 jority of states selected the lock down policy that was not oriented
 157 towards approaching the herd immunity, we restrict consideration to
 158 the Swedish population and use $m = 0$ for the next basic social factor,
 159 namely, for individual’s age, then say $m = 1$ for the presence of one
 160 chronic diseases, $m = 2$ for gender, $m = 3$ for race, $m = 4$ for the
 161 town of location, $m = 6$ for profession, $m = 7$ for the level of social
 162 activity, $m = 5$ the district in the town, $m = 8$ for the number of chil-
 163 dren, and so on. We understand that such ranking of the basic social
 164 factors related to the covid-19 epidemic may be naive and incomplete.
 165 The contribution of sociologists, psychologists, and epidemiologists
 166 can improve the present model essentially.

167 For mathematical simplicity, we consider p -adic coordinates, $x_m =$
 168 $0, 1, \dots, p - 1$, where $p > 1$ is a prime number. The space of all such
 169 vectors denote by the symbol $Z_{p;n}$ (p is fixed). For analytical compu-
 170 tations, it is convenient to represent elements of this space by natural
 171 numbers

$$x = x_0 + x_1p + x_1p^2 + x_{n-1}p^{n-1}, x_m \in \{0, 1, \dots, p - 1\}. \quad (2)$$

172 Thus the points of the hierarchic social space can be represented by
 173 natural numbers, $Z_{p;n} = \{0, \dots, p^n - 1\}$. The number of its points grows
 174 exponentially with the number of social coordinates n .

175 We now turn to the definition of a metric on $Z_{p;n}$. Consider two
 176 social vectors $x = (x_1, \dots, x_{n-1})$ and $y = (y_1, \dots, y_{n-1})$. Let their firsts
 177 k coordinates are equal, $x_0 = y_0, \dots, x_{k-1} = y_{k-1}$, but the k th co-
 178 ordinates are different, $x_k \neq y_k$. Then the hierarchic social distance
 179 between these social types, $d(x, y) = n - k$. The first social coordinates
 180 are the most important: longer the common initial segment of vectors

181 corresponds to closer social type, increase of k implies decrease of dis-
 182 tance between two social types. For example, let $k = n - 1$, i.e., two
 183 points differ only in the last coordinate, then $d(x, y) = 1$. This is the
 184 minimal possible distance in $Z_{p;n}$. (The coordinate x_n has the minimal
 185 degree of importance.) If the vectors differ already by the first coor-
 186 dinate, i.e., $x_0 \neq y_0$, then $d(x, y) = n$. This is the maximal possible
 187 distance between points in space $Z_{p;n}$. Distance d is ultrametric, it
 188 satisfies *the strong triangle inequality*:

$$d(x, y) \leq \max\{d(x, z), d(y, z)\}, \quad (3)$$

189 for any triple of points $x, y, z \in Z_{p;n}$. Here in each triangle, the third
 190 side is less or equal not only to the sum of two other sides (as usual),
 191 but even to their maximum.

192 As usual in a metric space we can introduce balls, $B_N(a) = \{x \in$
 193 $Z_{p;n} : d(a, x) \leq N\}$, where $N = 1, \dots, n$, and $a = (a_0, \dots, a_{n-1})$ is some
 194 point in $Z_{p;n}$, ball's center. In an ultrametric space, *any two balls are*
 195 *either disjoint or one is contained in another and any point of a ball*
 196 *can be selected as its center.*

For our modeling, it is important that the space $Z_{p;n}$ can be split
 into disjoint social clusters. (As we shall see soon, these clusters are,
 in fact, balls.) Each cluster is determined by fixing a few first (the
 most important) social coordinates,

$$Z_{p;n} = \cup_{j=0}^{p-1} C_j,$$

where $C_j = \{x : x_0 = j\}$. This cluster representation corresponds to
 the first level of social hierarchy, we distinguish points by their most
 important coordinate. Each of clusters C_j can be represented similarly
 as

$$C_j = \cup_{i=0}^{p-1} C_{ji},$$

197 where $C_{ji} = \{x : x_0 = j, x_1 = i\}$ are clusters of the deeper hierarchic
 198 level and so on, up to the single-point clusters corresponding to fixing
 199 all social coordinates.

