Share, but unequally: A plausible mechanism for emergence and maintenance of intratumor heterogeneity

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Abstract

Intratumor heterogeneity (ITH), referring to coexistence of different cell subpopulations in a single tumor, has been a major puzzle in cancer research for almost half a century. The lack of understanding of the underlying mechanism of ITH hinders progress in developing effective therapies for cancers. Based on the findings in a recent quantitative experiment on pancreatic cancer, we developed a general evolutionary model for one type of cancer, accounting for interactions between different cell populations through paracrine or juxtacrine factors. We show that the emergence of a stable heterogeneous state in a tumor requires an unequal allocation of paracrine growth factors ("public goods") between cells that produce them and those that merely consume them. Our model provides a quantitative explanation of recent *in vitro* experimental studies in pancreatic cancer in which insulin growth factor (IGF-II) plays the role of public goods. The calculated phase diagrams as a function of exogenous resources and fraction of growth factor producing cells show ITH persists only in a narrow range of concentration of exogenous IGF-II. Remarkably, maintenance of ITH requires cooperation among tumor cell subpopulations in harsh conditions, specified by lack of exogenous IGF-II, whereas surplus exogenous IGF-II elicits competition. Our theory also quantitatively accounts for measured *in vivo* tumor growth in glioblastoma multiforme (GBM). The predictions for GBM tumor growth as a function of the fraction of tumor cells are amenable to experimental tests. The mechanism for ITH also provides hints for devising efficacious therapies.

Keywords: Intratumor heterogeneity, evolution, public goods, allocation strategy, cooperation, competition.

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Introduction

Cancer, a complex disease that arises through clonal evolution, is a major cause of mortality throughout the world with no cure in sight despite a tremendous amount of effort and resources expended to uncover its root causes. The underlying mechanisms of the origin and spread of cancer is still under debate [1]. The first evolutionary theory of cancer, proposed by Nowell in 1976, describes cancer progression as a linear process derived from sequential acquisition of somatic mutations [2]. With the advent of next generation sequencing [3] it has become clear that instead of linear growth cancer evolution is better described by branched growth in which multiple subclones appear and coexist during cancer progression. Accumulating evidence favor the branched model and the associated intratumor heterogeneity (ITH) [4, 5, 6, 7, 8, 9, 10, 11]. ITH is a complex phenomenon and many sources, such as genetic, epigenetic mutations, stochastic genetic expression and so on, could contribute to its origin [12]. The presence of ITH in a variety of cancers, which is a great impediment in designing effective treatments [12, 13, 14], is hard to rationalize according to the linear evolutionary model because subclones with even a small fitness advantage should ultimately proliferate at the expenses of others. For this reason the persistence of ITH in a macroscopic tumor is a puzzle.

The tumor cells, with diverse genetic or epigenetic mutations, are often spatially separated [4, 7] with each subclone dominating the cell population in a specific region. It indicates that spatial constraints or distinct microenvironments might prohibit clonal sweeps, thus inducing ITH. However, it cannot explain the coexistence of distinct subclones in the same region of a tumor [15, 16].

The interactions between tumor cells and the surrounding normal cells, and microenvironments have been extensively studied in the past few decades [17, 18, 19, 20] while much less effort has been made in investigating the interactions among subclonal populations in tumors. Instead of competition, the cooperation among distinct subclonal populations is found to be essential for tumor maintenance [21], enhance tumor growth [22], and even facilitate cancer metastasis [23, 24]. Meanwhile, it is observed that a minor and even undetectable subclone can dominate the clinical course and lead to cancer relapse frequently [25, 26, 27]. Therefore, it is crucial to understand the mechanism of cooperation that facilitates the emergence and maintenance of ITH in a single tumor.

Cooperation can be established through mutualism or even unidirectional interactions among different subpopulations. Mutualism in ecology provides an effective mechanism for the establishment of a heterogeneous state in which each subpopulation benefits from the activity of the other [28, 29, 30, 31]. Recently, it was found that two distinct subclones in cancer can complement each other's deficiency in order to survive and proliferate [21]. The formation of a heterogeneous state can be explained by a mechanism similar to mutualism in which fitness of distinct cell types is maximized by resource sharing [32]. Compared to the strict interdependence in mutualism, a unidirectional interaction between distinct populations is observed more frequently [32, 33, 34]. It is quite common

to find that some tumor cells secrete diffusible growth factors or other paracrine factors to promote tumor growth [32]. Meanwhile, other types of tumor cells free ride on those essential nutrients to grow and might even dominate the whole population without producing them. One recent study for Glioblastoma multiforme (GBM) shows that a minor subclone in a tumor supports and promotes the growth of a dominant one by activating a paracrine signaling circuit [34]. It was found that the mixture of these two distinct subpopulations promote faster tumor growth than they would by themselves. Similarly, an insightful *in vitro* experiment combined with theoretical analysis based on evolutionary game theory [35] investigated the "public goods game" in pancreatic cancer cell populations in which one cell type produces a growth factor as the "public good". The growth factors promote the proliferation of both cell types. It is found that these two types of cancer cells can coexist under certain conditions although there is only a unidirectional interaction between them. Although insightful, previous applications of the evolutionary game theory provided only a qualitative explanation for the experimental results [35]. The assumption that the population size is a constant does not accurately capture the growth dynamics observed in their experiments. In addition, as shown here, such an assumption cannot account for the intriguing related phenomena of glioblastoma multiform growth [34] in which there are clear manifestations of ITH. Additionally, a theoretical framework accounting for influences of different factors such as exogenous resources and the cost for producing public goods on the establishment of cooperation between two cell populations directly is needed for expanding the scope of the game theory applications. Therefore, the underlying generality of the mechanisms for the origin of ITH is still unclear.

Here, we investigate the mechanism of cooperation between two distinct populations composed of 'producers' and 'non-producers'. We show that several factors are indispensable for the maintenance of a stable heterogeneous coexisting population of producer and non-producer cells. A critical finding in our work is that the unequal allocation of public goods among different species plays a crucial role in maintaining heterogeneity. By studying the influence of exogenous resources and initial population fraction on such a simple system, we obtained a phase diagram from our theory, which is in excellent agreement with experimental observations. Our theory also quantitatively explains the unexpected growth behaviors of GBM tumors as a function of initial fractions of producer cells in *in vivo* experiments with no free parameters. The robustness of the theory is established by making testable predictions of the origin of ITH in GBM driven by a paracrine mechanism [34]. The discovery of mechanisms for such ITH might also give clues for changing strategy of treatment in cancers in which interactions between different subclones are prevalent.

Models

The public goods game has been extensively used in the studies of human societies, and similar concepts have been applied to other systems, such as microbial

colonies, and insect communities [36, 37, 38, 39, 40, 41]. In this model, both the producer and non-producer benefit from the products produced solely by the former (see Fig. 1). However, the producers pay a price for the production of public goods while the non-producers merely free-ride on the products without incurring any cost. In general, such a dynamics would result in an unstable system in the sense the producer might become extinct if the public goods are shared equally between the parties. The system would collapse unless sufficient exogenous resources are provided, which could lead to the fixation of non-producers, as discussed below in detail.

Equal sharing is untenable: We describe the evolution of the fraction f_+ of producers and f_- of non-producers using the replicator equations,

$$\frac{\partial f_+}{\partial t} = (w_+ - \langle w \rangle) f_+ \,, \tag{1}$$

and,

$$\frac{\partial f_-}{\partial t} = (w_- - \langle w \rangle) f_- \,, \tag{2}$$

where w_+ and w_- are fitness of producers, and non-producers, respectively. The normalization condition is $f_+ + f_- = 1$. The average fitness $\langle w \rangle$ is,

$$\langle w \rangle = w_+ f_+ + w_- f_- \,. \tag{3}$$

Let N_+, and N_- be the number of producers and non-producers, respectively. The total population size is $N \equiv N_+ + N_-$. Although the system size, N, is often assumed to be a constant [35, 42], we consider a general case [43] where the population size varies with the time evolution given by,

$$\frac{\partial N}{\partial t} = w_+ N_+ + w_- N_- = \langle w \rangle N \,. \tag{4}$$

Agent death, neglected for simplicity, could be readily included in the fitness functions.

If the public goods are shared among all the producers and non-producers equally, the same benefit will be presented to them, leading to the relation,

$$w_+ = w_- - p_0 \,, \tag{5}$$

where p_0 (> 0) is the cost paid by the producers to generate the public goods. Then, the time evolution of producers could be rewritten as,

$$\frac{\partial f_+}{\partial t} = -p_0 f_+ (1 - f_+) \,. \tag{6}$$

Therefore, the fraction of producers would decrease with time until it vanishes because p_0, f_+, and $1 - f_+$ are all non-negative. Then, the non-producers could sweep through the population, achieving higher fitness in the process, if exogenous public goods are provided continuously to support the population growth. Otherwise, the system would collapse as observed in the case of "tragedy of the commons" once the public goods are depleted [44].

Results

Coexistence between producers and non-producers requires non-linear fitness: A solution to the dilemma that emerges from the naive model of equal sharing, discussed above, is to change the rule for the allocation of public goods. Because the producer pays a price for the production of public goods, which decreases its fitness directly, more products should be allocated to the producer (see the public goods distribution in Fig. 1A as an example). If this were to occur the producer would recoup the losses in order to gain the same fitness as the non-producer. In this unequal sharing scenario, the producer and non-producer could coexist, as we show here.

