Dear Editor,

please find enclosed the new version of the manuscript "Active particles driven by competing spatially dependent self-propulsion and external force" authored by L. Caprini, U. Marini Bettolo Marconi, R. Wittmann and H. Löwen.

We are glad that two of the three reviewers considered our paper suitable for publication, raised very positive judgments on our paper and encouraged us to reply and resubmit in SciPost despite the negative comments of one of the three reviewers. In the new version of the manuscript, we have accounted for the comments of the three reviewers in order to clarify the main concerns of the second reviewer.

The text has been amended according to the recommendations of the referees and the relevant changes have been highlighted in red for a faster check.

Before providing below a point-by-point reply to all individual remarks of the reviewers, let us briefly elaborate on our main points:

- We acknowledge that the second referee has a good point that there exists a mapping to an effective system that essentially does not contain a multiplicative noise, which in our case represents the swim-velocity field. This mapping is mathematically valid and, indeed, we have implicitly used it to derive our approximate theory. Anyway, through this mapping the system still cannot be solved analytically (in contrast to the system in Ref. [84]) and, thus, does not add clear insight to the problem that still requires a numerical evaluation or analytical approximations. To this end, we added a short description of the new Ref. [84] and a new appendix C which explains in detail that the analytical methods (which we push forward in appendix B) actually rely on this mapping (a point which was not clearly stated in the previous version of the manuscript).
- We do, however, strongly contradict the conclusion drawn by the second reviewer from the existence of the aforementioned mapping, because it simply provides an alternative description that does not change the physics at hand. The explicit dependence of the actual position and velocity of our AOUP on the swim-velocity field (the multiplicative noise) is now hidden in the effective coordinate of the mapped system and needs to be accounted for when interpreting the results in a physical context (through explicitly transforming back to the original coordinates). As a further example to support our argument, we note that the same argumentation can be used to justify the statement that all systems with a multiplicative (white) noise are nothing more than ordinary Brownian motion.
- In particular, being reassured by consulting experimentalists, we also insist on the point that combining a periodic swim velocity with a harmonic trap is experimentally easier accessible than generating a complicated and highly modulating external potential. This conclusion has also been rephrased for more clarity.
- Regarding the existence of two theories for AOUPs with space-dependent swim speed: we do not claim that our theory is superior (as one might have gotten the impression due to our previous modifications asked for in the review process). Both theories are valid in their own right and we chose the one which suits the class of experiments we want to describe (and for which the interplay of two distinct fields should in fact be

advantageous). Irrespective of this point, neither of these theories have been used to study the effect of an additional external force. For this reason, we think that the existence of two similar theories for space-dependent activity does not affect the originality of the present manuscript.

Given the positive judgment of the other two referees, we think that these clarifications together with the final modifications of the manuscript are convincing that our work is now suitable for publication in SciPost.

Our best regards.

Lorenzo Caprini, Umberto Marini Bettolo Marconi, René Wittmann, Hartmut Löwen.

## Reply to Reviewer #1

I thank the authors for their careful consideration of my comments and for modifying their manuscript accordingly. From my side, the authors have satisfactorily addressed all my concerns.

I have read the discussion between the authors and the second referee. The first main concern of the referee is that the dynamics of the AOUP with both a confining potential and a spatially-varying self-propulsion velocity can be mapped, under a change of variable, unto a dynamics with fixed self-propulsion velocity and an effective force field. The second main concern is the experimental relevance of using both a confining potential and a space-dependent self-propulsion velocity.

**Reply**: We thank the referee for his/her careful reading of both the manuscript and the correspondence between us and the second referee.

Given that the mapping proposed by the referee is rather convoluted, one could argue that the specific study of the interaction between an external potential and a varying self-propulsion velocity is relevant if there exist experimental realisations of these. I would suggest the authors to insist on this point.

**Reply**: We thank the present referee for the above suggestion, on which we agree: The change of variables presented by the second referee is indeed rather convoluted such that it hinders the physical meaning of the variables. For instance, the new variable  $\tilde{x} = G(x) = \int_1^x 1/u(s)ds$  does not correspond to any intuitive physical variable,  $\tilde{x}$  being not to the position of the particle. After the transformation from x to  $\tilde{x}$ , the system cannot be solved analytically and numerical solutions are needed, from which one has to come back to the original variable, i.e. a physical description of the system.

As also suggested by the current referee, experimental realizations of the mapped dynamics is not easy to obtain because of the complicated expression of the resulting potential, while a harmonic confinement and a periodic swim velocity can surely be realized experimentally. To insist on this statement, we have rephrased the final paragraph of the conclusions, which now reads: We demonstrated that by combining these two physically distinct effects, it is possible to generate complex density patterns through relatively simple fields, as in our example a harmonic trap and a periodic velocity landscape. In practice, realizing such particle distributions through a single external field is surely more

involved due to the required complex form of the potential. The possibility to fine-tune the stationary properties of active particles in experimental systems through adapting both the external force and the swim velocity opens up a new avenue for future applications and developments.

To address the first concern, the authors may consider showing a specific example where the proposed mapping fails, e.g. because u(x) is not bijective, or partially explains the physics at play.

**Reply**: First of all, let us remark that bijectivity of u(x) is not really required but only its positivity (such that the map G(x) is bijective). Therefore, the mapping can, in principle be applied to our situation involving a periodic and thus nonbijective velocity field. We thus rather address the first concern by emphasizing that the mapping does not change the physics of the system. To this end, we report here the answer provided later also to the second referee:

1) Despite the mapping is correct, we do not agree with the general argument of the referee. The original system does contain new physics with respect to the mapped one, the velocity dependence is simply hidden in the new variable. This is because the probability distribution of the original system, p, is related to the probability distribution of the transform system  $p_t$ , through the well-known relation:

$$p = p_t \det J$$

where det J is the Jacobian of the transformation from the transformed back to the original variables. With the change of variables proposed by the referee, we have det J = 1/u(x), and, as a result, the functional shape of the transformed probability distribution has changed with respect to that of the original system. In turn, this means that the new physical effects come into play when doing the back transformation involving a nontrivial dependence on u(x).

To better illustrate these ideas, let us consider the simpler (and explicitly solvable) scenario of Brownian motion with a multiplicative (linear) diffusivity, which represents a subcase of the general change of variables proposed by the referee to map a system with multiplicative noise onto a system with additive noise. Indeed, it is known in the literature that the system

$$\dot{y} = y\sqrt{2}\eta\tag{1}$$

(where  $\eta$  is a white noise), can be always mapped onto the simple diffusive dynamics

$$\dot{Y} = \sqrt{2}\eta\tag{2}$$

after introducing the change of variables  $Y = \log(y)$ . Despite such a mapping is useful to solve the problem, it is rather indisputable that Eq. (1) gives rise to new physics with respect to Eq. (2): the former dynamics is characterized by a log-normal Gaussian distribution (for instance, used to model the stock prices in economics), while the latter describes a simple diffusive process. This example shows that the existence of the mapping onto an additive system does not mean that the original system with multiplicative noise does not contain new physics.

Now that we have clarified the need of studying the original system (numerically), we can reassure that the new physical effects described in our manuscript indeed occur because of the interplay between external confinement and spatial-dependent swim velocity. Of course, the same density profile can be obtained for a particle in an effective (and very involved) potential alone, but this conclusion is almost trivial.

Explicitly, the new physical effects described in our manuscript can be summarized and understood by recalling the following two observations. i) An Active Ornstein Uhlembeck particle (AOUP) in a harmonic potential is characterized by a Gaussian velocity distribution. This is known in the literature (see for instance Refs. [60,64]). ii) A potential-free AOUP particle with space-dependent swim velocity has a Gaussian velocity distribution, as shown in Ref. [74]. In this work, we have shown by combining i) and ii) that an AOUP with harmonic confinement and a spatial-dependent swim velocity yields a distribution in the velocity v displaying non-Gaussian tails and even double-well shape in the regime of large persistence. Therefore, the interplay between harmonic confinement and spatial-dependent swim velocity plays a fundamental role in our model. In the new version of the manuscript, we have put more emphasis on this discussion (see the highlighted revised paragraphs on pages 3, 10, 13, and 16).

In the footnote [76], it is unclear why the physics is different: the particle escaping to infinity in the case of a modulation of the self-propulsion velocity is also a consequence of fluctuations induced in the active force. If the stationary density profile is identical, what quantity would distinguish the physics at play in the two systems considered?

Reply: We are grateful to the referee for this important question, which helps us to make the distinction between the two systems more precise. i) A potential-free particle subject to an activity field cannot be confined and is going to display a diffusive behavior, see Ref. [74]. This means that, through this method, one can achieve a particular shape of the density,  $\rho(x) \sim 1/u(x)$ , only because of periodic boundary conditions. Removing periodic boundary conditions the only steady-state solution is the vanishing one typical of diffusive systems. ii) Including an external confining potential, the system does not show a diffusive behavior. The system approaches a non-vanishing steady-state density  $\rho(x)$ . So, even if i) and ii) give rise to the same steady-state solution  $\rho(x)$ , this occurs only because of the periodic boundary conditions considered in i). The physics of i) and ii) is then distinguished by giving rise to diffusive and non-diffusive dynamics, respectively. In other words, one can use dynamical observables like the mean-squared displacement, which in the long time limit diverges in case i) or remains finite in case ii), to distinguish the physics at play.

In the new version of the manuscript, we have clarified this point by rewriting footnote [76] as: To shed light on the essential physical difference between a confined particle with uniform swim velocity and a free particle subject to a swim-velocity profile, let us consider, as a basic example, an AOUP with constant swim velocity  $u(\mathbf{x}) = v_0$  trapped in a harmonic potential, system (i), which can be solved exactly. The exact stationary density profile  $\rho(\mathbf{x})$  of (i) has a Gaussian shape. In principle, this distribution can be realized also by a nontrivial swim-velocity profile in the absence of external forces, system (ii), upon choosing a modulation of the form  $u(\mathbf{x}) \propto 1/\rho(\mathbf{x})$ . However, the physics of (i) and (ii) are crucially distinct. In case (i), the particle is externally confined and can explore the region far from the minimum of the potential only because of fluctuations induced by the active force. In the case (ii), the particle is free and shows a diffusive behavior: the Gaussian density profile  $\rho(\mathbf{x})$  is obtained since the particle spends more time in the central region where it moves slowly and because of the boundary conditions. More precisely, due to the absence of external forces (or other confining mechanisms), the swim velocity allows the particle to escape to infinity. This means that such an effective confinement can only formally be achieved through periodic boundary conditions: the particle moves slowly in the minimum of  $u(\mathbf{x})$ , escapes rightwards (or leftwards) with an increasing swim velocity and approaches again the slow region by coming back from the other side of the box. Dynamical observables

like the mean-squared displacement are thus different in the two cases.

## Reply to Reviewer #2

I thanks the authors for their answers to my concerns and for the changes implemented. I further apologize for the change of variable that I used to support my point about the similarity between spatially-dependent self-propulsion and driving forces: it contains indeed an error as the authors correctly noticed. I used it as a fast example to make my claim more precise but I should have detailed it more to exemplify what I meant. Let me correct it below by detailing how this change of variable should be carefully processed in order to map a dynamics with position-dependent self-propulsion speed onto one with a constant self-propulsion speed. I also take the opportunity to comment on the replies sent by the authors. All the references below correspond to the new version of the manuscript.

We thank the reviewer for the clarification. Here, we reply to the main issues raised by the referee:

1) Comment: The starting point is the evolution equation considered by the authors in one spatial dimension

$$\dot{x} = -\partial_x U + u(x)\eta \tag{3}$$

where  $\eta$  is an OU noise. Assuming that the spatially-dependent activity u(x) is a positive, bijective function then we can divide both sides by u(x) to obtain

$$\frac{\dot{x}}{u(x)} = -\frac{\nabla U}{u(x)} + \eta. \tag{4}$$

Then we define the primitive of  $u^{-1}$  as  $G(x) = \int_1^x 1/u(s)ds$ . Because u is a positive function, G is also a bijection. Furthermore, we have that

$$\frac{dG(x)}{dt} = \frac{\dot{x}}{u(x)} \tag{5}$$

So, if we define the change of variable  $\tilde{x} = G(x)$  we then have

$$\dot{\tilde{x}} = -\frac{\partial_x U(G^{-1}(\tilde{x}))}{u(G^{-1}(\tilde{x}))} + \eta \tag{6}$$

which I think achieves to show that, in this case, one can map the model of the authors to the dynamics of an AOUP with a constant self-propulsion speed. This is only a rapid reasoning which might not be exempt of misstakes: I hope the authors will point out these caveats if they find them. However, if (4) is indeed confirmed, it really maps the model of the authors to the dynamics of an AOUP with constant self-propulsion speed evolving in a complex (possibly non potential) landscape. And this is why I am not convinced by the authors arguments supporting the motivation of their model. It seems to me that the effect of the interplay between spatially-dependent self-propulsion speed and potential forces will be equivalent, in a lot of cases and at least in one dimension (as studied in this paper), to the effect of a more complicated landscape in a normal setting with constant self-propulsion speed.