Clusters are, in fact, ultrametric balls:

$$C_{i_0 \dots i_{k-1}} = \{x : x_0 = i_0, \dots, x_{k-1} = i_{k-1}\} = B_{n-k}(a),$$

200 where a is any point of the form $a_0 = i_0, \dots, a_{k-1} = i_{k-1}$ and arbitrary
 201 coordinates $a_j, j = k, \dots, n - 1$.

202 Geometrically space $Z_{p;n}$ is represented as a homogeneous tree with
 203 p branches leaving each vertex. Cluster is a bunch of branches having
 204 the common root. By extending this root we split the cluster into
 205 subclusters.

206 Now we consider the procedure of extension of a social tree by
 207 adding new social coordinates, so from tree $Z_{p;n}$ to tree $Z_{p;N}$, where
 208 $N > n$. As the result of such an extension, each point of social space
 209 $Z_{p;n}$ becomes a social cluster in social space $Z_{p;N}$. In principle, it is
 210 impossible to determine a social type by fixing any finite number of
 211 social coordinates. Hence, We have to consider infinite sequences of
 212 coordinates:

$$x = (x_0, x_1, \dots, x_{n-1}, \dots), \quad x_j = 0, 1, \dots, p - 1. \quad (4)$$

213 Denote the space of such sequences by the symbol Z_p . This is the
 214 complete hierarchic social space. Points of finite trees represent social
 215 clusters.

216 3 Dynamics

217 Consider a tree with n levels of social hierarchy, $Z_{p;n}$. Suppose that
 218 initially infected people are concentrated just in one social cluster rep-
 219 resented by a single point of $x \in Z_{p;n}$. Consider the initial probability
 220 for a person in this cluster to become infected, $P(y, 0) = \delta(y - x)$.

221 The virus plays the role of a system moving through barriers in
 222 models of dynamics on energy landscapes (see [19], [20]-[25] and ref-
 223 erences herein). In our case, these are social barriers between social
 224 clusters of population. The virus performs a complex random walk
 225 motion inside each social cluster moving in its sub-clusters, goes out
 226 of it and spreads through the whole population, sometimes the virus
 227 comes back to the original cluster from other social clusters that have
 228 been infected from this initial source of infection, and so on. During
 229 this motion the virus should cross numerous social barriers.

230 Instead of virus walking through the social tree, we can consider
 231 a person. A person of the social type $x = (x_1, \dots, x_n)$ can interact
 232 with persons of the social type, $y = (x_1, \dots, x_k - 1, y_k, \dots, y_n)$, where
 233 $x_k \neq y_k$ by crossing the social barrier for $n - k$ levels of hierarchy. The
 234 temporal sequence of social contacts of some persons can have a very
 235 complicated trajectory, visiting numerous clusters (but the probability
 236 of approaching a cluster depends crucially on social barriers).

237 We are interested in *the relaxation process* that is understood as
 238 the evolution of the probability to become infected for a person from
 239 the social cluster x , i.e., in the time dependence of the quantity $P(x, t)$.

240 We do not want to go into details, since the problem of relaxation
 241 was well studied in physics and microbiology, see [19], [20]-[25] and
 242 references herein. The relaxation regime depends crucially on the
 243 barriers' magnitude, how rapidly they grow up on the way from one
 244 cluster to another.

4 Random walk on on infinite trees: temporal behavior of probability

As in the previous section, we a random walk on a finite tree. Here we follow the paper of Ogielski [19]. Let us consider a finite tree with n levels. Thus there are 2^n points at the last level. They enumerate the total population: $i = 0, \dots, 2^n - 1$.