In general, the fitness of one agent is a function of the fraction of producers. A higher fitness is expected as the fraction of producers increases. For a dynamic system, a heterogeneous state (containing both producers and non-producers) could be maintained only the stabilities of the states are ensured. A heterogeneous state cannot be realized if w_+ and w_- are linear fitness functions of f_+. Let the fitness functions of the producer (w_+) and non-producer (w_-) be,

$$w_+ = k_+ f_+ - p_0 \,, \tag{7}$$

and

$$w_- = k_- f_+ \,, \tag{8}$$

respectively. The parameters k_+, k_- are the corresponding allocation coefficients of public goods produced by producers and p_0 is the cost paid by each producer. The producer needs to get more public goods than the non-producer, which means $k_+ > k_-$ ($k_+ = k_-$ in Eq. (5)). The condition for equilibrium with both players follows from Eqs. (1) and (2), resulting in,

$$f_+^0 = \frac{p_0}{k_+ - k_-} \,. \tag{9}$$

Given the fraction f_+^0 for the producer in Eq. (9), the two members attain the same fitness ($w_+ = w_-$). However, this equilibrium is unstable and eventually only one of them survives (see Fig. S1 in the SI). As the fraction f_+ becomes a little higher than f_+^0 due to the birth of new producers or a higher value is given initially, the producer would attain higher fitness than the non-producer (for $k_+ > k_-$), leading to a much higher fraction of the producer. Finally, the producer would take over the whole population due to this positive feedback. In the opposite limit, the system would consist of non-producer only if f_+ is smaller than f_+^0. Therefore, a linear fitness function cannot lead to the establishment of a stable heterogeneous system in the present model. Instead of a linear function, fitness functions are typically non-linear in biological systems at all length scales due to cooperation or competition between the various interacting moieties [45, 46, 47, 48]. In the following, we first utilize data from one recent experiment to illustrate how a stable heterogeneous population can be established from the public goods game in a system consisting of both producers and non-producers where a non-linear relation is observed for fitness functions [35].

In a recent study, Archetti, Ferraro and Christofori (AFC) investigated the origin of the"tragedy of the commons" in cancer cells [35]. The insulin-like growth factor II (IGF-II) is up-regulated in many cancers, which can promote cell proliferation and abrogate apoptosis [49, 50]. The producer (+/+) cells are derived from mice with insulinomas (a neuroendocrine pancreatic cancer), while the non-producer (-/-) cells are obtained from the same mice but with IGF-II gene deleted. Therefore, the -/- cells do not produce the IGF-II molecules. Thus, IGF-II is an ideal public good for these two cell types because both of them can uptake this protein to reach higher fitness (growth rate), ensuring their survival and growth. The two different types of cells were then mixed to investigate the conditions under which a stable heterogeneous state could be established, mediated by optimal sharing of IGF-II. Although AFC proposed a sound analyses of their findings based on game theory, only qualitative comparisons to their experiments were provided. In addition, the assumption of a constant population size [51] also requires scrutiny. Here we approach the problem from a different perspective relying on the replicator dynamics with evolving population size, which enables us to make quantitative predictions not only for pancreatic cancer but also GBM.

The measured growth rate of the non-producer -/- cells as a function of exogenous IGF-II concentration, c, is non-linear (see Fig. S2 in the SI). In order to solve the replicator equations, we first fit the experimentally measured -/- cell growth rate using a Hill-like function,

$$w_- = a_1 + \lambda_1 c^\alpha/(a_2^\alpha + c^\alpha)\,. \tag{10}$$

The Hill function in Eq. (10) fits the experimental data accurately (see Fig. S2 in the SI) yielding $a_1 = 2.0$, $\lambda_1 = 18.9$, $\alpha = 0.7$, and $a_2 = 3.2$. We also used the logistic function, which does not fit the data nearly as well, to make predictions (see Figs. S3, S4 and SI for details). Interestingly, the use of logistic function for the fitness yields qualitatively similar results (see Figs. S3, S4 and the SI for details), thus demonstrating that non-linear feedback between +/+ and -/- cells is the source of heterogeneity, as already surmised by AFC. We describe the results in the rest of the paper using the Hill-like function for w_+ and w_-.

The public good IGF-II is produced endogenously or can be supplied exogenously. Therefore, we write the IGF-II (c_-) available for the non-producer as,

$$c_- \equiv c = bf_+ + c_0\,. \tag{11}$$

where c_0 represents the exogenous supply of IGF-II, and bf_+ is the allocation of IGF-II arising from +/+ cells. Because AFC did not measure the fitness of the producer cells systematically, a relation similar to that in Eq. (10) for w_+, might be assumed. In order for the emergence of heterogeneous populations, the allocation of public goods produced by the +/+ cells should be unequal, so the growth rate of +/+ cells is written as,

$$w_+ = g(c_+) - p_0\,, \tag{12}$$

where $g(c_+)$ has the same Hill-like functional form as in Eq. (10) except that c is replaced by c_+, leading to,

$$c_+ = af_+ + c_0\,. \tag{13}$$

The parameter a, similar to b in Eq. (11), is the coefficient for the allocation of IGF-II produced by +/+ cells.

Influence of public goods allocation strategies: First, let us consider the influence of allocation strategies for public goods in a mixture of +/+ and -/- cells. The ratio of b/a in Eqs. (11) and (13) determine how the public goods provided by the producers are shared between the two populations. The public goods are shared equally if the ratio (b/a) is equal to unity, while the producers do not provide resources to the non-producer if $b/a = 0$. More resources are allocated to the producer if $b/a < 1$ while the non-producer obtains a larger amount of resources as $b/a > 1$. Public goods (IGF-II) is diffusible, which is modeled in our theory in the following way. The equality $(a = b)$ would result if diffusion of IGF-II is rapid. On the other hand, the inequality, $a > b$, would be a consequence of slow diffusion or fast uptake of IGF-II by the producers. The assumption of slow diffusion, with a limited diffusion range of IGF-II, is made in the model of AFC [35]. Thus, by considering different values of the ratio, b/a, different rates of diffusion and uptake of IGF-II are covered. Accordingly, three values 1, 0, and 0.1 are considered for the ratio b/a in Figs. 2A-C, which show the growth rate of the two cell types as a function of the fraction (f_+) of +/+ cells. The corresponding evolution of $f_+(t)$ under different initial conditions are also shown in Figs. 2D-F.

The -/- cells always grow faster than +/+ cells if the public goods are shared equally $(b/a = 1)$ (see Fig. 2A), which can also be derived from Eqs. (10) and (12) directly $(w_- > w_+$ for $b \geq a)$. The non-producer always attains higher fitness than the producer as long as the former gets larger $(b/a > 1)$ or equal $(b/a = 1)$ amount of IGF-II. Therefore, the non-producer would take over the whole population if $b/a \geq 1$ producing a homogeneous state, irrespective of the initial fraction $f_+(0)$ of the producer (see the evolution of $f_+(t)$ in Fig. 2D). The exception is when $f_+(0) = 1$. The state with producers only $(f_+ = 1$, see the open circle in Fig. 2A) is unstable under infinitesimal perturbations of non-producer population. A steady binary system with the coexisting population of +/+ and -/- cells cannot form under these conditions, as expected from previous arguments.

Consider another limiting case with $b/a = 0$ in which the non-producer does not get access to the public goods generated by the producer (with w_- = constant, see the dash-dotted blue line in Fig. 2B). In this limit, it is possible to have an internal equilibrium (see the open circle in Fig. 2B) resulting in the two cells having the same fitness $(w_- = w_+)$. However, this is an unstable equilibrium state, which means only one type of population would survive (see the filled red and blue circles in Fig. 2B, respectively) depending on the initial conditions (see also the evolution of $f_+(t)$ in Fig. 2E). A stable homogeneous state consisting of only producers results if $f_+(0)$ is above the fraction (f_+^{us}) of the

producer corresponding to the internal unstable state (illustrated by the open circle in Fig. 2B). In this case, the flow is towards the $f_+(0) = 1$ stable state. For $f < f_+^{us}$, the non-producers form another stable homogeneous state (see the green dotted and blue dash-dotted lines in Fig. 2E). A stable heterogeneous state with coexisting populations cannot exist if $b/a = 0$.

If the public goods are allocated unequally between the +/+ and -/- cells due to the presence of spatial structure, (Fig. 2C) with $0 < b/a < 1$, two internal equilibrium states (with $0 < f_+^i < 1$) appear. One of them is an unstable state (the left open circle in Fig. 2C) whereas the filled green circle in Fig. 2C corresponds to a stable state due to the frequency-dependent selection [35, 52]. Close to the internal stable state, the fitness of +/+ cells becomes smaller than that of -/- cells as the +/+ cell frequency increases above the stable state value. Therefore, the frequency of +/+ (-/-) cells will decrease (increase) until it returns to the value corresponding to the stable state (see the yellow dashed lines in Fig. 2F). Similar effect is observed when the +/+ cell frequency is below the stable state value (see the green dotted lines in Fig. 2F) as long as the $f_+(0)$ is higher than the value $f_+^{us} = 0.069$ corresponding to the internal unstable state. Therefore, the two types of cells coexist, leading to a stable heterogeneous state. We also observe that producers would be extinct (see the blue dash-dotted line in Fig. 2F) if a small amount of +/+ cells are mixed with a large population of -/- cells initially. These findings based on the replicator equations with non-linear w_- are consistent with the experimental observations obtained in the presence of a small amount of exogenous resources [35].