**Reply**: As already mentioned in our previous reply, we acknowledge that such a definition of a new variable  $\tilde{x}$  is possible and also helpful when it comes to deriving our approximate probability distributions. We now also agree with the steps outlined

by the reviewer, although we would like to stress that the assumption of bijectivity of u(x) (which in fact would not hold for our system) is not really required but only its positivity (such that the map G(x) is bijective). Therefore, we put more emphasis on the definition of the new variable  $\tilde{\mathbf{x}}$  by adding a new appendix C, in which we present a modified version of the above definition, which reads: In this appendix we briefly discuss a change of variables [78,84] which allows us to formally absorb the effect of the spatially dependent swim velocity into an effective force. Since  $u(\mathbf{x})$  is positive definite, we can define a new variable  $\tilde{\mathbf{x}}$  such that

$$\dot{\tilde{\mathbf{x}}} := \frac{\dot{\mathbf{x}}}{u(\mathbf{x})}.$$

Substituting into Eq. (3) yields

$$\dot{ ilde{\mathbf{x}}} = rac{\gamma^{-1}\mathbf{F}(G^{-1}( ilde{\mathbf{x}}))}{u(G^{-1}( ilde{\mathbf{x}}))} + oldsymbol{\eta}\,,$$

where  $G^{-1}(\tilde{\mathbf{x}})$  denotes the inverse of the bijection  $G(\mathbf{x}) = \tilde{\mathbf{x}}$  mediating the variable transform  $\mathbf{x} \to \tilde{\mathbf{x}}$ . Moreover, we refer to this appendix after Eq. (29), which implicitly uses  $\tilde{\mathbf{x}}$  as the acceleration term which is neglected to obtain the UCNA.

However, we disagree that this mapping shows that the physics of a system with a spatially-dependent self-propulsion is trivial. Below, we provide two main arguments. 1) Despite the mapping is correct, we do not agree with the general argument of the referee. The original system does contain new physics with respect to the mapped one, the velocity dependence is simply hidden in the new variable. This is because the probability distribution of the original system, p, is related to the probability distribution of the transform system  $p_t$ , through the well-known relation:

$$p = p_t \det J$$

where det J is the Jacobian of the transformation from the transformed back to the original variables. With the change of variables proposed by the referee, we have det J = 1/u(x), and, as a result, the functional shape of the transformed probability distribution has changed with respect to that of the original system. In turn, this means that the new physical effects come into play when doing the back transformation involving a nontrivial dependence on u(x).

To better illustrate these ideas, let us consider the simpler (and explicitly solvable) scenario of Brownian motion with a multiplicative (linear) diffusivity, which represents a subcase of the general change of variables proposed by the referee to map a system with multiplicative noise onto a system with additive noise. Indeed, it is known in the literature that the system

$$\dot{y} = y\sqrt{2}\eta\tag{7}$$

(where  $\eta$  is a white noise), can be always mapped onto the simple diffusive dynamics

$$\dot{Y} = \sqrt{2}\eta\tag{8}$$

after introducing the change of variables  $Y = \log(y)$ . Despite such a mapping is useful to solve the problem, it is rather indisputable that Eq. (7) gives rise to new physics with respect to Eq. (8): the former dynamics is characterized by a log-normal Gaussian distribution (for instance, used to model the stock prices in economics),

while the latter describes a simple diffusive process. This example shows that the existence of the mapping onto an additive system does not mean that the original system with multiplicative noise does not contain new physics.

2) In addition, the mapping proposed by the referee cannot be easily interpreted without including the notion of the swim-velocity field u(x). Indeed, the new variable  $\tilde{x}$  has no intuitive physical meaning because it does not correspond to the position of the particle at variance with x. Even though it is mathematically valid, the mapping does not add any insight to the physical description of the system: neither the new system described by  $\tilde{x}$  nor the one described by x can be solved analytically. A numerical evaluation is needed in both cases, but the original system has a clear physical meaning, simply describing an active particle in a harmonic potential with spatially dependent swim velocity.

To emphasize these points in the new version of our manuscript we added the following comment at the end of Sec. 3.1 (where we introduce our approximate solutions): Finally, we remark that there exists a formal mapping of a system subject to a spatially dependent swim velocity, represented by a multiplicative noise in Eq. (2a), to a system with an effective external potential and additive noise. This mapping is mediated by a change of variables, reported and discussed in appendix C for completeness. Such a trick has been proven particularly helpful to find the explicit solution in a one-dimensional Run&Tumble model without external potential [84]. In our case, the newly defined variable allows us to identify the proper acceleration term which should be neglected to obtain the final UCNA result. However, to describe physically meaningful coordinates, i.e., the position and velocity of an AOUP, it is imperative to account for the notion of a swim velocity field  $u(\mathbf{x})$  in the stationary distributions of an AOUP stated above.

Moreover, we provide further discussion in the second paragraph of appendix C which reads: There are two possible ways of interpreting Eq. (38). First, on the right-hand side, we can identify an effective external force and an additive noise. It is thus possible to argue that the multiplicative nature of the swim-velocity field  $u(\mathbf{x})$  can be absorbed into a convoluted expression of an external potential (and implicitly in the definition of  $\tilde{\mathbf{x}}$ ). However, since the new coordinate  $\tilde{\mathbf{x}}$  has the dimension of time rather than length, this is only a mathematical analogy, which, owing to the simpler form might be useful to find an explicit solution as, for example, in the case of a Run&Tumble model in one dimension [84]. Transforming back to the original coordinates explicitly requires the notion of the swim velocity  $u(\mathbf{x})$ , compare Eq. (37). Second, multiplying both sides of Eq. (38) with  $u(\mathbf{x})$ , we recover an equation with a multiplicative noise in which the combined term  $u(\mathbf{x})\tilde{\mathbf{x}}$  has a proper dimension of a velocity. Moreover, upon first calculating the second time derivative  $\tilde{\mathbf{x}}$  and then multiplying with  $u(\mathbf{x})$ , we are able to identify the acceleration term which can be neglected to obtain the UCNA [78], compare Eq. (2). In other words, the physical interpretation of our results is the same whether or not we perform such a change of variables.

In addition, I don't understand the authors description non-Gaussianity induced by the interplay of confinement and spatially modulating swim velocity. As it is already known that an active particle with potential forces and constant self-propulsion speed has a non-Gaussian distribution both in x and v, then there is no need to have an interplay with a spatially-dependent self-propulsion to get a non-Gaussian distribution.

Reply: We thank the referee for the question, but we disagree with the referee: i) An Active Ornstein Uhlembeck particle (AOUP) in a harmonic potential is characterized by a Gaussian velocity distribution. This is known in the literature (see for instance Refs. [60,64]). ii) A potential-free AOUP particle with space-dependent swim velocity has a Gaussian velocity distribution, as shown in Ref. [74]. In this work, we have shown by combining i) and ii) that an AOUP with harmonic confinement and a spatial-dependent swim velocity yields a distribution in the velocity v displaying non-Gaussian tails and even double-well shape in the regime of large persistence. Therefore, the interplay between harmonic confinement and spatial-dependent swim velocity plays a fundamental role in our model. In the new version of the manuscript, we have put more emphasis on this discussion (see the highlighted revised paragraphs on pages 3, 10, 13, and 16).

2) Comment: Concerning my remarks explaining how the findings of the authors on figure 1 and 2 could be retrieved by applying general and common principles of active matter, I understand the stance of the authors with respect to the accessibility of their manuscript to less experienced readers. However, I think that the Ref [74] (written by the authors), already provides an accessible manuscript with detailed numerics and analytics about a very similar problem. Furthermore, there are other references already tackling the problem of position-dependent self-propulsion in AOUPs such as Ref [63]. It is not clear to me what are the authors additional contribution with respect to these previous works.

Reply: Our Ref. [74] does not study the same problem studied here, and, given the comments in reply to the previous point, also does not constitute a trivial extension. Indeed, In Ref. [74], we introduced an AOUP model with spatial-dependent swim velocity in the absence of external potential. The system shows a diffusive behavior (because of the absence of confinement) and a Gaussian distribution of the velocity. In the potential-free case, the steady-steady state distribution can be derived exactly. In the present paper, we are studying an AOUP model with spatial-dependent swim velocity in a confinement potential, going beyond the potential-free case considered in Ref. [74]. When confinement and spatial-dependent swim velocity are present, the system cannot be solved exactly: we derived an approximated approach to obtain theoretical predictions. This theory is broken in some regimes of the parameters where, for instance, non-Gaussian effects and bimodality of velocity and positional distribution are observed numerically.

Ref. [63] introduces an AOUP with spatial-dependent swim velocity in a different way. The model of Ref. [63] and the one of Ref. [74] do not coincide, as shown in Ref. [74] (see the appendix of this work). The two models could thus lead to different physical results (see also our response to the next point). Most importantly, the model Ref. [63] has also not yet been applied to study the joint action of inhomogeneous swim speed and external forces. Therefore, the study in the present manuscript is original.

3) Comment: In their replies, the authors pointed out a main difference between the model in Ref [63] and the model described in their manuscript, which, according to them, makes their proposed model more relevant for experiments. Indeed, they assert that the model in Ref [63] has a distribution of the form  $\rho(x) = 1/u(x)$  (with u(x) being once again the spatially dependent self-propulsion) only in a limited regime

depending on the persistence length. However, I believe that this statement is wrong because a careful reading of Ref [63] shows that the distribution  $\rho(r) = 1/u(r)$  is recovered in a limited regime only when the self-propulsion speed u(r) depends on the set of position  $\{r\}$  of the other active particles. When the self-propulsion speed u(x) depends on the absolute position of only the particle under consideration, then the result  $\rho(x) = 1/u(x)$  of Ref[63] holds without any limitations. Thus, the authors have not convinced me about the relevance of their models with respect to the other ones in the literature. Why should it be relevant and more adequate for describing experiments?

Reply: Let us, first of all, clarify that we do not claim that our model is better than the model in Ref. [63]. We merely state that our model suits the class of experiments we want to describe in the present manuscript and elaborated on the differences between the two models as part of the review process. We apologize if this point has been mistaken. We have rephrased the respective statements. That said, after having another look at Ref. [63], we do not agree with the referee. In Ref. [63], pag.5, second column, after Eq. (29), the authors of Ref. [63] wrote:

"It is then a simple exercise to check that varying  $\tau(\mathbf{r})$  and  $D(\mathbf{r})$  while keeping  $T = D/\tau$  uniform leads to a Maxwellian steady-state  $P_s(\mathbf{r}, \mathbf{v}) \propto \exp(-\mathbf{v}^2/(2T))$  and hence to a uniform distribution in position space  $P_s(\mathbf{r})$ . Under more general conditions, and somewhat surprisingly, Eq. (29) does not seem to admit simple steady-state solutions. As we show next, for slowly varying  $\tau(\mathbf{r})$  and  $D(\mathbf{r})$ , one can nevertheless show the steady-state distribution to be given by  $P_s(\mathbf{r}) \propto 1/T(\mathbf{r}) = \tau(\mathbf{r})/D(\mathbf{r})$ ."

Following Ref. [63], by fixing  $\tau(\mathbf{r}) = \text{const}$ , the result  $P_s(\mathbf{r}) \propto 1/T(\mathbf{r})$  can be obtained only for for slowly varying  $\tau(\mathbf{r})$  and  $D(\mathbf{r})$ . There is no trace of the coordinates of other particles in the paper or in the derivation reported in the paper. The AOUP model proposed in Ref. [74], instead, gives rise to a spatial density proportional to the inverse of the swim velocity independently of the choice of the swim velocity and for general dimensions, as shown in Ref. [74]. Therefore, our chosen AOUP model (Ref. [74]) can be conveniently used to describe those experiments where the spatial density is proportional to the inverse of the swim velocity. To be more specific on the points discussed above, we have rephrased the discussion of Eq. (2) in our revised manuscript and now write: Therefore, in the absence of external forces and time dependence, we analytically recover the law  $\rho(\mathbf{x}) \sim 1/u(\mathbf{x})$  for the stationary density profile  $\rho(\mathbf{x})$  [74]. Our model is therefore suitable to describe the class of experimental systems including engineered E. Coli bacteria [25,27] or active colloids [19] for which this relation is observed. Note that the alternative spatially dependent AOUP dynamics proposed in Ref. [63] is characterized by equations of motions that do not coincide with Eqs. (2) (as shown in the appendix of Ref. [74]). This alternative model thus leads to different predictions as it reproduces the relation  $\rho(\mathbf{x}) \sim 1/u(\mathbf{x})$  only for slow spatial variation of  $u(\mathbf{x})$  [63] but could be in principle suitable to describe another class of experiments.

Finally, we stress once more that, for the present manuscript, the question of which model should be better is completely irrelevant, since the problem of an active particle with spatially dependent swim velocity in an external force field is original and could have been addressed with either theory.

4) Comment: Finally, I would like to come back to the concern I expressed with respect to the authors statement the interplay between the external force and the modulation of the swim velocity can be used to manipulate the behavior of a confined active par-

ticle, for instance by locally increasing the kinetic temperature or by forcing the particles to accumulate in distinct spatial regions with different probability. My concern was that in their previous work [74] the authors have already shown that an active particle with spatially-dependent self-propulsion u(x) has a distribution  $\rho(x) \propto 1/u(x)$ . Thus, my point was that the potential was not needed if one wanted to manipulate and sort active particles: a spatially-dependent u(x) is enough. The authors reply that in a typical experimental setting the active particles are confined and that thus there is a need to study the interplay between confinement and self-propulsion speed. I am not convinced by this reply because if the particles are confined then one can just manipulate the confining potential in order to force the particles to accumulate where one wants.