Let virus encounters a barrier of size Δ_m , in hopping a distance m (for crossing m levels of hierarchy), where $\Delta_1 < \Delta_2 < \dots < \Delta_m < \dots$. It is supposed that barriers Δ_m are the same for all social clusters, i.e., they depend only on distance, but not on clusters.

The probability to jump over the barrier Δ_m has the form (up to the normalization constant):

$$\mathbf{P}(m) = e^{-\frac{\Delta_m}{T}}, \quad (5)$$

where T is model's parameter; in physics it has the meaning of *temperature* of the environment; we also interpret it similarly, as a kind of *social temperature*, cf. [?]. Probability $\mathbf{P}(m)$ increases (for crossing the fixed number of hierarchy's levels) with increasing of social temperature T . For high social temperatures, jumps are easier.

The simplest one is that with a uniform barrier Δ , at every branch point; that is, a jump of distance 1 involves surmounting a barrier Δ , of distance 2, a barrier 2Δ , and so on. Hence, barriers linearly grow with distance m ,

$$\Delta_m = m\Delta, m = 1, 2, \dots \quad (6)$$

It seems that this type of behavior is the most natural from the viewpoint of social connections during the covid-19 epidemy in Sweden. Barriers are sufficiently high, but they still are not walls as during the rigid quarantine (as say in Italy, France, or Russia). The probability to jump over the barrier Δ_m has the form (up to the normalization constant):

$$\mathbf{P}(m) = e^{-\frac{m\Delta}{T}}. \quad (7)$$

The probability depends on the height Δ of the minimal social barrier, but, for large m , its contribution to is not so important.

By using random walk on the tree with n levels of hierarchy and approaching $n \rightarrow \infty$ one can derive the following asymptotic behavior of the relaxation probability:

$$P(x, t) = t^{-T \ln p / \Delta}, t \rightarrow \infty. \quad (8)$$

Set $\kappa = T \ln p / \Delta$. If $\kappa \ll 1$, e.g., the social temperature is low, p is small say $p = 2$ and the primary social barrier Δ is large, then the

279 average probability for a person in the original social cluster C_0 to
 280 become infected decreases rather slowly, see Fig. 1.

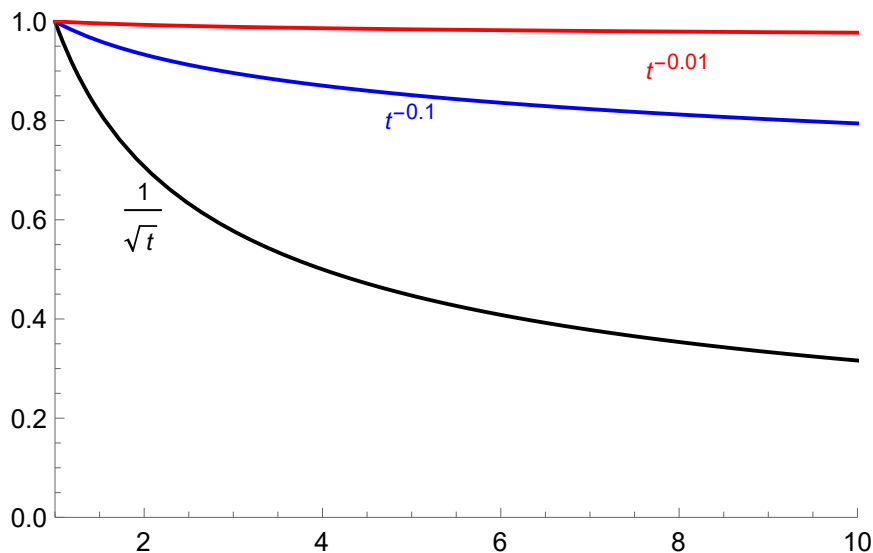


Figure 1: Asymptotic behavior of probability $P(x,t)$ to become infected. (For fixed social temperature T , the upper graphs correspond to one-step barrier growth 10 and 100 times, respectively.