Role of the exogenous production of public goods: From Eq. (11), it is clear that the stable state could also be influenced by extrinsic factors, such as the supply of exogenous resources. By varying the values of the parameter c_0 in Eqs. (11) and (13), we investigated the role of exogenous resources in public goods game. The growth rate of the two different types of cells as a function of the fraction of +/+ cells is shown in Fig. 3 as the supply of exogenous resources (serum in the experiments [35] containing IGF-II molecules) is changed.

Fig. 3A shows that -/- cells grow faster than +/+ cells irrespective of the fraction f_+ of +/+ cells given large enough exogenous public goods (large c_0). Surprisingly, we find that the non-producer would sweep through the population while the producer becomes extinct (see the blue filled circle in Fig. 3A) even though the latter could get additional public goods produced by themselves ($b/a \ll 1$). This is due to the competitive advantage of the non-producers in a high welfare environment without punishment. These two cell types compete but do not cooperate with each other in nutrient-abundant environments.

As we decrease the serum concentration (smaller c_0) and keep all other parameters the same as in Fig. 3A, the two cell types start to establish a cooperative relationship and could coexist (see Fig. 3B). It leads to the appearance of a stable heterogeneous state (see the green filled circle in Fig. 3B), indicating that cooperation could be established more readily under harsh conditions (small available exogenous resources). In addition, the whole system could attain higher fitness or drug resistance (see more detailed discussions later) due to the coexistence of both the players. It is well known that many cancer cells have

to confront hypoxia, low pH, low glucose and other severe conditions [53, 54], and they are often found to be more aggressive and dangerous compared to cancer cells under normal growth conditions with access to essential nutrients [55]. These conditions might make it favorable to establish cooperation among them, leading to the formation of heterogeneous populations.

If exogenous resources removed from the system completely ($c_0 = 0$), the +/+ cells dominate the whole population while the -/- cells would be swept away (see the red filled circle in Fig. 3C) at sufficiently high $f_+(0)$. In the opposite limit ($f_+(0)$ is small), the -/- cells can take over the whole population (see the blue filled circle in Fig. 3C). The phenomenon of tragedy of the commons will be observed if the public goods are essential for the survival of non-producers. Taken together these results show that the establishment of cooperation between different players shows strong dependence on environmental conditions. The influences of exogenous public goods as observed in Fig. 3 are consistent with the experimental results [35], and are further discussed below.

Comparison with *in vitro* experiments: Based on the calculations presented so far, we can now obtain the internal equilibrium fractions (f_+^i) of +/+ cells at different concentrations of serum. The experimental observations for f_+^i are given by symbols in the upper panel of Fig. 4. The fractions f_+^s (f_+^{us}) under stable (unstable) internal state are represented by red squares (blue circles). From experimental result (Fig. 1A) in [35] for the equal fitness (≈ 14.4) of producer and non-producer cells and the fraction of +/+ cells approaching 1 for the stable internal state at $c_0 = 0$, we obtain the parameter $b \approx 8$. Our theoretical model with two free parameters a and p_0 fits the experimental results very well (see the solid red and blue lines in the upper panel of Fig. 4). One scale parameter has been used with $c_0 = 1, 2, ...$ corresponding to $3\%, 6\%, ...$ of serum.

To illustrate the stability of the internal equilibrium state, an example is given in the lower panel of Fig. 4, which describes the evolution of the fraction of +/+ cells under different initial conditions ($f_+(0)$). The serum amount is fixed at 3%. It shows clearly that a stable equilibrium state is attained as long as $f_+(0)$ is above f_+^{us}, corresponding to the unstable internal equilibrium state. Then, the two types of cells cooperate leading to coexistence. However, the +/+ cells could be swept out and only -/- cells exist if $f_+(0)$ is below f_+^{us} (see the dotted line in the inset of the lower panel of Fig. 4). From the results in the upper panel of Fig. 4, it follows that there exists a critical concentration c_0^c for exogenous resources (around 7% of serum in the experiment [35]). A bistable system can be reached only if the concentration of serum is lower than c_0^c. One stable state corresponds to a heterogeneous system with two subpopulations and the other one is a homogeneous state consisting of only -/- cells (see Fig. 3B). In this scenario, maintenance of heterogeneous state is due to cooperation between +/+ and -/- cells. In contrast, as the concentration of serum increases beyond c_0^c, the -/- cells can always obtain sufficient resources to support a faster growth rate than +/+ cells (see Fig. 3A). Then, the -/- cell would sweep through the whole population as long as its initial fraction is non-zero. Therefore, competition rather than cooperation is promoted between cell subpopulations under

resource-abundant conditions. It eventually leads to the establishment of a homogeneous system with only a single type of cell population.

Effects of price paid by producers: In previous sections, we established that supply and allocation of public goods play crucial roles in determining the interactions among subpopulations. We investigate the influence of another parameter p_0, the price paid by $+/+$ cells to produce the public goods, which in the AFC experiment is IGF-II. The fitness of producers is affected by this parameter directly (see Eq. (12)), so we anticipate that it will influence the relationship between producers and non-producers.

Just as in Fig. 4, we investigated the internal equilibrium fraction f_+^i of producers as a function of the level of exogenous resources but differing values of p_0. The stable internal equilibrium fraction of producers is represented by the red curves while the blue curves report the unstable internal equilibrium fraction (Fig. 5A). A critical p_0-dependent concentration for exogenous resources is observed in Fig. 4 above which non-producers can maintain a stable homogeneous system irrespective of the fate of the producers. The value of the critical concentration (see the red arrows in Fig. 5A) increases as p_0 decreases. The fitness of producers increases as they pay a much lower price (smaller p_0) for public goods production. Therefore, additional exogenous resources have to be provided to enhance the competitive advantage of non-producers at small p_0. We also observed another critical value (indicated by the star symbols in Fig. 5A) for exogenous resources at relatively small p_0 values. Only stable homogeneous states (consisting of either producers or non-producers) exist if the level of exogenous resources fall below this critical value. Interestingly, it becomes easier for the producer to establish a stable homogeneous system as p_0 decreases. On the other hand, only a small increase of exogenous resources leads to a homogeneous tumor consisting of only non-producers, as p_0 takes on large values (see the dotted line in Fig. 5A).

From Fig. 5A, we obtain the phase diagram in terms of the variables of the exogenous public goods concentration, and the initial fraction $f_+(0)$ of producers. Two examples, shown in Figs. 5B and 5C with $p_0 = 4.65$, and $p_0 = 4.0$, respectively, show the emergence of three stable phases. At low levels of exogenous resources and large $f_+(0)$, a homogeneous phase with only producers (shown in pink color) exists. The second homogeneous phase, with only non-producers (shown in blue color), is easily accessible at high levels of exogenous resources. A heterogeneous phase representing the coexistence of both producer and non-producer cells (purple color) can be attained at intermediate levels of exogenous resources and large $f_+(0)$. By comparing Figs. 5B and 5C, we find that the parameter space for the non-producer to take over the whole system shrinks as p_0 decreases while it increases for the producer to dominate the system. These figures also show that a heterogeneous system might be established easily (within a larger parameter space, comparing the purple region in Figs. 5B and 5C) if the producer pays a relatively high price for public goods production. From these discussions, we conclude that the price p_0 paid by producers greatly influences the state of the tumor, especially the robustness of the heterogeneous state. It appears that one can design better treatment protocols for cancers

composed of different subpopulations by regulation of certain parameters, such as p_0 discussed here.

Cooperation among cancer subpopulations in *in vivo* experiments on glioblastoma: The mechanism of cooperation and feedback described through the replicator equations might be operative in other cancers. In order to illustrate the applicability of our theory, we analyze the origin of ITH in Glioblastoma multiforme (GBM). It is known that GBM is the most common and aggressive primary brain cancer with poor prognosis. The five-year survival rate is less than five percent, and most patients live for only a year following diagnosis and treatment [56]. The extensive presence of ITH in GBM is well-known at the genetic, molecular and cellular levels [57, 58]. As in many other types of cancers, the mechanism for the origin of heterogeneity in GBM remains unclear, which is one reason in the poor design of effective treatment.

It is established [59, 60, 61] that chromosomal amplification of epidermal growth factor receptor gene (EGFR) is present in most cells of many primary GBMs. Another type of cell, showing intragenic rearrangement of EGFR gene (with deletion of exons 2-7) also frequently appear in the same tumor [62]. The coexistence of these two types of cells with differing expressions of the growth factor receptor leads to a worse prognosis of GBM [63, 64] than would be the case when the cell (with EGFR gene rearrangement) is absent.

Recently, an experiment [34] studied the interactions between tumor cells with amplified levels of EGFR (referred to wt cells) and cells with rearrangement of EGFR gene (called Δ cells) within a neoplasm. It is found that the total size of the tumors (after 12 days of orthotopic injection) is much larger if a mixture of wt and Δ cells are injected into one mouse simultaneously than when they are injected into two mice separately. This finding shows that these two types of cells cooperate with each other to promote growth of the tumor. The producer (Δ) cells secretes certain factors like Interleukin-6(IL-6) and/or Leukemia inhibitory factor (LIF), which enhance the proliferation and inhibit apoptosis of tumor cells [34, 65]. The system composed of wt and Δ cells is analogous to the one considered in the previous sections with IL-6 and/or LIF playing the role of the public goods. Therefore, we can apply our theory to investigate the consequence of cooperation between these two cell types in GBM.