**Reply**: We suspect that we were not clear in our previous reply, such that some points may have been misunderstood. Confinement is not strictly necessary in experiments (if one is able to set up a sufficiently large bulk) but just another screw that can be turned (together with the swim velocity) to fine-tune the behavior of the experimental system, as we further detail in response to the subsequent points.

In my opinion, the authors did not clearly explain what are the physical features exhibited by their model which are not already present in an AOUP evolving in a complex potential with fixed self-propulsion speed (see the first point above with the change of variable). That is why I am not convinced by several claims of the authors about the emerging complex behaviour from the interplay between spatially-dependent self-propulsion and potential forces. For example, the deviations of the velocity distributions from a Gaussian shape exclusively arise from the interplay of these two fields. For a single AOUP with fixed self-propulsion evolving in a (not harmonic) potential, the velocity distribution is already non gaussian without needing to invoke a complex interplay.

Reply: The referee is right: for a single AOUP with fixed self-propulsion evolving in a (not harmonic) potential, the velocity distribution is already non-Gaussian. Nevertheless, our sentence "the deviations of the velocity distributions from a Gaussian shape exclusively arise from the interplay of these two fields" is well-justified. Indeed, as already argued in a previous point, it is known that an AOUP in a harmonic potential with constant swim velocity is characterized by a Gaussian velocity distribution. It is also known that a Gaussian distribution in the velocity also characterizes the distribution of potential-free active particles with spatial-dependent swim velocity (see Ref. [74]). The interplay between harmonic confinement and spatial-dependent swim velocity generates non-Gaussianity in the velocity distribution, that in some regimes of parameters could even display a bimodality. This clearly demonstrates that new physical effects arise from the interplay between these two ingredients. The fact that there is already non-Gaussianity for a more complex confining potential does not change this conclusion (which is, however, nicely illustrated in the considered special case of a harmonic trap).

Another example is the following statement We demonstrated that by combining these two physically distinct effects, it is possible to generate complex density patterns through two relatively simple fields, which is surely easier to realize in practice than generating a single external field with a complex shape. First, it is not clear to me why generating two external fields is easier than one, especially when this last one is a confining potential. I don't believe that it is hard to manufacture a sheet of plastic with some meanders and up-and-downs where you can put your active particles on.

Second, it is not clear to me what is the aforementioned complex density pattern because, as I explained in my first review, one could have deduced it by applying two fundamental principles of active matter.

**Reply**: We do not agree with the referee: the experimental confinement of an active particle (a Janus particle or a bacterium) into a simple potential, such as a roughly single-well harmonic potential or a double-well potential is quite easy. The complicated potential proposed by the referee,  $\frac{\partial_x U(G^{-1}(\tilde{x}))}{u(G^{-1}(\tilde{x}))}$  where  $G(x) = \int_1^x 1/u(s)ds$  and  $\tilde{x} = G(x)$ , should be rather complicated to implement experimentally to confine Janus particles. In addition, we do not think that "a sheet of plastic with some meanders" could be suitable to confine active Janus particles, bacteria or other typical examples of active particles. Regarding the last sentence, we think that understanding how the emergence of complex density patterns can be explained theoretically (which is what the reviewer is alluding to) and actually creating such patterns in an experiment (for which we suggest to explicitly using the interplay of two simpler fields) are two completely different things.

To be more explicit on these points, we have extended and rephrased the final paragraph of the conclusions, which now reads: We demonstrated that by combining these two physically distinct effects, it is possible to generate complex density patterns through relatively simple fields, as in our example a harmonic trap and a periodic velocity landscape. In practice, realizing such particle distributions through a single external field is surely more involved due to the required complex form of the potential. The possibility to fine-tune the stationary properties of active particles in experimental systems through adapting both the external force and the swim velocity opens up a new avenue for future applications and developments.

Nonetheless, I agree with the authors that there are physical differences between an AOUP with spatially-dependent self-propulsion speed and an AOUP in a confining potential which are clarified in the new footnote [76]. My concern is that I do not see the new complex behaviour or the new features due to the interplay between the two ingredients (potential forces and spatially-dependent self-propulsion) which are not already present whenever only one of the two ingredients is present.

Reply: We are glad that our clarification in footnote [76] is convincing. To conclude once more on the general concern, which we believe to have answered in sufficient detail above, we would like to draw an analogy to an equilibrium system. Consider a confined system of interacting particles. The interplay of external forces and interparticle interactions usually leads to oscillating density patterns  $\rho(\mathbf{x})$  in the vicinity of the walls, which are absent for both noninteracting (ideal) particles in the same confinement and in a bulk system of interacting particles. The same density patterns could, however, be realized by confining ideal particles in an effective external potential  $U(\mathbf{x}) = -\beta^{-1} \ln \rho(\mathbf{x})$ . Although this example does not come along with an explicit mapping of the coordinates, we believe that the reviewer would agree here that the interplay of interactions and confinement does bring new physics, although, in principle, complex confinement alone is capable of reproducing the same observable, namely  $\rho$ , in a simpler system. In our opinion, the interplay of two different driving forces is a general source of emergent behavior in a broad variety of physical systems and thus generally worth investigating.

My opinion is that the authors have not answered to my main concerns, and especially that the novelty and importance of their work with respect to the current literature (Ref

[74] and Ref [63]) is not clear to me. Because of all the points discussed above, it seems to me that the main message of interplay between spatially-dependent self-propulsion and potential forces yields complex physics is not really grounded. Therefore, I would not recommend this manuscript for publication in scipost.

In our opinion, we have addressed the main concerns and doubts of all referees, at least now, at this second stage of the review. The discussion concerning the difference between the present paper and Ref. [74] has been put forward: we think that there is a non-trivial conceptual difference between the study of non-confined diffusive systems and confined systems. The model used in the present paper and the one considered in Ref. [63] are different, as shown explicitly in Ref. [74]. The message that: "the interplay between spatially-dependent self-propulsion and potential forces yields complex physics" has been further motivated. Indeed, a potential active Ornstein Uhlembeck (AOUP) with spatial-dependent swim velocity has a Gaussian velocity distribution and an AOUP with constant swim velocity and harmonic potential is again described by a Gaussian. Instead, a harmonically confined AOUP with spatial-dependent swim velocity is characterized by a strongly non-Gaussian distribution that could even show bimodality.

## Reply to Reviewer #3

Let me thank the authors for having considered my comments and for their replies. From my side, I have to say that they adequately addressed my major and minor comments. However, at this stage of the review process, I understand there are still open issues with Reviewer 2 (R2). It looks to me like there are two main criticisms that should be taken into account by the authors and addressed properly.

**Reply**: We thank the referee for his/her careful reading of both the new version of the paper and of the correspondence with Reviewer 2 (R2).

The first criticism raised by R2 is about the novelty of the work in comparison with (i) Ref. [74] of the same authors, where they introduce the model considered here without any external fields, and (ii) Ref [6], where, in Section II-D (across p. 5 and 6), there is a short discussion about AOUPs in the presence of spatially varying activity in the small-tau limit. I think a clarification about that would be an additional improvement to the manuscript.

**Reply**: We thank the referee. A clarification on this point has been included in the new version of the paper. In particular, we stress that in Ref. [63], pag.5, second column, after Eq. (29), the authors of Ref. [63] wrote:

"It is then a simple exercise to check that varying  $\tau(\mathbf{r})$  and  $D(\mathbf{r})$  while keeping  $T = D/\tau$  uniform leads to a Maxwellian steady-state  $P_s(\mathbf{r}, \mathbf{v}) \propto \exp(-\mathbf{v}^2/(2T))$  and hence to a uniform distribution in position space  $P_s(\mathbf{r})$ . Under more general conditions, and somewhat surprisingly, Eq. (29) does not seem to admit simple steady-state solutions. As we show next, for slowly varying  $\tau(\mathbf{r})$  and  $D(\mathbf{r})$ , one can nevertheless show the steady-state distribution to be given by  $P_s(\mathbf{r}) \propto 1/T(\mathbf{r}) = \tau(\mathbf{r})/D(\mathbf{r})$ ."

As we understand it, this statement contradicts the comment of R2, since, following Ref. [63], by fixing  $\tau(\mathbf{r}) = \text{const}$ , the result  $P_s(\mathbf{r}) \propto 1/T(\mathbf{r})$  can be obtained only for for slowly varying  $\tau(\mathbf{r})$  and  $D(\mathbf{r})$ . The AOUP model proposed in our paper, instead, gives rise to a spatial density proportional to the inverse of the swim velocity independently of the choice of the spatial swim velocity profile and for general dimensions, as shown in Ref. [74] in the potential-free case. Therefore, our AOUP model is more suitable than

the model proposed in Ref. [63] to describe at least those experiments where the spatial density is proportional to the inverse of the swim velocity. We have revised the corresponding paragraph in our manuscript to be more explicit about these two models and to stress that the model of Ref. [63] could be in principle suitable to describe another class of experiments.

The second criticism looks to me to be still linked with point (i) of the previous comment: What is the new phenomenology one gets once we turn on a confining external potential in a system of AOUP with space-varying motility. As already shown in PRE 100, 052147 (2019) in the case of one-dimensional non-interacting run-and-tumble particles with space-dependent speed (see Eq. (7) of that reference), R2 noticed a possible mapping into the dynamics of AOUP in a complicated force field. My feeling is that, since the problem does not map simply into the dynamics with an effective conservative field, I think it might be opportune to talk about some sort of complex behavior for the resulting dynamics (if I interpret correctly the reply of the authors). Again, although the authors in their reply wrote about this issue showing that the dynamics is not just the dynamics of an active particle into an effective potential, I think it is opportune to have further improvements. For instance, the authors might better clarify how the competition between external confining potential and space-varying velocity works

Reply: We thank the referee for the above comment and for suggesting the interesting paper which is now cited as Ref. [84]. In the case of the one-dimensional Run&Tumble model in Ref. [84], the mapping proposed by R2 is really useful because the resulting effective system with uniform swim velocity can be solved exactly and from the transformed variable one can come back to the original description in terms of the position of the particles. In the case of our AOUP model, the mapping is not really useful because we have to proceed numerically and then we have to numerically come back to the original physical description in terms of the particle position. Indeed, the physical meaning of the new transformed variable is unclear since it does not coincide with the particle position.

In the new version of the manuscript, we have added a discussion at the end of Sec. 3.1 on the mapping proposed by R2 and also discussed its suitability to find an exact solution for the system in Ref. [84]: Finally, we remark that there exists a formal mapping of a system subject to a spatially dependent swim velocity, represented by a multiplicative noise in Eq. (2a), to a system with an effective external potential and additive noise. This mapping is mediated by a change of variables, reported and discussed in appendix C for completeness. Such a trick has been proven particularly helpful to find the explicit solution in a one-dimensional Run&Tumble model without external potential [84]. In our case, the newly defined variable allows us to identify the proper acceleration term which should be neglected to obtain the final UCNA result. However, to describe physically meaningful coordinates, i.e., the position and velocity of an AOUP, it is imperative to account for the notion of a swim velocity field  $u(\mathbf{x})$  in the stationary distributions of an AOUP stated above.

The more detailed account given in appendix C reads: In this appendix we briefly discuss a change of variables [78,84] which allows us to formally absorb the effect of the spatially dependent swim velocity into an effective force. Since  $u(\mathbf{x})$  is positive definite, we can define a new variable  $\tilde{\mathbf{x}}$  such that

$$\dot{\tilde{\mathbf{x}}} := \frac{\dot{\mathbf{x}}}{u(\mathbf{x})}.$$

Substituting into Eq. (3) yields

$$\dot{ ilde{\mathbf{x}}} = rac{\gamma^{-1}\mathbf{F}(G^{-1}( ilde{\mathbf{x}}))}{u(G^{-1}( ilde{\mathbf{x}}))} + oldsymbol{\eta}\,,$$

where  $G^{-1}(\tilde{\mathbf{x}})$  denotes the inverse of the bijection  $G(\mathbf{x}) = \tilde{\mathbf{x}}$  mediating the variable transform  $\mathbf{x} \to \tilde{\mathbf{x}}$ .

There are two possible ways of interpreting Eq. (38). First, on the right-hand side, we can identify an effective external force and an additive noise. It is thus possible to argue that the multiplicative nature of the swim-velocity field  $u(\mathbf{x})$  can be absorbed into a convoluted expression of an external potential (and implicitly in the definition of  $\tilde{\mathbf{x}}$ ). However, since the new coordinate  $\tilde{\mathbf{x}}$  has the dimension of time rather than length, this is only a mathematical analogy, which, owing to the simpler form might be useful to find an explicit solution as, for example, in the case of a Run&Tumble model in one dimension [84]. Transforming back to the original coordinates explicitly requires the notion of the swim velocity  $u(\mathbf{x})$ , compare Eq. (37). Second, multiplying both sides of Eq. (38) with  $u(\mathbf{x})$ , we recover an equation with a multiplicative noise in which the combined term  $u(\mathbf{x})$   $\hat{\mathbf{x}}$  has a proper dimension of a velocity. Moreover, upon first calculating the second time derivative  $\hat{\mathbf{x}}$  and then multiplying with  $u(\mathbf{x})$ , we are able to identify the acceleration term which can be neglected to obtain the UCNA [78], compare Eq. (2). In other words, the physical interpretation of our results is the same whether or not we perform such a change of variables.