281 Hence immunity against covid-19 increases also slowly, see Fig. 2,
 282 as function

$$1 - P_I(x, t) \sim 1 - t^{-T \ln p / \Delta}, t \rightarrow \infty. \quad (9)$$

283 5 Concluding remarks

284 The presented ultrametric model with random walk dynamics on en-
 285 ergy landscapes describes well the social cluster structure of spread-
 286 ing of covid-19. The model was designed to explain mathematically
 287 the slow approaching the herd immunity in Swedish population dur-
 288 ing March-June 2020, essentially slower than it was predicted by all
 289 mathematical models.³ The model elevates the role of the social di-
 290 mension of infection spreading comparing with its purely bio-medical
 291 dimension. The bio-medical restrictions in Sweden were very soft; in
 292 particular, no face-masks, 1,5 meter social distance, public transporta-
 293 tion worked more or less as usual (see appendix 2 for details). The

³See appendix 1; finally, the state epidemiologist Anders Tegnell pointed that it seems meaningless to appeal to mathematical models at all, since they do not reflect even approximately the real situation.

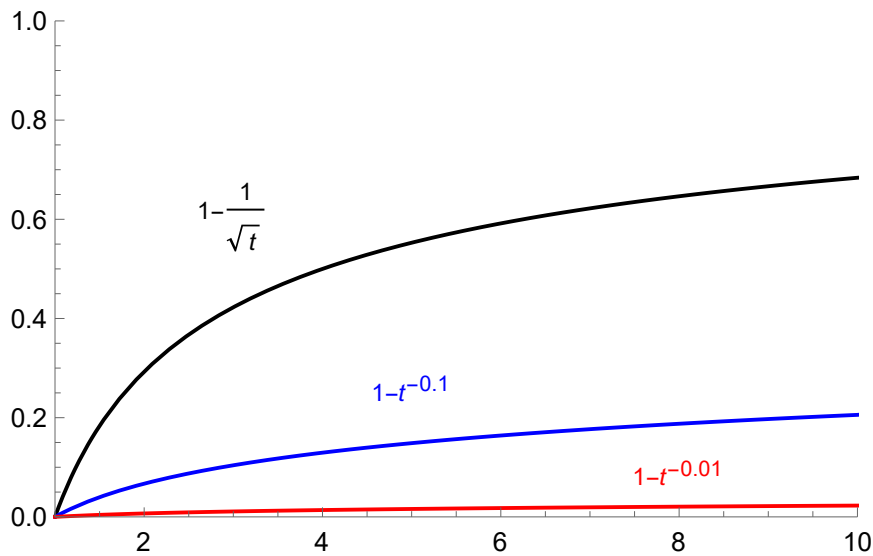


Figure 2: Asymptotic behavior of probability to become immune; increasing of the herd immunity (for fixed social temperature T , the upper graphs correspond to one-step barrier growth 10 and 100 times, respectively).

294 most typical infecting took place in working collectives in that social
 295 contacts were not occasional, as say in metro, or in a bus, or even in
 296 a restaurant during lunch, but close and permanent, on the everyday
 297 basis.

298 We applied to the new area of research, to epidemiology, mathe-
 299 matical theory developed for applications in statistical physics (spin
 300 glasses) and microbiology (protein folding): ultrametric random walk
 301 describing dynamics on complex energy landscapes with the hierarchic
 302 structure of barriers between valleys. The presence of social barriers
 303 growing with hierarchy's levels makes the evolution of epidemy es-
 304 sentially slower than in models which do not take into account the
 305 cluster-character of infection spreading. In particular, our model is
 306 purely diffusional, cf. with standard SIC-model [1]. We motivate con-
 307 sideration of linearly growing social barriers in Sweden with its soft
 308 epidemiological restrictions.

309 Although the model is very simplified it reflects some features of
 310 the covid-19 epidemy in Sweden. We hope that it will stimulate further
 311 development of ultrametric epidemiological models taking into account
 312 the hierarchic social clustering of population.