In the experiment [34], the evolution of the tumor size was measured over a wide range of conditions. A fixed total number of tumor cells (with differing fractions of wt and Δ cells) are injected into nude mice, and then the increase in the tumor volume is measured after different periods of time (see the inset in Fig. 6). Without Δ cells, it is difficult for the wt cells to induce tumor in nude mice, as illustrated by the pink upside down-triangles. However, the Δ cell alone gives rise to tumors at a rapid growth rate, as illustrated by the blue squares in Fig. 6. As long as a small fraction of Δ cells is injected into the mice together with wt cells, fast growing tumors are induced in mice (see the purple up-triangles in Fig. 6). The tumor grows faster as the fraction of Δ cells in the total injected cells increases from 0, 10, 50, to 90% as shown in the inset of Fig. 6. It is also remarkable that the tumors grow even faster as the injected cells are composed of 10% wt and 90% Δ cells (green spheres) than is

the case when 100% of cells are Δ cells (blue squares), which again shows that cooperation between the two cell types leads to enhanced growth rate.

The experimental observations [34] can be quantitatively explained by the theoretical model developed here. By using the three growth curves (0%, 50%, and 100% Δ cells) for the tumors, illustrated in the upper panel of Fig. 6, we determined all the free parameters needed in the model (see SI for details). Then, the evolution of the tumor size at differing conditions can be predicted. The theoretical predictions for the tumor growth at 10%, and 90% of Δ cells agree quantitatively with experimental observations, as shown in the lower panel of Fig. 6. To further explain the growth curves shown in the inset of Fig. 6, we plotted the growth rate of tumors as a function of the fraction of Δ cells (see the solid red line in Fig. 7). The growth rates for wt, Δ cells in the tumor are illustrated by dotted and dashed lines in Fig. 7, respectively. From this figure, it follows that the tumor growth rate increases as the fraction of Δ cells increases, reaching a maximum value in the middle (0.77, marked by the orange arrow). Subsequently, the rate starts to decrease. This behavior is similar to the experimental data in the inset of Fig. 6 and is also found for pancreatic cancer cells, as discussed here and discovered by AFC [35].

We also found that the glioblastoma with ITH is quite stable irrespective of the initial composition (see Fig. S5A). Our results explain the finding that frequently the wt cells and Δ cells coexist in GBM, and provides an explanation for the poor prognosis due to the quick recovery of the fast growing state as long as a small fraction f_+ of Δ cells is present. Therefore, the stability of such a heterogeneous tumor needs to be eliminated in order to improve the survival rates of GBM patients. From the discussion above, it follows that the supply of exogenous pubic goods can influence cooperation between two different populations sharing one public good. By adding exogenous cytokines to the model (see Eqs. (S.7) and (S.8) in SI), a stable homogeneous system composed of only wt cells could be reached (see Fig. S5B) irrespective of the initial fraction of the producer, Δ cells. Such a tumor would stop growing after removal of exogenous cytokines as wt cells alone cannot sustain tumor growth, as observed in experiments [34]. If practice, this might provide a treatment strategy for GBM, and perhaps other types of cancers dominated by ITH due to the interactions among different cancer cells.

Discussion

In this article, we investigated the interactions between two distinct subpopulations frequently observed in many cancers, which is a manifestation of heterogeneity. We uncovered a general mechanism for the establishment of a stable heterogeneous system consisting of producers and non-producer cells as a function of a number of experimentally controllable parameters. The tragedy of the commons would be expected as the public goods are shared equally among both the populations. However, a stable heterogeneous state arises if the producer can obtain the public goods more efficiently than the non-producer. Most im-

portantly, the emergence of these scenarios require the fitness of the two players must be a non-linear function of the public goods. Otherwise, only an unstable heterogeneous system can be established. In addition, the cost to benefit ratio is a critical factor in determining the establishment of a stable coexisting state. In the experiments [35], the benefit is adjusted by changing the amount of serum while the cost of public good production is a constant. However, Archetti et al changed the cost instead of benefit to study the cooperation and competition of the two types of cells in their model. This is due to the complex payoff function assumed in the AFC model. In our model, the benefit of public goods is separated into two parts (endogenous and exogenous) naturally, while the cost is a constant. Therefore, we can investigate the influence of benefits on the cell cooperation and competition directly, as realized in experiments. In addition, our formulation is sufficiently general that we could test the effects of all other experimentally accessible parameters in order to assess the ranges of parameters that produce coexistence between producer and non-producer cells, as illustrated for the specific case in Fig. 5B.

We also found that it is relatively easy to establish cooperation and form a stable diversified or heterogeneous state in harsh conditions than in resource-abundant conditions. Such a phenomenon is quite common in biological systems [66, 67]. The price paid by the producers also strongly influences the cooperation between the two players. Higher price can decrease the demand for exogenous resources in order to establish cooperation and might also expand cooperation to a wide parameter range.

Frequently in many cancers a minor subclone could support the growth of the whole tumor consisting of many different subpopulations [25, 26, 27]. It is easy to detect the genotype of dominant subclones, which would be considered as the target in later treatments. However, if a minor subclone escapes detection then it could survive, promoting a faster and more aggressive tumor growth caused by the competitive release [68]. Therefore, it is essential to learn the composition of a heterogeneous tumor, and also the interactions among different subclones before efficacious treatment can be formulated for the patients.

For cancers with producer and non-producer cells discussed here, it might be prudent to feed these cells instead of depriving them of nutrients so that competition between different subclones is promoted. Then, an effective treatment can be implemented as the system transits from a stable heterogeneous population to a homogeneous population. We have illustrated this concept using an experiment involving glioblastoma. This idea is reminiscent of another concept in cancer therapy, the tumor vasculature normalization [69]. The tumor vasculature is quite abnormal, which leads to heterogeneous tumor blood flow. Therefore, many tumor cells cannot get access to blood vessels and live under pressure such as hypoxia and acidosis, thus inducing genome instability and high intratumor heterogeneity [70]. Temporal normalization of tumor vasculature can reduce the microenvironment pressure on tumor cells and also increase the drug delivery efficiency. Hence, it can increase the conventional therapy efficacy if both procedures are scheduled carefully [69]. Similarly, the new idea proposed here could be combined with traditional therapies, such as

surgery and chemotherapy, to reduce the risk and drug resistance but increase the therapy efficacy. In addition, similar public goods dilemma has been observed in many systems, such as microbial colonies, insect communities, and human society [71, 72, 73]. The mechanism proposed here for the establishment of a heterogeneous population is quite general, and could in principle be applied to these systems. It will be most interesting to extend our model to the case beyond two species, which is more prevalent in nature [74]. It would be fruitful to consider different mechanisms of ITH in order to account for complex origins of ITH [12].

SUPPLEMENTAL INFORMATION

Supplemental Information including five figures and detailed methods can be found with this article online.

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AUTHOR CONTRIBUTIONS

X. L. and D. T. conceived and designed the project, and co-wrote the paper. X. L. performed the research.

Competing interests

We declare we have no competing interests.

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References

[1] Gerlinger M, McGranahan N, Dewhurst SM, Burrell RA, Tomlinson I, Swanton C. Cancer: evolution within a lifetime. Annual review of genetics. 2014;48:215–236. (DOI: 10.1146/annurev–genet–120213–092314).

[2] Nowell PC. The clonal evolution of tumor cell populations. Science. 1976;194(4260):23–28. (DOI: 10.1126/science.959840).

[3] Vogelstein B, Papadopoulos N, Velculescu VE, Zhou S, Diaz LA, Kinzler KW. Cancer genome landscapes. Science. 2013;339(6127):1546–1558. (DOI: 10.1126/science.1235122).

[4] Gerlinger M, Rowan AJ, Horswell S, Larkin J, Endesfelder D, Gronroos E, et al. Intratumor heterogeneity and branched evolution revealed by multire-

gion sequencing. New England journal of medicine. 2012;366(10):883–892. (DOI: 10.1056/NEJMoa1113205).

[5] Sottoriva A, Spiteri I, Piccirillo SG, Touloumis A, Collins VP, Marioni JC, et al. Intratumor heterogeneity in human glioblastoma reflects cancer evolutionary dynamics. Proceedings of the National Academy of Sciences. 2013;110(10):4009–4014. (DOI: 10.1073/pnas.1219747110).

[6] Bashashati A, Ha G, Tone A, Ding J, Prentice LM, Roth A, et al. Distinct evolutionary trajectories of primary high-grade serous ovarian cancers revealed through spatial mutational profiling. The Journal of Pathology. 2013;231(1):21–34. (DOI: 10.1002/path.4230).

[7] Gerlinger M, Horswell S, Larkin J, Rowan AJ, Salm MP, Varela I, et al. Genomic architecture and evolution of clear cell renal cell carcinomas defined by multiregion sequencing. Nature Genetics. 2014;46(3):225–233. (DOI: 10.1038/ng.2891).