## what are the novelties with respect to the case without an external field and why it is important to consider the effect of external fields:

Reply: Let us start by summarizing the main physical difference between a potential-free AOUP with spatial-dependent swim velocity (system i) and an AOUP with spatial-dependent swim velocity confined through an external potential (system II)). In case I), the system shows a diffusive behavior. Indeed, the system is described by a density  $\rho(x) \sim 1/u(x)$  only if we assume periodic boundary conditions [74]. Otherwise, the only steady-state solution is the vanishing one. In case II), the system is really confined and admits a steady-state distribution, whose properties are physically due to the interplay between confinement and spatial-dependent swim velocity. I) is characterized by a Gaussian distribution of the velocity, while II) is characterized by a non-Gaussian distribution of the velocity, showing even bimodality.

Now we elaborate that the combined effect of external confinement and spatial-dependent swim velocity leads to new physical effects. i) An Active Ornstein Uhlembeck particle (AOUP) in a harmonic potential is characterized by a Gaussian velocity distribution. This is known in the literature (see for instance Refs. [60,64]). ii) A potential-free AOUP particle with space-dependent swim velocity has a Gaussian velocity distribution, as shown in Ref. [74]. In this work, we have shown by combining i) and ii) that an AOUP with harmonic confinement and a spatial-dependent swim velocity yields a distribution in the velocity v displaying non-Gaussian tails and even double-well shape in the regime of large persistence. Therefore, the interplay between harmonic confinement and spatial-dependent swim velocity plays a fundamental role in our model.

In the new version of the manuscript, we have put more emphasis on the discussion of the different cases, i.e., a free AOUP in a velocity field, a confined AOUP with constant velocity and, considering the interplay of both, a confined AOUP in a velocity field (see the highlighted revised paragraphs on pages 3, 10, 13 and 16 and the revised footnote [76]).

#### **Submission**

# Active particles driven by competing spatially dependent self-propulsion and external force

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#### **Abstract**

We investigate how the competing presence of a nonuniform motility landscape and an external confining field affects the properties of active particles. We employ the active Ornstein-Uhlenbeck particle (AOUP) model with a periodic swim-velocity profile to derive analytical approximations for the steady-state probability distribution of position and velocity, encompassing both the Unified Colored Noise Approximation and the theory of potential-free active particles with spatially dependent swim velocity recently developed. We test the theory by confining an active particle in a harmonic trap, which gives rise to interesting properties, such as a transition from a unimodal to a bimodal (and, eventually multimodal) spatial density, induced by decreasing the spatial period of the self propulsion. Correspondingly, the velocity distribution shows pronounced deviations from the Gaussian shape, even displaying a bimodal profile in the high-motility regions. We thus show that the interplay of two relatively simple physical fields can be employed to generate complex emerging behavior.

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#### 1 Introduction

The control of active matter [1-4] is an important issue for technological, biological and medical applications and has recently stimulated many experimental and theoretical works. It is also very important in the future perspective of self-assembling and nano-fabricating active materials. The diffusivity of active particles is much higher than the one of their passive counterparts. Indeed, the former may be caused by high motility induced by either an internal "motor" (metabolic processes, chemical reactions, etc.) or a directed external driving force acting on each particle, while the latter is simply due to random collisions with the particles of the thermal bath. This property offers intriguing perspectives since it is possible to achieve navigation control of active particles [5,6], for instance when driving their trajectories by some feedback mechanism [7,8].

In the case of active colloids, such as Janus particles activated by external stimuli, the motility can be tuned by modulating the intensity of light [9–14]. This property has been employed to trap them [15,16] and to obtain polarization patterns induced by motility gradients [17,18]. Experimentally, the existence of an approximately linear relation between light intensity and swim velocity [19] allows to tune the motility and design spatial patterns with specific characteristics. Recent applications range from micro-motors [20,21] and rectification devices [22,23] to motility-ratchets [24]. Two experimental groups [25–27], have devised an intriguing technique to control the swimming speed of bacteria by using patterned light fields to enhance/reduce locally their motility by increasing/decreasing the light intensity. This leads to a consequent accumulation/depletion of particles in some regions, so that this procedure can be used to draw two dimensional images with the bacteria [25].

The fundamental physical concept behind experiments on light-controlled bacteria has been investigated many years ago in a theoretical context for noninteracting random walkers by Schnitzer [28] and later been extended to the interacting Run-and-Tumble model by Cates and Tailleur [29]: the lower the speed of active particles, the higher their local density. This theoretical result has been tested and confirmed in many numerical works and the existence of such a relation between particle velocity and density is now considered one of the most distinguishing features of active matter. A subsequent theoretical modeling of these effects has been proposed in Refs. [19, 30–33] by generalizing the active Brownian particle (ABP) model to include a spatially dependent swim velocity. This additional ingredient accounts for the well-known quorum sensing [34–36], chemotaxis and pseudochemotaxis [37–40] and correctly predicts a scaling of the density profile of individual particles with the inverse of the swim velocity. Including particle interactions in the ABP model may lead to the spontaneous formation of a membrane in two-step motility profiles [41] or cluster formation in regions with small activity [42]. Moreover, a temporal dependence in the activity landscape [43–48] may, in

some cases, produce directed motion opposite to the propagation of the density wave [23,49].

The ABP model has been widely employed to obtain theoretical predictions [50–52] and still represents one of the more spread active matter models for its versatility and broad applicability [53–58]. Nevertheless, the more recent active Ornstein-Uhlenbeck particle (AOUP) model [59–65], to be regarded as a "sister/brother" [66] of the ABP model, is generally easier to handle and often conveniently used to achieve further theoretical progress. For an ABP, the modulus of the active force is fixed and its orientation diffuses, while for an AOUP each component of the propulsion force evolves independently according to an Ornstein-Uhlenbeck process. Therefore, AOUPs can be used as an alternative to ABPs with simplified dynamics [67–69], to describe the behavior of a colloidal particle in an active bath [70,71]. Moreover, a convenient mapping between the parameters of the two models can be performed on the level of the autocorrelation function of the self-propulsion velocity [72,73], such that their predictions agree fairly well for small and intermediate persistence time of the active motion [66]. The present authors recently modified the AOUP model to account for a spatially dependent swim velocity in Ref. [74] and obtained exact results for both the density profile and velocity distribution of a potential-free particle.

Analytical results for active particles in competing external potential and motility fields are sparse. Therefore, in this work, we extend the theoretical treatment of free AOUPs with spatially dependent self-propulsion from Ref. [74] by including the presence of an external force field, revealing more interesting properties than those obtained for either a constant swim velocity or in the absence of external forces. For example, an AOUP with constant swim velocity displays a Gaussian density in a harmonic trap, while the competition between external forces and motility patterns gives rise to a density profile characterized by multiple peaks. Moreover, in the latter case, the velocity distribution at fixed position displays strong non-Gaussian effects and even a transition from a unimodal to a bimodal shape, which does not occur in the former case.

The paper is structured as follows: In Sec. 2, we present the model to describe an active particle in a spatially dependent swim-velocity landscape and subject to an external potential, while, in Sec. 3, we develop our theoretical approach to describe the steady-state properties of such a system. The theory is numerically tested in Sec. 4 in the case of a harmonic potential and sinusoidal swim-velocity profile. Finally, conclusions and discussions are reported in Sec. 5. The appendices contain derivations and information supporting the theoretical treatment.

#### 2 Model

#### 2.1 Active particles with spatially dependent swim velocity

The position,  $\mathbf{x}$ , of an active particle evolves according to overdamped dynamics supplemented by a stochastic equation for the active driving, the so-called self-propulsion (or active) force,  $\mathbf{f}_a$ . Such a force term is responsible for the persistence of the trajectory and its physical origin depends on the system under consideration: flagella for bacteria and chemical reactions for Janus particles, to mention just two examples. The active force  $\mathbf{f}_a$  can be written in the following form [66]:

$$\mathbf{f}_{a} = \gamma v_{0} \boldsymbol{\eta} \,, \tag{1}$$

where  $\eta$  is a stochastic process of unit variance,  $\gamma$  is the friction coefficient and  $\nu_0$  is the constant swim velocity induced by the active force. To describe an active particle with a spatially dependent swim velocity, we employ the transformation  $\nu_0 \to u(\mathbf{x},t)$  in Eq. (1), which introduces a dependence on both position and time. The shape of  $u(\mathbf{x},t)$  must satisfy some properties related to physical arguments:

- i) positivity:  $u(\mathbf{x}, t) \ge 0$ , for every  $\mathbf{x}$  and t, since  $u(\mathbf{x}, t)$  is the modulus of the velocity induced by the active force.
- ii) boundedness:  $u(\mathbf{x}, t)$  needs to be a bounded function of its arguments because the swim velocity cannot be infinite.

In what follows, we focus on the stochastic model introduced in Ref. [74], representing a generalization of the AOUP dynamics with  $u(\mathbf{x}, t)$ .

Assuming inertial effects to be negligible at the microscopic scale, typically realized at small Reynolds numbers, the overdamped dynamics of the active particle with spatially modulating swim velocity reads:

$$\gamma \dot{\mathbf{x}} = \mathbf{F} + \gamma \sqrt{2D_t} \mathbf{w} + \gamma \mathbf{u}(\mathbf{x}, t) \boldsymbol{\eta} \,, \tag{2a}$$

$$\tau \dot{\boldsymbol{\eta}} = -\boldsymbol{\eta} + \sqrt{2\tau} \boldsymbol{\chi} \,, \tag{2b}$$

where  $\chi$  and w are  $\delta$ -correlated noises with zero average and unit variance and F is the force exerted on the particle, resulting from the gradient of a potential  $U(\mathbf{x})$ , i.e.,  $F(\mathbf{x}) = -\nabla U(\mathbf{x})$ . In this paper, we consider only a single particle, so that  $U(\mathbf{x})$  is a one-body potential, but the description can be straightforwardly extended to the case of many interacting particles. The coefficient  $D_t$  is the translational diffusion coefficient due to the solvent satisfying the Einstein's relation with  $D_t = T_t/\gamma$  and the temperature,  $T_t$ , of the passive bath (for unit Boltzmann constant). The dynamics of  $\eta$  is characterized by the typical time,  $\tau$ , which represents the correlation time of the active force autocorrelation and is usually identified with the persistence time of the single-trajectory, i.e., the time that a potential-free active particle spends moving in the same direction with velocity  $u(\mathbf{x},t)$ . In what follows, we neglect the contribution of the thermal bath by setting  $D_t = 0$ , which is well justified in most of the experimental active systems [1].

By writing the active force in Eq. (2) as  $\mathbf{f}_{a}(\mathbf{x},t) = \gamma u(\mathbf{x},t) \eta$  we have achieved two important goals. First, the spatial dependence of the self propulsion velocity can be conveniently accounted for through a multiplicative factor  $u(\mathbf{x},t)$ , which does not affect the dynamics of the noise vector. Therefore, in the absence of external forces and time dependence, we analytically recover the law  $\rho(\mathbf{x}) \sim 1/u(\mathbf{x})$  for the stationary density profile  $\rho(\mathbf{x})$  [74]. Our model is, therefore, suitable to describe the class of experimental systems including engineered E. Coli bacteria [25,27] or active colloids [19] for which this relation is observed. Note that the alternative spatially dependent AOUP dynamics proposed in Ref. [63] is characterized by equations of motions that do not coincide with Eqs. (2) (as shown in the appendix of Ref. [74]). This alternative model thus leads to different predictions as it reproduces the relation  $\rho(\mathbf{x}) \sim 1/u(\mathbf{x})$ only for slow spatial variation of  $u(\mathbf{x})$  [63] but could be in principle suitable to describe another class of experiments. Second, the Ornstein-Uhlenbeck process in Eq. (2b) has unit equal-time variance (except for a dimensional factor which we ignore here for convenience [73]), such that the reduced stationary probability distribution of  $\eta$  does not depend on the time scale  $\tau$ . This means that  $u(\mathbf{x})$  provides a unique velocity scale. Moreover, this unit-variance version of the AOUP model allows us to establish a direct link to the ABP model and an even larger family of models [66] for which Eq. (2a) has the same form. In other words, the relation  $\rho(\mathbf{x}) \sim 1/u(\mathbf{x})$  in the force-free case can be consistently obtained for all dynamics of the selfpropulsion vector  $\eta$ . In turn, from Eq. (1) (or by taking  $u(\mathbf{x},t) = v_0$ ), the standard version of the AOUP model is recovered by absorbing the velocity scale  $v_0$  into the active diffusion coefficient  $D_a = v_0^2 \tau$  (see also footnote [73] for a general discussion of the mapping between ABPs and the different versions of AOUPs in d spatial dimensions). From this identification, we see that the condition,  $D_t \ll D_a$ , necessary to neglect the thermal noise requires  $u(\mathbf{x}, t) > 0$ , which is stronger than the one stated above.