Appendix 1: Growth of the herd immunity in Sweden

Our model can be interesting only for Sweden, where the “experiment” for approaching the herd immunity was performed in its clean form, without overshadowing by quarantine. The main concern of Swedish authorities, including Anders Tegnell, is that the dynamics of getting antibodies for covid-19 in Swedish population is essentially slower than it was expected. Since the end of April 2020, Anders Tegnell, the chief state epidemiologist of Sweden, started to announce (see, e.g., [32]) that very soon we, Swedish citizens, will become immune against the virus. This announcement was repeated a few times during May-June 2020, but it still not clear whether it happened or not (see, e.g., [34]-[36]). Moreover, Stockholm university made recently (June 24 []) the update that, in fact, already the level 60% can be considered as the herd immunity state. So, it seems that there is no hope to approach 70% level of immunity.

On June 24, 2020, it was announced [] that: “A total of 7.3 percent of the blood samples collected from people in Stockholm were positive, 4.2 percent in Skane and 3.7 percent in Västra Götaland. The numbers reflect the situation in early April, as it takes time for the antibodies to develop. The authority’s modeling has previously shown that 26 percent of the population in Stockholm would have been infected on May 1. Tom Britton, professor of mathematical statistics at Stockholm University, comments on these and says that the figures are “clearly lower”, than he thought. “Firstly, I am thinking about the modeling, if there is any mistake that I and the Public Health Authority have made. Then you also wonder if some have been infected but do not have detectable antibodies, for example people who are mildly infected.”

The level of the herd immunity depends on the age group. On June 2, 2020, it was pointed out that for the youngsters up to 19 years old around 8% Andelen med antikroppar mot covid-19 bland yngre upp till 19 år var närmare åtta procent, för åldersgruppen 20-64 låg motsvarande siffra på 6-7 procent. För personer över 65 år låg siffran på cirka tre procent. Det kan finnas flera skäl till att det är lägre nivåer för vuxna och äldre, enligt Karin Tegmark Wisell.

Appendix 2: Situation in Sweden and approaching the herd immunity

Comparing with the majority of other countries the Swedish preventing measures look as very smooth:

- The number of participants of any meeting (social, business, science, sport, children activity) should not exceed 50 persons.
- It was not recommended (but not forbidden) to make travels inside Sweden and abroad without special need (private or on business).
- For old people, it was suggested to escape social contacts, but the decision was up to each individual.
- In restaurants, night clubs, and disco, people should keep a “social distance”.

It is clear that such minor measures cannot stop spreading of covid-19. The aim was just to make spreading slower and in this way to much the capacity of hospitals and the speed of virus' spreading. This anti-epidemic policy has its own advantages and disadvantages and we do not plan to discuss them in this paper that is aimed to model mathematically approaching of the herd immunity in Sweden. Generally the herd immunity is the well established topic of the epidemiological research, so, in principle, there is nothing specially Swedish in its modeling. The specialty of the present pandemy is that only the Swedish state epidemiologist Anders Tegnell selected teh strategy of approaching of a high level of immunity to covid-19 in Swedish population. Theoretically a population becomes secure against some decease when around 70% of it becomes immune against this decease.

Although in numerous interviews Tegnell always rejects that the aim of his policy is to infect as many people as possible, it seems that in reality the aim was precisely this one. One of the signs of such aiming was soft control of how population is even aforementioned minor restrictions. As one may be have seen from reportage from Sweden, streets, even in Stockholm (it was epidemy's epicenter in Sweden), were crowded by walking people who even did not keep the recommended social distance 1.5 m, the same could be seen in restaurants. There were some stories that in Stockholm some restaurants were closed, because their owners did follow the recommendations, but in my own town Växjö (around 100 000 people) people seat very dense, especially during business or family events; moreover, I (by taken lunches) have seen really very old people who were eating and drinking wine (well, may be the last glass wine?). Another signal that

389 Sweden was aiming to approach the herd immunity was the perma-
390 nent pointing by Tegnall to the second wave of covid-19 and that the
391 herd immunity would help us to pass this new disaster easier than
392 population of countries selected the policy of lockdown.

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