[8] de Bruin EC, McGranahan N, Mitter R, Salm M, Wedge DC, Yates L, et al. Spatial and temporal diversity in genomic instability processes defines lung cancer evolution. Science. 2014;346(6206):251–256. (DOI: 10.1126/science.1253462).

[9] Yates LR, Gerstung M, Knappskog S, Desmedt C, Gundem G, Van Loo P, et al. Subclonal diversification of primary breast cancer revealed by multiregion sequencing. Nature Medicine. 2015;21(7):751–759. (DOI: 10.1038/nm.3886).

[10] Boutros PC, Fraser M, Harding NJ, De Borja R, Trudel D, Lalonde E, et al. Spatial genomic heterogeneity within localized, multifocal prostate cancer. Nature genetics. 2015;47(7):736–745. (DOI: 10.1038/ng.3315.).

[11] Ling S, Hu Z, Yang Z, Yang F, Li Y, Lin P, et al. Extremely high genetic diversity in a single tumor points to prevalence of non-Darwinian cell evolution. Proceedings of the National Academy of Sciences. 2015;112(47):E6496–E6505. (DOI: 10.1073/pnas. 1519556112).

[12] Almendro V, Marusyk A, Polyak K. Cellular heterogeneity and molecular evolution in cancer. Annual Review of Pathology: Mechanisms of Disease. 2013;8:277–302. (DOI: 10.1146/annurev–pathol–020712–163923).

[13] Bedard PL, Hansen AR, Ratain MJ, Siu LL. Tumour heterogeneity in the clinic. Nature. 2013;501(7467):355–364. (DOI: 10.1038/nature12627).

[14] Zhang J, Fujimoto J, Zhang J, Wedge DC, Song X, Zhang J, et al. Intratumor heterogeneity in localized lung adenocarcinomas delineated by multiregion sequencing. Science. 2014;346(6206):256–259. (DOI: 10.1126/science.1256930).

[15] Snuderl M, Fazlollahi L, Le LP, Nitta M, Zhelyazkova BH, Davidson CJ, et al. Mosaic amplification of multiple receptor tyrosine kinase genes in glioblastoma. Cancer Cell. 2011;20(6):810–817. (DOI: 10.1016/j.ccr.2011.11.005).

[16] Szerlip NJ, Pedraza A, Chakravarty D, Azim M, McGuire J, Fang Y, et al. Intratumoral heterogeneity of receptor tyrosine kinases EGFR and PDGFRA amplification in glioblastoma defines subpopulations with distinct growth factor response. Proceedings of the National Academy of Sciences. 2012;109(8):3041–3046. (DOI: 10.1073/pnas.1114033109).

[17] Liotta LA, Kohn EC. The microenvironment of the tumour–host interface. Nature. 2001;411(6835):375–379. (DOI:10.1038/35077241).

[18] Allinen M, Beroukhim R, Cai L, Brennan C, Lahti-Domenici J, Huang H, et al. Molecular characterization of the tumor microenvironment in breast cancer. Cancer cell. 2004;6(1):17–32. (DOI: 10.1016/j.ccr.2004.06.010).

[19] Bhowmick NA, Neilson EG, Moses HL. Stromal fibroblasts in cancer initiation and progression. Nature. 2004;432(7015):332–337. (DOI: 10.1038/nature03096).

[20] Malmi-Kakkada AN, Li X, Samanta HS, Sinha S, Thirumalai D. Cell growth rate dictates the onset of glass to fluid-like transition and long time super-diffusion in an evolving cell colony. Physical Review X. 2018;8(2):021025. (DOI: 10.1103/PhysRevX.8.021025).

[21] Cleary AS, Leonard TL, Gestl SA, Gunther EJ. Tumour cell heterogeneity maintained by cooperating subclones in Wnt-driven mammary cancers. Nature. 2014;508(7494):113–117. (DOI: 10.1038/nature13187).

[22] Marusyk A, Tabassum DP, Altrock PM, Almendro V, Michor F, Polyak K. Non-cell-autonomous driving of tumour growth supports sub-clonal heterogeneity. Nature. 2014;514(7520):54–58. (DOI: 10.1038/nature13556).

[23] Chapman A, del Ama LF, Ferguson J, Kamarashev J, Wellbrock C, Hurlstone A. Heterogeneous tumor subpopulations cooperate to drive invasion. Cell reports. 2014;8(3):688–695. (DOI: 10.1016/j.celrep.2014.06.045).

[24] Aceto N, Bardia A, Miyamoto DT, Donaldson MC, Wittner BS, Spencer JA, et al. Circulating tumor cell clusters are oligoclonal precursors of breast cancer metastasis. Cell. 2014;158(5):1110–1122. (DOI: 10.1016/j.cell.2014.07.013).

[25] Mullighan CG, Phillips LA, Su X, Ma J, Miller CB, Shurtleff SA, et al. Genomic analysis of the clonal origins of relapsed acute lymphoblastic leukemia. Science. 2008;322(5906):1377–1380. (DOI: 10.1126/science.1164266).

[26] Johnson BE, Mazor T, Hong C, Barnes M, Aihara K, McLean CY, et al. Mutational analysis reveals the origin and therapy-driven evolution of recurrent glioma. Science. 2014;343(6167):189–193. (DOI: 10.1126/science.1239947).

[27] Morrissy AS, Garzia L, Shih DJ, Zuyderduyn S, Huang X, Skowron P, et al. Divergent clonal selection dominates medulloblastoma at recurrence. Nature. 2016;529(7586):351–357. (DOI: 10.1038/nature16478).

[28] Boucher DH, James S, Keeler KH. The ecology of mutualism. Annual Review of Ecology and Systematics. 1982;13(1):315–347. (DOI: 10.1146/annurev.es.13.110182.001531).

[29] Menon R, Korolev KS. Public good diffusion limits microbial mutualism. Physical review letters. 2015;114(16):168102. (DOI: 10.1103/PhysRevLett.114.168102).

[30] Zhou X, Franklin RA, Adler M, Jacox JB, Bailis W, Shyer JA, et al. Circuit design features of a stable two-cell system. Cell. 2018;172(4):744–757. (DOI: 10.1016/j.cell.2018.01.015).

[31] Wang RW, Sun BF, Zheng Q, Shi L, Zhu L. Asymmetric interaction and indeterminate fitness correlation between cooperative partners in the fig–fig wasp mutualism. Journal of the Royal Society Interface. 2011;8(63):1487–1496, (DOI: 10.1098/rsif.2011.0063).

[32] Axelrod R, Axelrod DE, Pienta KJ. Evolution of cooperation among tumor cells. Proceedings of the National Academy of Sciences. 2006;103(36):13474–13479. (DOI: 10.1073/pnas.0606053103).

[33] Merlo LM, Pepper JW, Reid BJ, Maley CC. Cancer as an evolutionary and ecological process. Nature Reviews Cancer. 2006;6(12):924–935. (DOI: 10.1038/nrc2013).

[34] Maria-del Mar I, Bonavia R, Mukasa A, Narita Y, Sah DW, Vandenberg S, et al. Tumor heterogeneity is an active process maintained by a mutant EGFR-induced cytokine circuit in glioblastoma. Genes and Development. 2010;24(16):1731–1745. (DOI: 10.1101/gad.1890510).

[35] Archetti M, Ferraro DA, Christofori G. Heterogeneity for IGF-II production maintained by public goods dynamics in neuroendocrine pancreatic cancer. Proceedings of the National Academy of Sciences. 2015;112(6):1833–1838. (DOI: 10.1073/pnas.1414653112).

[36] Hofbauer J, Sigmund K. Evolutionary games and population dynamics. Cambridge university press; 1998.

[37] Hauert C, Holmes M, Doebeli M. Evolutionary games and population dynamics: maintenance of cooperation in public goods games. Proceedings of the Royal Society of London B: Biological Sciences. 2006;273(1600):2565–2570. (DOI: 10.1098/rspb.2006.3600).

[38] Nowak MA. Five rules for the evolution of cooperation. Science. 2006;314(5805):1560–1563. (DOI: 10.1126/science.1133755).

[39] Allen B, Gore J, Nowak MA. Spatial dilemmas of diffusible public goods. Elife. 2013;2:e01169. (DOI: 10.7554/eLife.01169).

[40] Nanda M, Durrett R. Spatial evolutionary games with weak selection. Proceedings of the National Academy of Sciences. 2017;114(23):6046–6051. (DOI: 10.1073/pnas.1620852114).

[41] Bauer M, Frey E. Multiple scales in metapopulations of public goods producers. Physical Review E. 2018;97(4):042307. (DOI: 10.1103/PhysRevE.97.042307).

[42] Blythe RA, McKane AJ. Stochastic models of evolution in genetics, ecology and linguistics. Journal of Statistical Mechanics: Theory and Experiment. 2007;2007(07):P07018. (DOI: 10.1088/1742–5468/2007/07/P07018).

[43] Melbinger A, Cremer J, Frey E. Evolutionary game theory in growing populations. Physical Review Letters. 2010;105(17):178101. (DOI: 10.1103/PhysRevLett.105.178101).

[44] Hardin G. The tragedy of the commons. Science. 1968;162(3859):1243–1248. (DOI: 10.1126/science.162.3859.1243).

[45] Chesson P. Mechanisms of maintenance of species diversity. Annual review of Ecology and Systematics. 2000;31(1):343–366. (DOI: 10.1146/annurev.ecolsys.31.1.343).