#### 2.2 Velocity description of an active Ornstein-Uhlenbeck particle (AOUP)

Our equation of motion (2a) of an AOUP with a spatially dependent swim velocity contains a multiplicative colored noise, which does not readily allow us to gain further analytic insight. As a first step to ease the theoretical treatment of our model, we switch to the auxiliary dynamics employed earlier in the potential-free case [74]. Instead of describing the system in terms of position  $\mathbf{x}$  and self-propulsion velocity  $u(\mathbf{x})\boldsymbol{\eta}$ , we take advantage of the relation (holding for  $D_t = 0$ )

$$\gamma \dot{\mathbf{x}} = \mathbf{F} + \gamma u(\mathbf{x}, t) \boldsymbol{\eta} \tag{3}$$

to perform the simple change of variables  $(\mathbf{x}, \boldsymbol{\eta}) \to (\mathbf{x}, \dot{\mathbf{x}} = \mathbf{v})$ . This trick allows us to directly study the position and the velocity of the active particle as for  $u(\mathbf{x}, t) = v_0$ . As in the potential-free case, to return to the original variables, we need to account for the space-dependent Jacobian matrix  $\mathcal{J}$  of the transformation reported in Appendix A. The resulting Jacobian reads:

$$\det[\mathcal{J}] = u(\mathbf{x}, t),\tag{4}$$

where  $\det[\cdot]$  represents the determinant of a matrix. Therefore, the probability distributions,  $\tilde{p}(\mathbf{x}, \boldsymbol{\eta}, t)$  and  $p(\mathbf{x}, \mathbf{v}, t)$ , in the two coordinate frames satisfy the following relation:

$$\tilde{p}(\mathbf{x}, \boldsymbol{\eta}, t) = \det[\mathcal{J}] p(\mathbf{x}, \mathbf{v}, t). \tag{5}$$

Note that the condition  $u(\mathbf{x}, t) > 0$  implies  $\det[\mathcal{J}] > 0$  and, thus guarantees the possibility of performing the transformation. In what follows, we use these new variables to study a system subject to both a spatially dependent swim velocity,  $u(\mathbf{x}, t)$ , and an external potential  $U(\mathbf{x})$ . The generalization to include a thermal noise can be achieved by following Ref. [75].

To derive the dynamics in the variables  $\mathbf{x}$  and  $\mathbf{v}$ , we adopt a simple strategy whose leading steps are reported in details in Appendix A. We perform the time-derivative of Eq. (3), substitute  $\dot{\boldsymbol{\eta}}$  with Eq. (2b) and then replace  $\boldsymbol{\eta}$  with  $\mathbf{v}$  and  $U(\mathbf{x})$ , using again Eq. (3), and finally obtain an equivalent equation of motion for the velocity  $\mathbf{v}$ . The full result reads

$$\dot{\mathbf{x}} = \mathbf{v},$$
 (6a)

$$\gamma \tau \dot{\mathbf{v}} = -\gamma \mathbf{\Gamma}(\mathbf{x}) \cdot \mathbf{v} - \nabla U + \gamma u(\mathbf{x}, t) \sqrt{2\tau} \chi$$

$$+ \tau \frac{[\gamma \mathbf{v} + \nabla U]}{u(\mathbf{x}, t)} \left( \frac{\partial}{\partial t} + \mathbf{v} \cdot \nabla \right) u(\mathbf{x}, t).$$
(6b)

In Eq. (6b), the first line is identical to the expression describing the constant case  $u(\mathbf{x}, t) = v_0$ : the dynamics of an overdamped active particle is mapped onto that of an underdamped passive particle with a spatially dependent friction matrix,  $\gamma \Gamma(\mathbf{x})$ , which depends on the second derivatives of the potential and reads:

$$\Gamma(\mathbf{x}) = \mathbf{I} + \frac{\tau}{\gamma} \nabla \nabla U(\mathbf{x}), \tag{7}$$

where I is the identity matrix. Such a term increases or decreases the effective particle friction according to the value of the curvature of  $U(\mathbf{x})$ , which becomes more and more important as  $\tau$  becomes large. In addition, as already found in the potential-free case, the noise amplitude contains a spatial and temporal dependence through the multiplicative factor  $u(\mathbf{x},t)$ . The second line of Eq. (6b) contains the new terms, absent for  $u(\mathbf{x},t) = v_0$ , accounting for both the time- and space-dependence of  $u(\mathbf{x},t)$ .

For a further discussion of the new terms arising from a modulating swim-velocity profile, we restrict ourselves to the time-independent case,  $u(\mathbf{x},t) = u(\mathbf{x})$ . Then, we identify two contributions to the total force. The first one,  $\propto \mathbf{v}\mathbf{v} \cdot \nabla u$ , is proportional to the square of

the velocity and appears also in the absence of an external potential. Since it is even under time-reversal transformation, it cannot be interpreted as an effective Stokes force. The second force,  $\propto (\nabla U)\mathbf{v} \cdot \nabla u$ , couples the gradients of the potential and the swim velocity and gives rise to an extra space-dependent contribution to the effective friction. This allows us to absorb this term into a generalized effective friction matrix  $\Lambda(\mathbf{x})$ , which reads:

$$\Lambda(\mathbf{x}) = \Gamma(\mathbf{x}) + \frac{\tau}{\gamma} F(\mathbf{x}) \frac{\nabla u(\mathbf{x})}{u(\mathbf{x})},$$
(8)

where  $\Gamma(\mathbf{x})$  is given by the expression for constant  $u(\mathbf{x}) = v_0$  (see Eq. (7)). The new term in Eq. (8) linearly increases with increasing  $\tau$  and provides a further spatial dependence to the friction matrix. Its sign is determined by  $\nabla u(\mathbf{x})$  and  $\mathbf{F}(\mathbf{x}) = -\nabla U(\mathbf{x})$ , such that it can increase (positive sign) or decrease (negative sign) the effective friction. As a matter of fact, the spatial modulation of the swim velocity and the action of an effective potential are two distinct physical phenomena, which cannot be simply mapped onto each other. Indeed,  $u(\mathbf{x})$  provides an additional contribution to the effective friction in the dynamics of  $\mathbf{v}$  but does not give any contributions to the confining force, at variance with the potential  $U(\mathbf{x})$  that affects both the force acting on the particle and the effective friction matrix (see footnote [76] for an explicit example with a detailed discussion of the physical implications). Moreover, the interplay between the gradients of both fields in the second term of Eq. (8) gives rise to nontrivial physical effects that will be investigated in the following.

## 3 Theoretical predictions

#### 3.1 Approximate stationary distributions

So far, all steps in Sec. 2.2 were exact and the drawn conclusions general. To make further theoretical progress, we continue to restrict ourselves to a static swim-velocity profile  $u(\mathbf{x})$ . At variance with the potential-free case,  $U(\mathbf{x}) = 0$ , the exact steady-state probability distribution of positions and velocities,  $p(\mathbf{x}, \mathbf{v})$ , is unknown and one needs to resort to approximations. To this end, we assume that all components of the probability current vanish, as in the case of a homogeneous swim velocity,  $u(\mathbf{x}) = v_0$ . As shown in Appendix B, this condition means that in the Fokker-Planck equation associated to Eq. (6) the effective drift and diffusive terms mutually balance. To derive a closed expression for the spatial density  $\rho(\mathbf{x})$ , we follow in Appendix B the idea of Hänggi and Jung behind the Unified Colored Noise Approximation (UCNA) [77–79]: having derived the auxiliary dynamics (6), where the colored noise  $\eta$  is replaced by a white noise  $\chi$ , we formally identify a new variable  $\dot{\mathbf{z}} := \dot{\mathbf{x}}/u(\mathbf{x})$  to eliminate the multiplicative nature of the noise and then neglect the generalized inertial term  $\propto \ddot{\mathbf{z}}$  in Eq. (6b). This procedure yields an effective overdamped equation for the particle position **x** and finally, via the associated Smoluchowski equation for the time evolution of  $\rho(\mathbf{x},t)$ , the stationary density distribution  $\rho(\mathbf{x})$  for a system with space-dependent activity. Our theoretical method employs the vanishing-currents approximation and, as a consequence, allows us to derive an effective equilibrium theory whose validity will be investigated numerically. In the absence of thermal noise, the same (stationary)  $\rho(\mathbf{x})$  can be obtained using the path-integral method proposed by Fox [80,81]. As already shown in the case of homogeneous swim velocity, both the UCNA and the Fox approach give rise to the exact distribution in the small-persistence regime, i.e., when the persistence time is smaller than the other typical times characterizing the dynamics, while they only capture the qualitative behavior of the system in the opposite regime (i.e., when the persistence time is comparable or larger than the other relevant time scales). In particular, in the present case,  $\tau$  needs to be compared to both the relaxation time due to the potential and to the typical time induced by the spatial modulation of the swim-velocity profile (see Sec. 4.1 for an explicit discussion in the specific case of a harmonic oscillator).

Here, we report only the main results while the details of the derivation can be found in Appendix B. The whole stationary probability distribution reads:

$$p(\mathbf{x}, \mathbf{v}) \approx \rho(\mathbf{x}) \frac{\sqrt{\det[\mathbf{\Lambda}(\mathbf{x})]}}{\sqrt{2\pi}u(\mathbf{x})} \exp\left(-\frac{\mathbf{v} \cdot \mathbf{\Lambda}(\mathbf{x}) \cdot \mathbf{v}}{2u^2(\mathbf{x})}\right).$$
 (9)

We remark that the prefactor  $\sqrt{\det[\Lambda(\mathbf{x})]}/(\sqrt{2\pi}u(\mathbf{x}))$  is the explicit factor normalizing the conditional velocity distribution (i.e., at fixed position  $\mathbf{x}$ ). The function  $\rho(\mathbf{x})$  is approximated by

$$\rho(\mathbf{x}) \approx \frac{\mathcal{N}}{u(\mathbf{x})} \det[\Lambda(\mathbf{x})] \exp\left(\frac{1}{\gamma \tau} \int_{-\infty}^{\infty} d\mathbf{y} \cdot \frac{\Lambda(\mathbf{y}) \cdot \mathbf{F}(\mathbf{y})}{u^2(\mathbf{y})}\right)$$
(10)

with  $\mathcal{N}$  being a normalization constant. Our expression for  $\rho(\mathbf{x})$  coincides with the spatial density because it follows from integrating out the velocity in Eq. (9). The full distribution (9) displays a multivariate Gaussian profile in the velocity, whose covariance matrix accounts for the nontrivial coupling between velocity and position:

$$\langle \mathbf{v}\mathbf{v}(\mathbf{x})\rangle = u^2(\mathbf{x})\mathbf{\Lambda}^{-1}(\mathbf{x}).$$
 (11)

The covariance  $\langle \mathbf{vv}(\mathbf{x}) \rangle$  is spatially modulated by  $u(\mathbf{x})$ , which also occurs in the potential-free case, so that, in the regions where the swim velocity is large, the particle moves faster. Moreover, the external potential not only affects the velocity covariance through  $\Gamma(\mathbf{x})$ , as in the case  $u(\mathbf{x}) = v_0$  (see for instance Refs. [82,83]), but contains an additional spatial dependence through the coupling to the velocity gradient in the second term of Eq. (8).

We remark that a necessary condition to obtain predictions (9) and (10) (and, consequently, (11)) is that the matrix  $\Lambda$  is positive definite, so that its inverse exists. This is the main limitation of our theoretical approach, which is always suitable to describe the system in the small-persistence regime (when  $\tau$  is small compared to the other relevant time scales), but can break apart in the large-persistence regime where the position-dependent part of the matrix  $\Lambda(\mathbf{x})$  becomes dominant (with respect to  $\mathbf{I}$ ). As a consequence, our approach is supposed to work (at least qualitatively) in any spatial dimension and for every value of  $\tau$  if (i)  $U(\mathbf{x})$  is a convex function, (ii)  $U(\mathbf{x})$  depends on a single Cartesian coordinate or has a positive slope in a radial geometry and (iii) the gradients of  $U(\mathbf{x})$  and  $u(\mathbf{x})$  enclose a sufficiently large angle  $\alpha \geq \pi/2$ . The requirements (i) and (ii) correspond to a positive definiteness of  $\Gamma(\mathbf{x})$ , given in Eq. (7), and are thus already necessary for  $u(\mathbf{x}) = v_0$  [72], while (iii) arises in addition from the second term in Eq. (8). If the two functions  $U(\mathbf{x})$  and  $u(\mathbf{x})$  violate either of the three conditions (i-iii), our predictions cannot qualitatively reproduce the behavior of a system for large enough  $\tau$ .