[46] Hauert C, Michor F, Nowak MA, Doebeli M. Synergy and discounting of cooperation in social dilemmas. Journal of theoretical biology. 2006;239(2):195–202. (DOI: 10.1016/j.jtbi.2005.08.040).

[47] Archetti M. Dynamics of growth factor production in monolayers of cancer cells and evolution of resistance to anticancer therapies. Evolutionary applications. 2013;6(8):1146–1159. (DOI: 10.1111/eva.12092).

[48] Kimmel GJ, Gerlee P, Brown JS, Altrock PM. Neighborhood size-effects in nonlinear public goods games. bioRxiv. 2018;p. 347401. (DOI: 10.1101/347401).

[49] Christofori G, Naik P, Hanahan D. A second signal supplied by insulin-like growth factor II in oncogene-induced tumorigenesis. Nature. 1994;369(6479):414–418. (DOI: 10.1038/369414a0).

[50] Pollak M. Insulin and insulin-like growth factor signalling in neoplasia. Nature Reviews Cancer. 2008;8(12):915–928. (DOI: 10.1038/nrc2536).

[51] Gerlee P, Altrock PM. Complexity and stability in growing cancer cell populations. Proceedings of the National Academy of Sciences. 2015;112(21):E2742–E2743. (DOI: 10.1073/pnas.1505115112).

[52] Ayala FJ, Campbell CA. Frequency-dependent selection. Annual review of Ecology and systematics. 1974;5(1):115–138. (DOI: 10.1146/annurev.es.05.110174.000555).

[53] Harris AL. Hypoxia–a key regulatory factor in tumour growth. Nature Reviews Cancer. 2002;2(1):38–47. (DOI: 10.1038/nrc704).

[54] Kato Y, Ozawa S, Miyamoto C, Maehata Y, Suzuki A, Maeda T, et al. Acidic extracellular microenvironment and cancer. Cancer Cell International. 2013;13(1):89. (DOI: 10.1186/1475–2867–13–89).

[55] Gupta GP, Massagué J. Cancer metastasis: building a framework. Cell. 2006;127(4):679–695. (DOI: 10.1016/j.cell.2006.11.001).

[56] Gallego O. Nonsurgical treatment of recurrent glioblastoma. Current oncology. 2015;22(4):e273–281. (DOI: 10.3747/co.22.2436).

[57] Jung V, Romeike BF, Henn W, Feiden W, Moringlane JR, Zang KD, et al. Evidence of focal genetic microheterogeneity in glioblastoma multiforme by area-specific CGH on microdissected tumor cells. Journal of Neuropathology and Experimental Neurology. 1999;58(9):993–999. (DOI: 10.1097/00005072–199909000–00009).

[58] Bonavia R, Cavenee WK, Furnari FB, et al. Heterogeneity maintenance in glioblastoma: a social network. Cancer Research. 2011;71(12):4055–4060. (DOI: 10.1158/0008–5472.CAN–11–0153).

[59] Hurt MR, Moossy J, Donovan-Peluso M, Locker J. Amplification of epidermal growth factor receptor gene in gliomas: histopathology and prognosis. Journal of Neuropathology and Experimental Neurology. 1992;51(1):84–90. (DOI: 10.1097/00005072–199201000–00010).

[60] Jaros E, Perry R, Adam L, Kelly P, Crawford P, Kalbag R, et al. Prognostic implications of p53 protein, epidermal growth factor receptor, and Ki-67 labelling in brain tumours. British Journal of Cancer. 1992;66(2):373–385. (DOI: 10.1038/bjc.1992.273).

[61] Schlegel J, Merdes A, Stumm G, Albert FK, Forsting M, Hynes N, et al. Amplification of the epidermal-growth-factor-receptor gene correlates with different growth behaviour in human glioblastoma. International Journal of Cancer. 1994;56(1):72–77. (DOI: 10.1002/ijc.2910560114).

[62] Nishikawa R, Ji XD, Harmon RC, Lazar CS, Gill GN, Cavenee WK, et al. A mutant epidermal growth factor receptor common in human glioma confers enhanced tumorigenicity. Proceedings of the National Academy of Sciences. 1994;91(16):7727–7731. (DOI: 10.1073/pnas.91.16.7727).

[63] Shinojima N, Tada K, Shiraishi S, Kamiryo T, Kochi M, Nakamura H, et al. Prognostic value of epidermal growth factor receptor in patients with glioblastoma multiforme. Cancer Research. 2003;63(20):6962–6970.

[64] Heimberger AB, Hlatky R, Suki D, Yang D, Weinberg J, Gilbert M, et al. Prognostic effect of epidermal growth factor receptor and EGFRvIII in glioblastoma multiforme patients. Clinical Cancer Research. 2005;11(4):1462–1466. (DOI: 10.1158/1078–0432.CCR–04–1737).

[65] Heinrich PC, Behrmann I, Serge H, Hermanns HM, Müller-Newen G, Schaper F. Principles of interleukin (IL)-6-type cytokine signalling and its regulation. Biochemical Journal. 2003;374(1):1–20. (DOI: 10.1042/BJ20030407).

[66] Korolev KS, Xavier JB, Gore J. Turning ecology and evolution against cancer. Nature Reviews Cancer. 2014;14(5):371–380. (DOI: 10.1038/nrc3712).

[67] Hoek TA, Axelrod K, Biancalani T, Yurtsev EA, Liu J, Gore J. Resource availability modulates the cooperative and competitive nature of a microbial cross-feeding mutualism. PLoS Biology. 2016;14(8):e1002540. (DOI: 10.1371/journal.pbio.1002540).

[68] Greaves M, Maley CC. Clonal evolution in cancer. Nature. 2012;481(7381):306–313. (DOI: 10.1038/nature10762).

[69] Jain RK. Normalization of tumor vasculature: an emerging concept in antiangiogenic therapy. Science. 2005;307(5706):58–62. (DOI: 10.1126/science.1104819).

[70] Bristow RG, Hill RP. Hypoxia and metabolism: hypoxia, DNA repair and genetic instability. Nature Reviews Cancer. 2008;8(3):180–192. (DOI: 10.1038/nrc2344).

[71] Dobata S, Tsuji K. Public goods dilemma in asexual ant societies. Proceedings of the National Academy of Sciences. 2013;110(40):16056–16060. (DOI: 10.1073/pnas.1309010110).

[72] Drescher K, Nadell CD, Stone HA, Wingreen NS, Bassler BL. Solutions to the public goods dilemma in bacterial biofilms. Current Biology. 2014;24(1):50–55. (DOI: 10.1016/j.cub.2013.10.030).

[73] Kaul I, Grungberg I, Stern MA. Global Public Goods: International Cooperation in the 21st Century. Oxford University Press New York; 1999.

[74] Levine JM, Bascompte J, Adler PB, Allesina S. Beyond pairwise mechanisms of species coexistence in complex communities. Nature. 2017;546(7656):56–64. (DOI; 10.1038/nature22898).

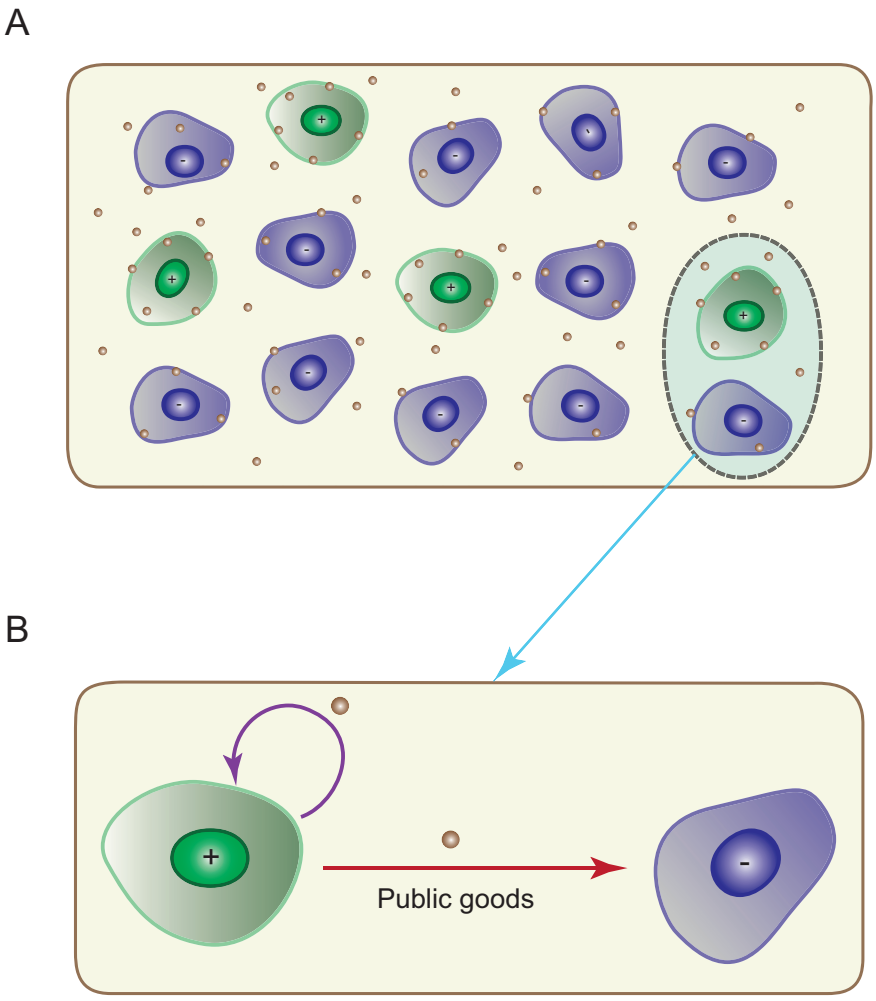

Figure 1: **Illustration of public goods game.** (A) The public goods (small brown circles) generated by producers ("+" agents in green) are shared unequally between producers and non-producers ("-" agents in blue color). Both producers and non-producers benefit from the presence of the public goods, which promote proliferation or survival of these agents. The public goods can also be supplied from exogenous resources. (B) A zoom-in of the dashed line oval in Fig. 1A to illustrate the public goods dependent circuit for the producer and non-producer. Coexistence of the two cell types requires feedback (purple line) and unequal sharing of the public goods.

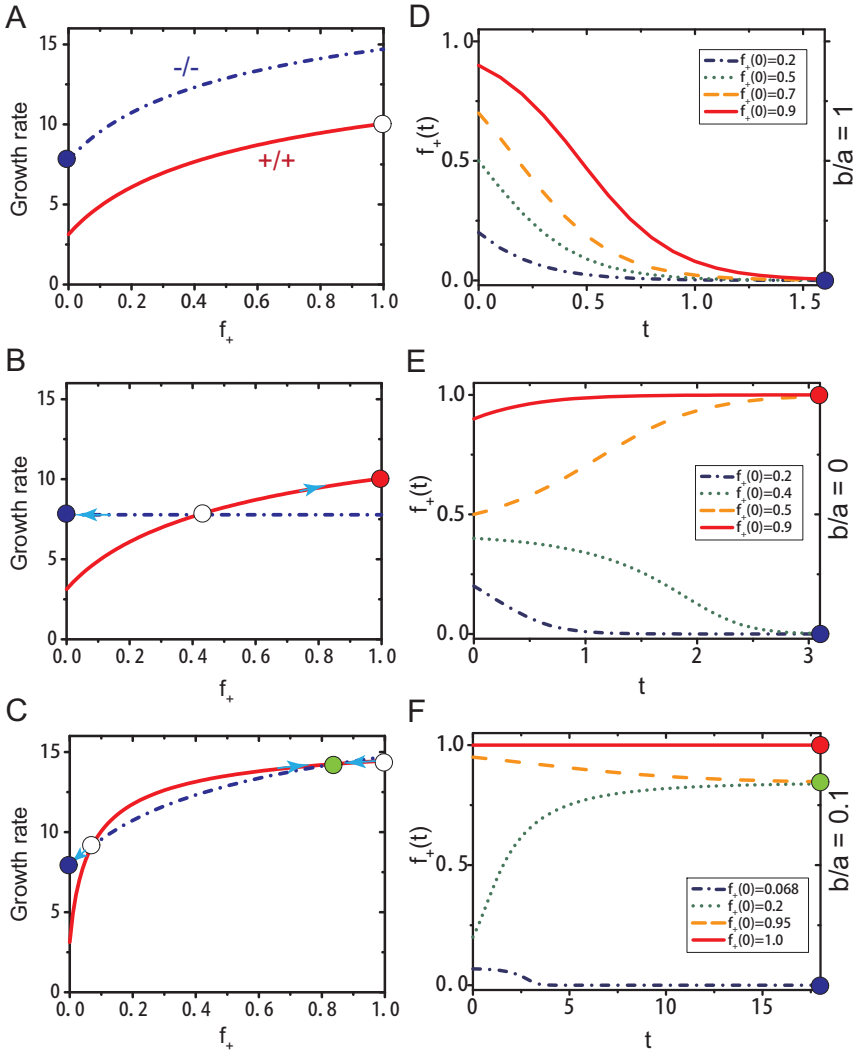

Figure 2: (A)-(C): Growth rates of +/+ and -/- cells as a function of the fraction (f_+) of +/+ cells under different allocation of IGF-II produced by the +/+ cells. (A) Equal share of IGF-II ($b = a = 8$), (B) no share ($b = 0$, and $a = 8$), (C) a small portion ($b = 8$, and $a = 80$) is allocated to -/- cells. The value of $c_0 = 1$ and $p_0 = 4.65$ in Eq. (12) are derived from fitting the equilibrium fractions of +/+ cells observed in experiments using our model. The growth rate of +/+ cells are shown in solid red lines while dash-dotted blue lines describe the growth rate of -/- cells. The filled and empty circles indicate a stable or unstable fixed point, respectively. A stable state consisting of only +/+ (-/-) cells is indicated in red (blue) color. The green filled circle shows a stable heterogeneous state representing coexistence of the two cell types. (D)-(F): The evolution of $f_+(t)$ at different $f_+(t = 0)$ values corresponding to the allocation strategies of IGF-II in (A)-(C). Each row represents results from one of the three allocation strategies. The growth rate is defined as the relative density change of cells during the log phase [35]. The unit for time is days.

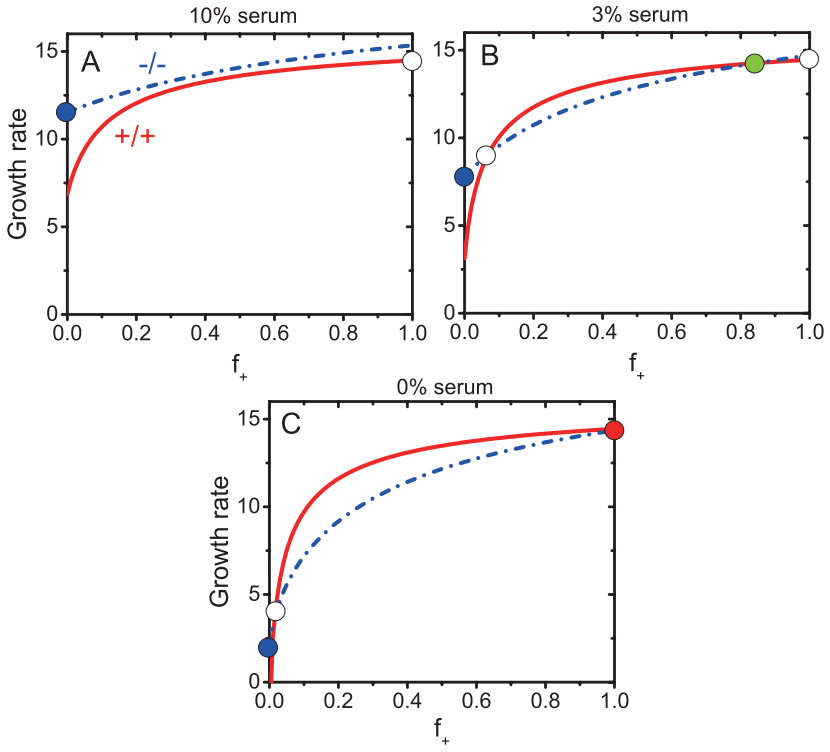

Figure 3: Growth rates of +/+ and -/- cells as a function of the fraction (f_+) of +/+ cells at different levels of exogenous resources (serum). (A) $c_0 = 3.3$ corresponds to 10% serum in experiments; (B) $c_0 = 1$ represents 3% serum; (C) $c_0 = 0$ implies absence of serum. The value of $a = 80, b = 8$, and $p_0 = 4.65$, corresponding to the parameters in Fig. 2C. The flow diagram in Fig. 3B corresponds to Fig. 2C. The meaning of the symbols used and the definition of growth rate are the same as in Fig. 2.

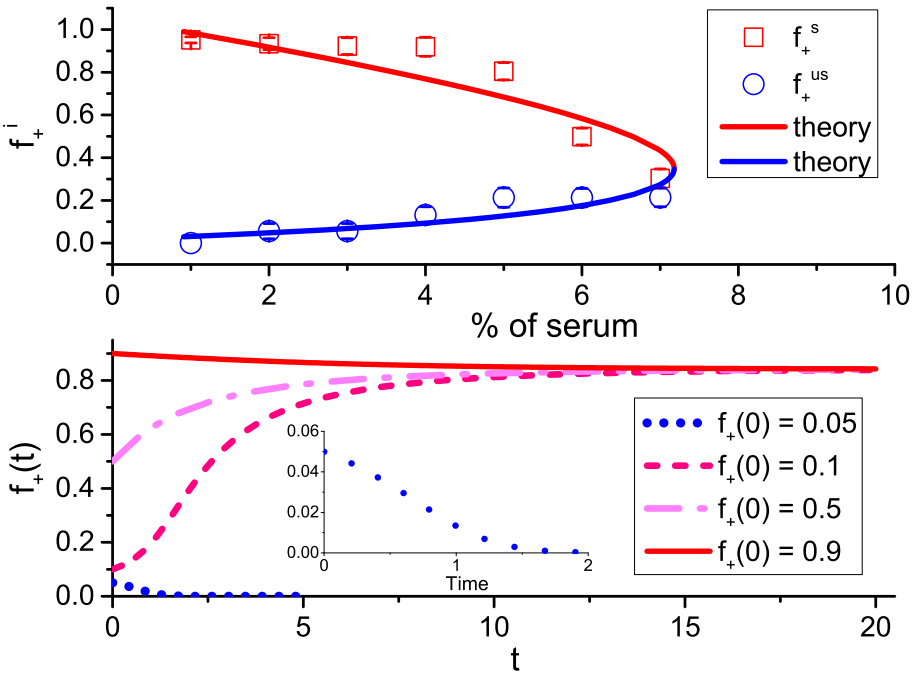

Figure 4: Upper panel: The internal equilibrium fractions (f_+^i, $i \equiv s$ or us, with s for stable and us for unstable state) of +/+ cells as a function of serum levels. Stable states are shown by red squares while blue circles indicate unstable states. The upper and lower bounds represent the upper and lower boundaries for the equilibrium fractions observed in experiments and the symbols give the middle value of these two boundaries. The solid lines correspond to theoretical predictions using $a = 80$, and $p_0 = 4.65$ in Eqs. (12) and (13). Lower panel: Theoretical predictions for the time-dependent changes in the fraction $f_+(t)$ of +/+ cells for various initial conditions ($f_+(0) = 0.05,\ 0.1,\ 0.5,\ 0.9$) in the presence of 3% of serum. The inset figure shows the evolution of the fraction of +/+ cell with $f_+(0) = 0.05$. The unit for time is days.