Since the distribution  $\rho(\mathbf{x})$  from Eq. (10) can be interpreted as the effective density distribution of the system, the particle behaves as if it was subject to an effective potential,  $\mathcal{V}(\mathbf{x}) := -\tau \gamma v_0^2 \ln(\rho(\mathbf{x}))$ , which explicitly reads:

$$V(\mathbf{x}) = -v_0^2 \int_0^x d\mathbf{y} \cdot \frac{\mathbf{\Lambda}(\mathbf{y}) \cdot \mathbf{F}(\mathbf{y})}{u^2(\mathbf{y})} - \tau \gamma v_0^2 \ln \left( v_0 \frac{\det[\mathbf{\Lambda}(\mathbf{y})]}{u(\mathbf{x})} \right)$$
(12)

up to a constant. This expression contains two terms, i) the spatial integral of the external force modulated by the inverse of the covariance matrix of the velocity distribution, cf. Eq. (11), and ii) the logarithm containing both the velocity modulation  $u(\mathbf{x})$  and the determinant of the position-dependent matrix  $\mathbf{\Lambda}^{-1}(\mathbf{x})$ . For a constant swim velocity,  $u(\mathbf{x}) = v_0$ , we can perform the integral explicitly and the effective potential  $\mathcal{V}(\mathbf{x})$  reduces to the known closed form found

within the standard UCNA or Fox approach [72] since we neglect translational Brownian noise. Note that the spatial dependence of the swim velocity gives rise to an additional potential term with respect to the case  $u(\mathbf{x}) = v_0$  contained in the expression for  $\Lambda(\mathbf{x})$ . At equilibrium, when  $u(\mathbf{x}) = v_0$  and  $\tau \to 0$ , the density reduces to the well known Maxwell-Boltzmann profile, since  $\Lambda(\mathbf{x})$  becomes unity.

Finally, we remark that there exists a formal mapping of a system subject to a spatially dependent swim velocity, represented by a multiplicative noise in Eq. (2a), to a system with an effective external potential and additive noise. This mapping is mediated by a change of variables, reported and discussed in appendix C for completeness. Such a trick has been proven particularly helpful to find the explicit solution in a one-dimensional Run&Tumble model without external potential [84]. In our case, the newly defined variable allows us to identify the proper acceleration term which should be neglected to obtain the final UCNA result. However, to describe physically meaningful coordinates, i.e., the position and velocity of an AOUP, it is imperative to account for the notion of a swim velocity field  $u(\mathbf{x})$  in the stationary distributions of an AOUP stated above.

#### 3.2 Multiscale method for the full-space distribution

To check the validity of our predictions, at least in the small-persistence regime, we resort to an exact perturbative approach in powers of the persistence time  $\tau$ . For simplicity, the technique is presented in the one-dimensional case because the generalization to higher dimensions is technically more involved and does not provide additional insight. In addition, as in experiments based on active colloids [19], we will consider a one-dimensional swim-velocity profile u(x) in the remainder of this work, justifying our particular attention to the one-dimensional case in the following presentation.

Our starting point is the following Fokker-Planck equation for the probability distribution p(x, v, t):

$$\partial_t p = \frac{\Lambda(x)}{\tau} \frac{\partial}{\partial v} (vp) + \frac{u^2(x)}{\tau} \frac{\partial^2}{\partial v^2} p - \frac{F(x)}{\tau \gamma} \frac{\partial}{\partial v} p - v \frac{\partial}{\partial x} p - \frac{1}{u(x)} \left( \frac{\partial}{\partial x} u(x) \right) \frac{\partial}{\partial v} \left( v^2 p \right), \quad (13)$$

associated to the dynamics (6) in one spatial dimension. Its solution is unknown for a general potential U(x), even in the special case  $u(x) = v_0$ . Therefore, one needs to resort to approximation methods or perturbative strategies to obtain analytical insight. As shown in previous works [85, 86], it is possible to obtain perturbatively both the full distribution p(x, v, t) and the configurational Smoluchowski equation for the reduced space distribution p(x, t) following the method developed by Titulaer in the seventies [87]: starting from the Fokker-Planck equation (13) the velocity degrees of freedom can be eliminated by using a multiple-time-scale technique. Physically speaking, the fast time scale of the system corresponds to the time interval necessary for the velocities of the particles to relax to the configurations consistent with the values imposed by the vanishing of the currents. The characteristic time of the slow time scale is much longer and corresponds to the time necessary for the positions of the particles to relax towards the stationary configuration.

In the present case, the perturbative parameter is the persistence time  $\tau$ . Since we are mainly interested in time-independent properties, we limit ourselves to compute the steady-state probability distribution by generalizing the results of Refs. [88, 89] previously obtained for the case  $u(x) = v_0$  (see also Ref. [90] for a more general expansion with an additional thermal noise). For space reasons, the details of the calculations are reported in Appendix D. Our main result is the following exact perturbative expansion of the distribution p(x, v) in

powers of the parameter  $\tau$ : [91]

$$p(x,v) = \rho_s(x)p_s(x,v) \left\{ 1 + \frac{\tau}{\gamma} \left[ \frac{1}{2}U''(x) - \frac{v^2}{2u^2(x)}U''(x) + \left( \frac{v^2}{2u(x)^2} - \frac{1}{2} \right)U'(x) \frac{u'(x)}{u(x)} \right] + \frac{\tau^2}{6\gamma}u(x) \left( \frac{v^3}{u^3(x)} - 3\frac{v}{u(x)} \right) \left[ U'''(x) - \frac{\partial}{\partial x} \left( \frac{U'(x)}{u(x)} u'(x) \right) \right] \right\} + O(\tau^3)$$
(14)

where the normalized distribution  $p_s(x, v)$  is given by

$$p_s(x,v) = \frac{\mathcal{N}}{\sqrt{2\pi}u(x)} \exp\left(-\frac{v^2}{2u^2(x)}\right),\tag{15}$$

and the function  $\rho_s(x)$  reads

$$\rho_s(x) = \mathcal{N} \frac{\Lambda(x)}{u(x)} \exp\left(-\frac{1}{\gamma \tau} \int_{-\infty}^{\infty} dy \, U'(y) \frac{\Lambda(y)}{u^2(y)}\right). \tag{16}$$

with the normalization factor  $\mathcal{N}$  and the prime as a short notation for the spatial derivative. Already at order  $\tau/\gamma$  our general result (14) for a nonuniform swim velocity contains an extra term proportional to  $\partial_x u(x)$ , compared to the expansion derived in Ref. [88, 89, 91], which is responsible for an additional coupling between position and velocity.

The product  $\rho_s(x) \times p_s(x, \nu)$  in Eq. (14) plays the role of an effective equilibrium-like distribution, which is exact in the limit  $\tau \to 0$ . The required expression (15) for  $p_s(x, \nu)$  is the exact solution of the potential-free active system with a spatially dependent swim velocity as derived in Ref. [74]: it is a Gaussian probability distribution for the particle velocity  $\nu$  with an effective position-dependent kinetic temperature provided by  $u^2(x)$ . The spatial density  $\rho_s(x)$  from Eq. (16) corresponds to the UCNA result (10) in one dimension. Our previous approximated expression (9) for  $p(x,\nu)$  is consistent with the full result (14) at first order in the expansion parameter  $\infty$   $\tau$ . The first deviation between the two formulas occurs at order  $O(\tau^2)$ , where the exact expression for  $p(x,\nu)$  contains additional odd terms in  $\nu$ . The exact density profile  $\rho(x) = \int d\nu p(x,\nu) = \rho_s(x) + O(\tau^2)$  deviates from the UCNA result beyond linear orders in  $\tau$ . As a consequence, we expect that our UCNA approximation,  $\rho_s(x)$ , is exact in the small-persistence regime, while it could only reproduce the qualitative behavior of  $\rho(x)$  in the large-persistence regime.

#### 4 The harmonic oscillator

#### 4.1 Swim-velocity profile and external potential in one dimension

In this section, we present and investigate the interplay between a spatially modulated swim velocity and an external confining potential in one spatial dimension. While, in Sec. 3.2, we have shown that our analytical predictions from Eqs. (9), (10) and (11) are exact in the small-persistence regime through analytical arguments, a numerical analysis is necessary to check our approximations in the large-persistence regime.

To fix the form of the profile u(x) employed in our numerical study and theoretical treatment, we take inspiration from experimental works on active colloids [19] and consider a static periodic profile u(x) varying along a single direction, namely the x axis, so that:

$$u(x) = v_0 \left( 1 + \alpha \cos \left( 2\pi \frac{x}{S} \right) \right), \tag{17}$$

where  $\alpha < 1$  and  $v_0 > 0$  so that u(x) > 0 for every x. The parameter  $\alpha$  determines the amplitude of the swim velocity oscillation while S > 0 sets its spatial period. As a consequence,

the active particle is subject to the minimal swim velocity  $v_0(1-\alpha)$  and to the maximal one  $v_0(1+\alpha)$ . This choice and the features of the AOUP allow us to consider directly a one-dimensional system, essentially focusing only on the x component and neglecting the dynamics of the other spatial coordinates.

We remind that, in the potential-free case [56], the system admits two typical length scales, i.e., the persistence length  $v_0\tau$  and the spatial period, S, of the swim-velocity profile (17). In other words, by rescaling the time by  $\tau$  and the particle position by  $v_0\tau$ , the dynamics is controlled by the dimensionless parameter  $v_0\tau/S$  and by the dimensionless parameter  $\alpha$  quantifying the amplitude of the swim-velocity oscillation. The external force F(x) then introduces at least one additional length-scale,  $\ell$ , which depends on the specific nature of F, and, thus, an additional dimensionless parameter, say  $\ell/(v_0\tau)$ , related to the external potential. The last dimensionless parameter controls the dynamics also in the case  $u(x) = v_0$  [92]. Now, we can identify the small-persistence regime, where the self-propulsion velocity relaxes faster than the particle position, with the criterion  $v_0\tau/S \ll 1$  and  $\ell/(v_0\tau) \gg 1$ . Under the former condition, we expect that the system behaves as its passive counterpart: if  $\tau \ll S/v_0$  holds, the self-propulsion behaves as an effective white noise. In the opposite case, when  $v_0\tau/S \gg 1$ , the dynamics is strongly persistent and we expect intriguing nonequilibrium properties.

To proceed further with the numerical investigation, we consider a simple shape for the confinement, i.e., the harmonic potential

$$U(x) = \frac{k}{2}x^2,\tag{18}$$

where the constant k determines the strength of the linear force. The dimensionless parameter associated with this external potential is thus  $k\tau/\gamma$ , i.e.,  $\ell=\nu_0\tau^2k/\gamma$ . By observing that the curvature of the potential is constant, the effective friction coefficient  $\Lambda(x)$  from Eq. (8) becomes:

$$\Lambda(x) = \left(1 + \tau \frac{k}{\gamma}\right) \left(1 + \frac{\alpha x}{u(x)^2} \frac{2\pi}{S} \sin\left(2\pi \frac{x}{S}\right) \frac{\tau \frac{k}{\gamma}}{1 + \tau \frac{k}{\gamma}}\right). \tag{19}$$

As shown by Eq. (19), the two dimensionless parameters  $\tau k/\gamma$  and  $\alpha$  play a similar role. Indeed, they only determine the relative amplitude of the spatial modulation of  $\Lambda(x)$ . When either  $\alpha$  or  $\tau k/\gamma$  vanish, the effective friction becomes constant and the coupling between velocity and position disappears. Instead, when we approach both limits  $\tau k/\gamma \to \infty$  and  $\alpha \to 1$ , the amplitude of the spatial oscillations becomes maximal. By varying the dimensionless parameter  $v_0 \tau/S$ , on the other hand, one can explore the different properties of the system: when  $v_0 \tau/S$  grows, the spatial period of u(x) decreases and the position-dependent term of  $\Lambda(x)$  becomes less relevant. To study the resulting behavior of the system in detail, we keep fixed  $\alpha = 0.9$  and  $\tau k/\gamma = 1$  and we change only  $v_0 \tau/S$  to study the properties of the system.

#### 4.2 Density distribution

Before considering the peculiar behavior of an AOUP with spatial-dependent swim velocity and confined in a harmonic trap (18), it is useful to remind the reader that, in the absence of motility landscape, the AOUP in a harmonic trap is described by a Gaussian density. The spatial density profile,  $\rho(x)$ , are shown in Figs. 1 and 2 for the spatial profile of u(x) given by Eq. (17). The bottom panels show  $\rho(x)$  for different values of the spatial period S (through the dimensionless parameter  $v_0\tau/S$ ) of the swim velocity u(x), which we compare in the top panels to the modulus  $|F(x)|/\gamma$  of the confining force F(x) = -U'(x) as a reference.