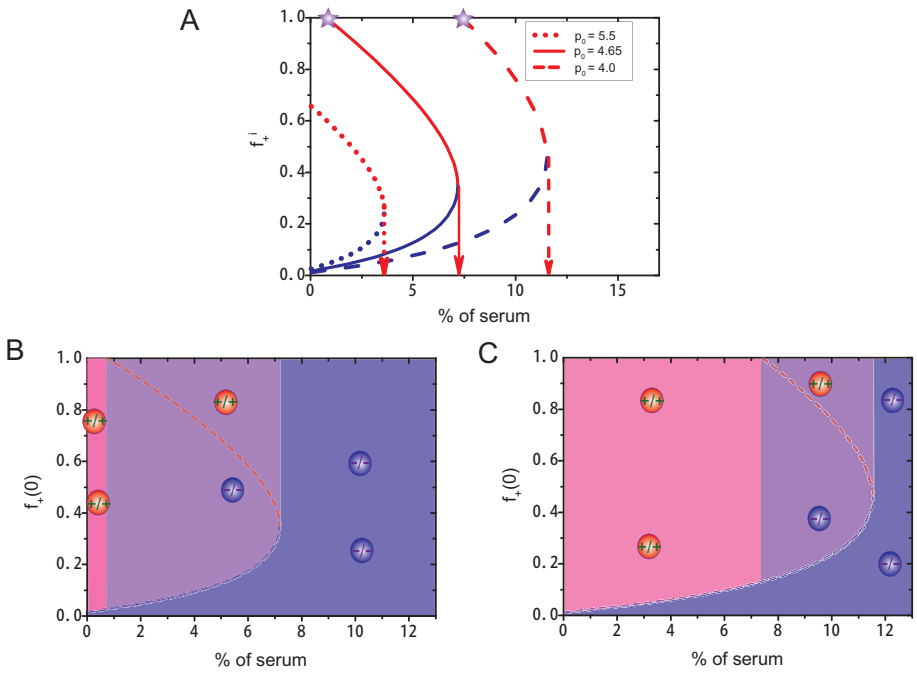

Figure 5: (A) The internal equilibrium fractions (f_+^i, $i \equiv s, us$) of producers as a function of the levels of serum for different p_0 values. The fraction (f_+^s) at stable equilibrium are shown in red color while blue color indicates unstable equilibrium fractions (f_+^{us}). Arrows give the critical level of serum above which only non-producers exist. Purple stars represent the lowest level of serum at which producers and non-producers coexist in a stable equilibrium state. (B) and (C) Phase diagrams (initial fraction $f_+(0)$ vs % of serum) with p_0= 4.65 and p_0 = 4.00, respectively. Three stable phases are shown in these two figures. i) A homogeneous phase consisting of only producers (pink color). ii) A heterogeneous phase consisting of both producers and non-producers (purple color). The stable equilibrium fraction of producers is indicated by the dashed red line. iii) A homogeneous phase with of only non-producers (blue color). The red and blue circles represent the producer and non-producer cells, respectively. Remarkably, for both p_0 values +/+ and -/- cells coexist in a narrow range of % of serum.

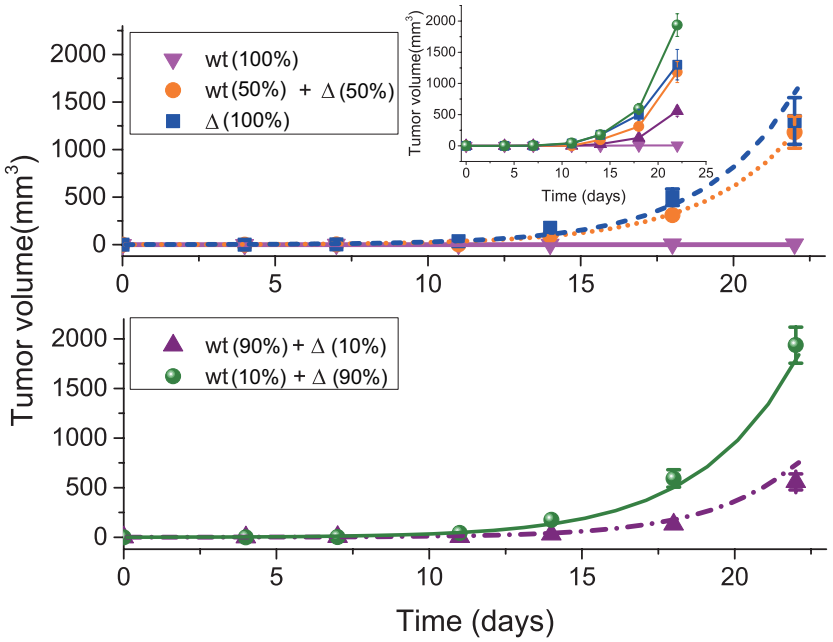

Figure 6: The evolution of tumor size as a function of time (in days) in glioblastoma with only wt cells, mutated Δ cells, or mixture of these two types of cells (wt $+\Delta$) injected into nude mice. The symbols represent experimental data. The parameter values ($a = 68.4, b = 0.946$ and $p_0 = 0.651$) in the model are obtained by fitting the theory to experimental data (details in the SI) with 100% wt, 100% Δ and 50% for each type of cells (upper panel). Lower panel: The purple and green curves are theoretical predictions with 10%, and 90% of Δ cells, which both agree quantitatively with experimental observations. Error bars represent the standard error of the mean in experiments. The complete experimental data are shown in the inset (the labels are the same as in the main figure).

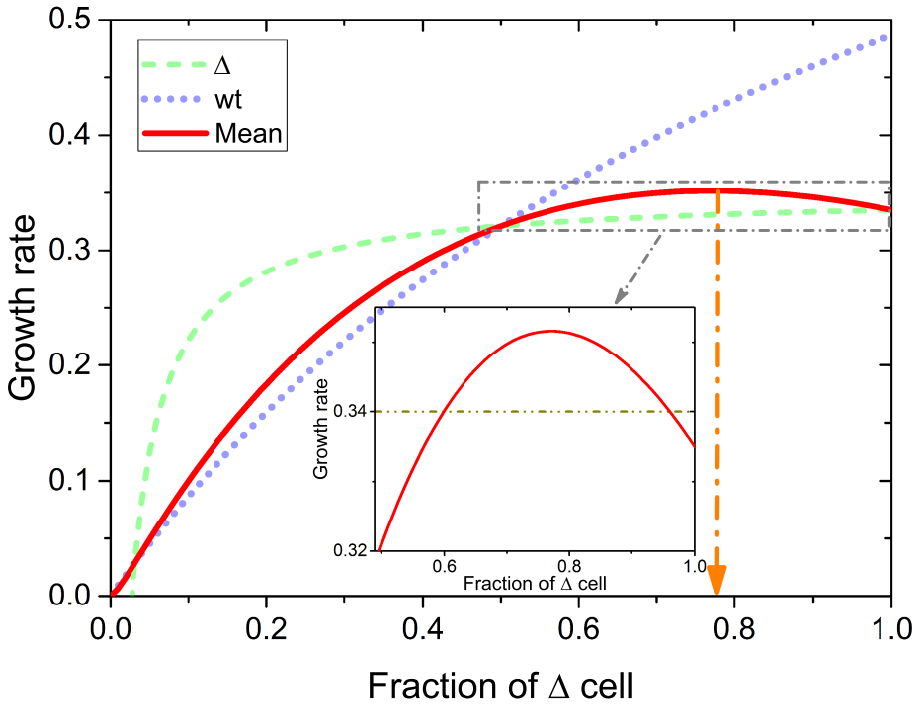

Figure 7: Predictions of the mean growth rate of the GBM tumor cells as a function of the fraction of the Δ cell. The green dashed line gives the growth rate of Δ cells, and the purple dotted line shows the rate of wt cells. The average growth rate of the whole population with both types of cells are given by solid red line. A maximum is observed at a value $f_+ \approx 0.77$ (the orange arrow). The inset shows a zoom-in of the dash-dotted line rectangle. The values for the parameters a, b, and p_0 in this figure are the same as the ones used in Fig. 6. The unit for growth rate is day^{-1}.