In the small-persistence regime,  $v_0\tau/S \ll 1$  (see panels (a) and (c) of Fig. 1), the unimodal density distribution is fairly described by expanding the UCNA solution (10) in powers of x/S,

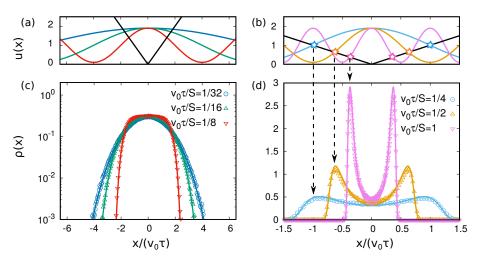


Figure 1: Density distributions. Panels (a) and (b): swim-velocity profile u(x) for different values of S (colored curves), compared with the modulus of the linear force profile,  $|F(x)| = -k|x|/\gamma$  (black curve) as a reference. The colored stars are placed at the first cross point between u(x) and  $F(x)/\gamma$ . Panels (c) and (d): spatial density profile,  $\rho(x)$ , for different values of S. Points are obtained by numerical simulations while solid lines by plotting the theoretical prediction (10) (that reduces to Eq. (16) in one dimension with  $\Lambda(x)$  given by Eq. (19)). The integral occurring in Eq. (16) has been performed numerically. Panels (a), (c) and (b), (d) share the same legend. Simulations are realized in one spatial dimension with  $\tau k/\gamma = 1$  and  $\alpha = 0.9$ .

obtaining:

$$\rho(x) \sim \exp\left(-\frac{1+\tau \frac{k}{\gamma}}{(1+\alpha)^2} \frac{k}{v_0^2} \frac{x^2}{2}\right).$$
(20)

In the expression (20), we have neglected the terms proportional to  $x^2/S^2$ ,  $x^4/S^2$  and all higher-order terms in power of  $\sim 1/S$ . Remarkably, even in this crude approximation, we see from the factor  $(1 + \alpha)^2$  that the oscillations of the swim velocity lead to a decrease of the second moment  $\langle x^2 \rangle$  of  $\rho(x)$  compared to the homogeneous case  $u(x) = v_0$ . This prediction is consistent with previous results obtained in the absence of an external potential, where the swim-velocity oscillations produce the decrease of the long-time diffusion coefficient [74] (see also Ref. [93]). In this regime, the spatial pattern u(x) produces an effective potential with increasing stiffness for increasing spatial modulation. For higher  $v_0 \tau/S$ , the distribution starts developing non-Gaussian tails, which are still well-described by including higher-order terms in the UCNA expansion (20).

When increasing  $v_0\tau/S$  further (see panels (b) and (d) of Fig. 1),  $\rho(x)$  becomes a bimodal distribution with two peaks symmetric to the origin, as in a system confined in a double-well potential. This effect is absent in the case  $u(x) = v_0$  where the AOUP density distribution in a harmonic potential always has a Gaussian shape [60, 94–96]. For a position-dependent swim velocity, the comparison between the analytical result (10) (that reduces to Eq. (16) in one dimension) and the numerical simulations still reveals a good agreement: in particular, Eq. (10) is able to predict the observed bimodality of the distribution. To explain the occurrence of this bimodality in the shape of  $\rho(x)$ , we can use an effective (but rather general) force-balance argument in Eq. (2a). This argument can be applied to the present intermediate-persistence regime,  $v_0\tau/S \sim 1$  (or also for  $v_0\tau/S \gg 1$  discussed later), where the self-propulsion vector  $\eta$  in the active force can be considered to be roughly constant for typical times  $t \lesssim \tau$ . Since the variance of  $\eta$  is unitary, the most likely value assumed by the self-propulsion velocity at point

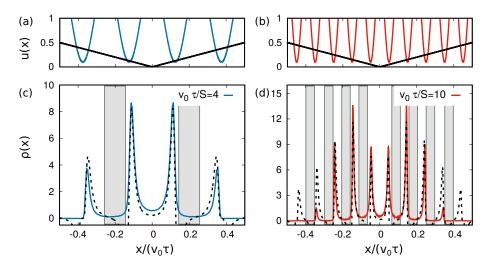


Figure 2: Density distributions. Panels (a) and (b): swim-velocity profile u(x) for two different values of S (colored curves), compared with the modulus of the linear force profile,  $|F(x)| = -k|x|/\gamma$  (black curve) as a reference. Panels (c) and (d): spatial density profile,  $\rho(x)$ , for different values of S. Solid colored lines (blue in panel (c) and red in panel (d)) are obtained by numerical simulations while dashed black lines by plotting the theoretical prediction (10) (that reduces to Eq. (16) in one dimension with  $\Lambda(x)$  given by Eq. (19)). The integral occurring in Eq. (16) has been performed numerically. Grey rectangles are drawn in the regions where Eq. (10) is not defined, say when  $\Lambda(x) < 0$  (see the main text for more details). Panels (a), (c) and (b), (d) share the same legend. Simulations are realized in one spatial dimension with  $\tau k/\gamma = 1$  and  $\alpha = 0.9$ .

x is simply u(x) (in absolute value). For this reason, it is generally unlikely to find the particle in regions with  $u(x) < |F(x)|/\gamma$ , because there the particle's self propulsion is not sufficient to climb up the potential gradient. Moreover, in the spatial points where  $u(x) > |F(x)|/\gamma$ , the active particle does not get stuck on average because its high self-propulsion velocity allows for its directed motion until  $u(x) = |F(x)|/\gamma$  is fulfilled. When this force balance occurs, the particle can explore further spatial regions only because of large (and rare) fluctuations of  $\eta$ . This reasoning is confirmed by inspecting Fig. 1 for different fixed values of  $v_0\tau/S$ . It is evident from the dashed arrows that the peaks of the distribution in Fig. 1(d) coincide with the intersection between the modulus  $|F(x)|/\gamma$  of the external force (black curve) and u(x) (colored curves) in Fig. 1(c).

Starting from the theoretical result (10), we can predict the critical value  $S_c$  at which the distribution becomes bimodal, by simply requiring that  $d^2/dx^2\rho(x) = 0$  (at x = 0), obtaining:

$$\frac{S_c^2}{v_0^2 \tau^2} = (2\pi)^2 \alpha (1+\alpha) \left[ \frac{1+3\tau \frac{k}{\gamma}}{\left(1+\tau \frac{k}{\gamma}\right)^2} \right] \frac{\gamma}{k\tau} \,. \tag{21}$$

In general, we predict that the value of  $S_c/(v_0\tau)$  increases with increasing  $\alpha$  (recall that  $0 < \alpha < 1$ ) and is a decreasing function of  $\tau k/\gamma$ . This is consistent with our physical intuition: larger oscillations (i.e., larger  $\alpha$ ) facilitate the transition to a bimodal shape. Indeed, the larger  $\alpha$ , the smaller the minimal self-propulsion velocity, that hinders the particle's ability to come back to the origin. Instead, the increase of  $\tau k/\gamma$  gives rise to the opposite behavior: the larger  $\tau k/\gamma$ , the steeper the effective confining trap. As a consequence, the active particle needs larger fluctuations of  $\eta$  to reach spatial regions where u(x) assumes low values which

compete with the external force. Specifically, for the chosen parameters  $\alpha = 0.9$  and  $\tau k/\gamma = 1$ , Eq. (21) predicts the onset of bimodality for  $v_0\tau/S > 1/8$ . From Fig. 1, we also observe that the increase of  $v_0\tau/S$  beyond this threshold enhances the bimodality showing two symmetric peaks with increasing height but occurring at spatial positions which get closer.

In the large-persistence regime  $v_0 \tau / S \gg 1$  (see Fig. 2), we observe the emergence of many symmetric peaks in  $\rho(x)$ . Their positions are still determined by the balance between u(x)and  $|F(x)|/\gamma$ , and, in this case, roughly coincide with the minima of u(x) close to the origin (i.e., the minimum of U(x)). As shown in Fig. 2 (a), u(x) first crosses  $|F(x)|/\gamma$  almost in its first minima (at  $x/v_0\tau \approx \pm 0.15$ ) for  $v_0\tau/S = 4$ . This implies that small fluctuations of the self-propulsion velocity allows the particle to explore spatial regions which are even more distant from the potential minimum, so that it also accumulates at the second crossing point (at  $x/v_0\tau \approx 0.4$ ). According to Fig. 2 (c), the height of these secondary peaks is smaller than that of the primary ones because the particle remains trapped at the first balance points for most of the time, while only on rare occasions its swim velocity is sufficient to further climb up the potential gradient. In Fig. 2 (d), for an even larger value of  $v_0 \tau / S = 10$ , we observe that the height of the peaks near the origin is lower than that of the successive peaks. In this case, Fig. 2 (b) shows that the minima of u(x) closest to the origin are still larger than  $|F(x)|/\gamma$ , so that (most of the time) the particle has a sufficiently large self-propulsion velocity to go further until entering the spatial region where the first intersection of u(x) and  $|F(x)|/\gamma$  occurs. We conclude that, even in the case of a harmonic potential, the oscillation of the swim velocity allows the AOUP to climb up the potential barrier and accumulate preferably in spatial regions (corresponding to minima of u(x)), which are further away from the origin.

Finally, we note that in the large-persistence regime, the UCNA prediction (10) (or Eq. (16) in one-dimension) for the spatial distribution fails. This occurs because of the presence of spatial regions where the effective friction  $\Lambda(x)$ , given by Eq. (19), becomes negative (see the gray-shaded regions in Fig. 2(c) and (d)). This implies that also the corresponding approximation for  $\rho(x)$  can assume negative values. This failure resembles the one of the UCNA (or the Fox approach) for the standard AOUP model with  $u(x) = v_0$  confined in a nonconvex potential [72]. In that case, the strongly non-Gaussian nature of the system is at the basis of new intriguing phenomena, such as the occurring of effective negative mobility regions [97], the overcooling of the system [98] and the violation of the Kramers law for the escape properties [99, 100]. We expect that our model could display a similar phenomenology and that such problems can be treated by using similar theoretical techniques [97,101–103]. However, we stress that the generalized UCNA still accurately predicts the positions of the main peaks in Fig. 2 (c), although in Fig. 2 (d) there emerge additional smaller peaks further away from the origin, which are absent in simulations. The appearance of those fake peaks is reminiscent of the overestimated wall accumulation predicted by UCNA for  $u(x) = v_0$ .

#### 4.3 Velocity distribution

A potential-free AOUP in a motility landscape and an AOUP with constant swim velocity confined by harmonic traps are both described by Gaussian distributions of the velocity. To illustrate the new properties arising from the interplay between these two fields, we focus on the dependence of the full joint probability density p(x, v) on the velocity, shown in Fig. 3 for some representative values of the particle's position x. Moreover, we choose three different values of  $S/(v_0\tau)$  to explore the three distinct regimes observed in Sec 4.2. For each regime, we report once again the density distribution  $\rho(x)$  in panels (a), (b) and (c), where colored bars mark the regions for which we calculate p(x, v) as a function of v in panels (d), (e), (f), (g), (h).

In the regime of small persistence,  $(v_0\tau)/S \ll 1$ , the shape of p(v,x) is Gaussian, independently of the position x (Fig. 3 (d)). This result fully agrees with the prediction (9) (that

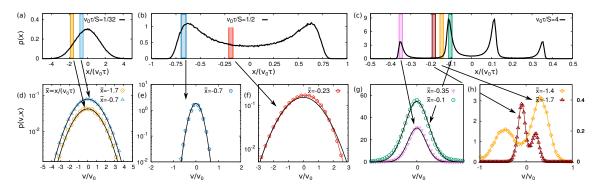


Figure 3: Velocity distributions. Panels (a), (b) and (c): simulated density distribution  $\rho(x)$  for  $S/(v_0\tau)=32,2,1/4$ , respectively, as a reference. Colored rectangles are drawn in correspondence of the spatial regions used to calculate the velocity distribution in the other panels. Panels (d), (e), (f), (g) and (h): velocity distribution p(v,x) as a function of v calculated at fixed positions  $x=\bar x v_0 \tau$  according to the legend. Panel (d) is calculated at S=32, panels (e) and (f) at S=2 and panels (g) and (h) at S=0.25. Colored symbols and lines are obtained by numerical simulations and solid black lines show the theoretical prediction (9) if applicable (the theory yields a one-dimensional Gaussian and requires a positive definiteness of  $\Lambda(x)$  given by Eq. (19)). Simulations are realized in one spatial dimension with  $\tau k/\gamma=1$  and  $\alpha=0.9$ .

simply reduces to a one-dimensional Gaussian) as revealed by the comparison between colored data points and black solid lines in Fig. 3 (d). As predicted by the position-dependent variance in Eq. (11), different positions x come along with a change in the width of the velocity distribution.

In Fig. 3 (e) and (f), the regime of intermediate persistence,  $v_0\tau/S \sim 1$ , is investigated, which displays a bimodality in the density distribution. Here, we compare p(x,v) calculated in the vicinity of a peak of  $\rho(x)$  to the velocity profile near the local minimum of  $\rho(x)$  (close to the origin). In the former case, the distribution p(x,v) displays an almost Gaussian shape in agreement with Eq. (9), while in the latter case, it deviates from the theoretical prediction due to its non-Gaussian nature. In particular, the shape of p(x,v) becomes asymmetric in v and develops non-Gaussian tails. While the prediction (9) cannot account for the non-Gaussianity induced by the interplay of confinement and spatially modulating swim velocity, we remark that its quality near the regions where the particle preferably accumulates is still very good. This conclusion resembles the one obtained in Ref. [92], where an AOUP (with  $u(x) = v_0$ ) has been studied in a single-well anharmonic confinement.

Finally, the large-persistence regime,  $v_0\tau/S\gg 1$ , where the density distribution has multiple peaks also gives rise to a rich phenomenology of the stationary velocity profile, as shown in Fig. 3 (g) and (h). In the spatial regions for which  $\Lambda(x)>0$ , i.e., where the particles accumulate, the velocity distribution p(x,v) (at fixed x) is again well described by the Gaussian distribution with position-dependent variance given by Eq. (9) (see Fig. 3 (g)), as in the case  $v_0\tau/S\lesssim 1$ . Instead, in the spatial regions where  $\Lambda(x)<0$ , i.e., between the primary and the secondary peaks (see also Fig. 2 (c)), the distribution displays a non-Gaussian shape (see Fig. 3 (h)). Compared to the case  $v_0\tau/S\sim 1$ , the non-Gaussianity is much more evident due to the occurrence of a bimodal behavior in the velocity distribution. In more detail, upon shifting the coordinate x in the first argument of p(x,v) closer to the origin (Fig. 3 (g) and (h)), we observe that, starting from a nearly Gaussian shape centered at v=0 (pink curve), the main peak moves toward v<0 and a second small peak starts growing for v>0 (brown curve). Shifting again x, the second peak becomes dominant (yellow curve) and moves closer toward v=0

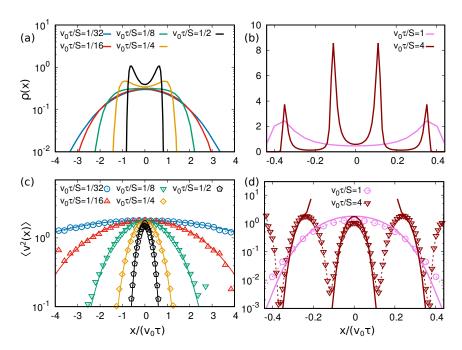


Figure 4: Spatial profiles of the kinetic temperature. Panels (a) and (b): simulated density profile  $\rho(x)$  for different values of the dimensionless parameter  $v_0\tau/S$  as a reference. Panels (c) and (d): kinetic temperature  $\langle v^2(x) \rangle$  with the same color legend. In particular, panels (a) and (c) show the small-persistence regime,  $v_0\tau/S \leq 1$ , while panels (b) and (d) display the intermediate-persistence and large-persistence regimes, namely  $v_0\tau/S \sim 1$  and  $v_0\tau/S \geq 1$ , respectively. Colored symbols (and dotted lines drawn as a guide to the eye) are obtained from numerical simulations while solid colored lines show the theoretical prediction (11) (in the regions where  $\Lambda(x)$ , given by Eq. (19), is positive definite). Simulations are realized in one spatial dimension with  $\tau k/\gamma = 1$  and  $\alpha = 0.9$ .

until the distribution is again described by a Gaussian (green curve). This phenomenology resembles the one observed in the case of an AOUP with  $u(x) = v_0$  in a double-well potential [97]. Also in the latter case, the velocity distribution at fixed position exhibits bimodality in the spatial regions where the effective friction coefficient  $\Lambda(x) \simeq \Gamma(x)$  becomes negative, although this effect is then induced by the negative curvature of the potential. Intuitively, particles that are stuck in an accumulation region placed far from the potential minima (where  $u(x)\eta$  balances the confining force) could move back towards the center or other minima when their active force varies because of the noise fluctuations. For example, when  $\eta$  changes sign (or  $|\eta|$  decreases), the particle comes back leftward or rightward (depending on the sign of  $\eta$ ) moving with a large velocity induced by the deterministic force (that is particularly large far from the potential minimum) until to reach a new accumulation region. This simple argument provides an additional intuitive explanation for the bimodality of the velocity distribution.

#### 4.4 Spatial profile of the kinetic temperature

To emphasize the dynamical effects due to the spatial modulation of the swim velocity, we focus on the profile of the kinetic temperature defined as the variance of the particle velocity,  $\langle v^2(x) \rangle$ . We show  $\langle v^2(x) \rangle$  as a function of x in Fig. 4 for values of  $v_0 \tau / S$  spanning all regimes from small (panel (c)) to intermediate and large persistence (panel (d)), see also panels (a) and (b) for a direct comparison with the corresponding density profiles.

For small values of  $v_0 \tau / S \ll 1$ , the spatial profile of the variance,  $\langle v^2(x) \rangle$ , is rather flat and

attains its maximum value at x=0, i.e., the position of the potential minimum (see Fig. 4 (c)). When  $v_0\tau/S$  increases, e.g., due to a shorter periodicity S of the swim-velocity u(x),  $\langle v^2(x) \rangle$  decreases upon moving away from the potential minimum. This is consistent with the scenario observed in Fig. 4 (a): the particles accumulate in the regions where they move slowly and the velocity variance is small. Such a result agrees with the observed behavior in the potential-free case (such that u(x) coincides the particle velocity), where the particles accumulate in regions corresponding to the minima of u(x), according to the law  $\rho(x) \sim 1/u(x)$ . In this regime, the comparison between numerical data and the theoretical prediction (11) (with  $\Lambda(x)$  given by Eq. (19)) shows a good agreement.

For larger values of  $v_0\tau/S$  (large-persistence regime), the velocity variance shows a more complex profile (see Fig. 4 (d)), which resembles the oscillating shape of u(x). In particular,  $\langle v^2(x) \rangle$  is very small near the peaks of the density distribution, while it assumes larger values in the regions where the density is very small and the probability of finding a particle is very low. This finding is consistent with the fact that active particles accumulate in the regions where the velocity variance is small and the observation of an increasing number of such regions for increasing  $v_0\tau/S$ . Finally, in this regime, the prediction (11) reproduces quite well the behavior near the origin but fails further away from it, specifically, in the regions where the effective friction displays negative values,  $\Lambda(x) < 0$ .

#### 5 Conclusion

In this paper, we have investigated the stationary behavior of an active particle subject to two competing spatially dependent drivings: the self-propulsion velocity and the external force. While the two mechanisms were already investigated separately, to the best of our knowledge, this is the first time that their interplay has been considered. Starting from a Fokker-Planck description of the particle's dynamics in our generalized AOUP model [56], we have developed a theoretical treatment, which provides the steady-state distribution (9) of both positions and velocities as a function of the input potential and of the swim-velocity profile. The theory presented here contains as special cases both the UCNA describing the time evolution of distribution of positions and velocities of an AOUP with constant swim velocity in an external field [59, 89], and the recent theory of a free AOUP driven by an inhomogeneous propulsion force, which is exact in the stationary case [74]. Our theoretical method is exact in the small-persistence regime, where it is consistent with the results obtained through an exact perturbative method, and also provides a useful approximation to qualitatively predict the shape of the distributions in the large-persistence regime.

Specifically, we have applied our theory to a one-dimensional AOUP in a sinusoidal motility landscape subject to a harmonic potential, observing intriguing effects, which arise from the interplay between these two fields. Indeed, it is known that an AOUP with constant swim velocity in a harmonic potential is described by Gaussian distributions for position and velocity [60,64] while the velocity distribution of a potential-free AOUP in a motility landscape is described by a Gaussian velocity distribution [74]. The joint effect of harmonic confinement and motility landscape revealed an intriguing scenario determined by the joint action of the self-propulsion velocity gradient and the external force. While, in the regime of small persistence, both the density and the velocity distributions are bell-shaped and well-approximated by Gaussians, we predict that, as the persistence length becomes comparable with the spatial period of the swim velocity, a transition from a unimodal to a bimodal density occurs, also accompanied by strong non-Gaussian effects in the velocity distribution. Interestingly, in the large-persistence regime, as the density shows multi-modality, the velocity distribution becomes bimodal in the spatial regions between two successive peaks of the density.

Despite our particular attention to one spatial dimension, we recall that we practically obtain the same results for a planar geometry in higher spatial dimensions and that we expect that our theory is also suitable for sufficiently well-behaved potentials and velocity fields in other geometries (compare the discussion in Sec. 3.1). While, for active colloids, the emergence of an additional effective torque due to the spatial modulation of the swim velocity could be responsible for an even more complex phenomenology [16, 19], we outline that our theory should be suitable in the case of engineered bacteria whose velocity profile can be manipulated by external light [25, 27]. From a pure theoretical perspective, our techniques may also be extended and applied to more complex dynamics, for instance accounting for the presence of thermal noise [72, 75], a spatially dependent torque [16, 19], or additional competing nonconservative force fields like a Lorentz force [104]. A final challenging research point concerns the dynamical properties of our model and, in particular, the extension of the theory to time-dependent swim-velocity profiles u(x, t), for instance in the form of traveling waves [23, 24, 49].

In conclusion, we have shown that the interplay between an external force and a spatially modulating swim velocity can be used to tune the behavior of a confined active particle, for instance by locally increasing the kinetic temperature or by forcing the particles to accumulate in particular spatial regions with different probability. We demonstrated that by combining these two physically distinct effects, it is possible to generate complex density patterns through relatively simple fields, as in our example a harmonic trap and a periodic velocity landscape. In practice, realizing such particle distributions through a single external field is surely more involved due to the required complex form of the potential. The possibility to fine-tune the stationary properties of active particles in experimental systems by adapting both the external force and the swim velocity opens up a new avenue for future applications and developments.

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## A Derivation of the auxiliary dynamics (6)

To derive the auxiliary dynamics (6), we start from Eq. (2a) choosing  $D_t = 0$ . We recall that following Ref. [75] it is possible to generalize the procedure also to include the more general case with  $D_t > 0$ . At first, we take the time-derivative of Eq. (2a), obtaining:

$$\gamma \ddot{\mathbf{x}} = -\nabla \nabla U \cdot \dot{\mathbf{x}} + \gamma \boldsymbol{\eta} \left( \frac{\partial}{\partial t} + \mathbf{v} \cdot \nabla \right) u(\mathbf{x}, t) + \gamma u(\mathbf{x}, t) \dot{\boldsymbol{\eta}}.$$
 (22)

By defining the  $\mathbf{v} = \dot{\mathbf{x}}$  as the particle velocity and replacing  $\dot{\mathbf{f}}_a$  with the dynamics (2b), we get:

$$\gamma \dot{\mathbf{v}} = -\nabla \nabla U \cdot \mathbf{v} + \gamma \eta \left( \frac{\partial}{\partial t} + \mathbf{v} \cdot \nabla \right) u(\mathbf{x}, t) + \gamma u(\mathbf{x}, t) \left( -\frac{\eta}{\tau} + \frac{\sqrt{2}}{\sqrt{\tau}} \chi \right). \tag{23}$$

Finally, by replacing  $\eta$  in favor of v and x, taking advantage of the relation (2a), we obtain the dynamics (6).

We remind that this sequence of operation is fully equivalent to performing a change of variables, by considering that the dynamics (2a) is a deterministic relation that allows us to replace  $\eta$  with x and y. The Jacobian matrix  $\mathcal J$  of this transformation  $\mathbf a=(x,\eta)\to\mathbf b=(x',y)$  with  $\mathbf x'=x$  reads:

$$\mathcal{J} = \frac{\partial \mathbf{b}}{\partial \mathbf{a}} = \begin{bmatrix} \frac{\partial \mathbf{x}'}{\partial \mathbf{x}} & \frac{\partial \mathbf{x}'}{\partial \mathbf{\eta}} \\ \frac{\partial \mathbf{v}}{\partial \mathbf{x}} & \frac{\partial \mathbf{v}}{\partial \mathbf{\eta}} \end{bmatrix} = \begin{bmatrix} 1 & 0 \\ 0 & u(\mathbf{x}) \end{bmatrix}. \tag{24}$$

The determinant of this matrix,  $det[\mathcal{J}] = u(\mathbf{x})$ , yields the Jacobian of the transformation as stated in Eq. (4).

## B Derivation of predictions (9) and (10)

To predict the shape of the stationary probability distributions,  $p(\mathbf{x}, \mathbf{v})$  and  $\rho(\mathbf{x})$ , stated in Sec. 3, we start from the dynamics in the variables  $\mathbf{x}$  and  $\mathbf{v}$ , namely Eq. (6), for a static profile of the swim velocity,  $u(\mathbf{x})$ . Switching to the Fokker-Planck equation for  $p = p(\mathbf{x}, \mathbf{v}, t)$ , we obtain the exact time evolution:

$$\partial_t p = \nabla_v \cdot \left( \frac{\mathbf{\Gamma}}{\tau} \cdot \mathbf{v} p + \frac{u^2(\mathbf{x})}{\tau} \nabla_v p \right) - \mathbf{v} \cdot \nabla p + \nabla \cdot \frac{\nabla U}{\gamma \tau} p - \nabla_v \cdot \frac{[\gamma \mathbf{v} + \nabla U]}{\gamma u(\mathbf{x})} (\mathbf{v} \cdot \nabla) u(\mathbf{x}), \quad (25)$$

where  $\nabla$  and  $\nabla_{\nu}$  are the vectorial derivative operators in position and velocity space, respectively. Balancing the diffusion term (proportional to the Laplacian of  $\mathbf{v}$ ) and the other effective friction terms (say the one linearly proportional to  $\mathbf{v}$ ), we get the approximate condition [82]:

$$0 = \nabla_{v} \cdot \left( \frac{\mathbf{\Lambda}}{\tau} \cdot \mathbf{v} p + \frac{u^{2}(\mathbf{x})}{\tau} \nabla_{v} p \right)$$
 (26)

with the effective friction matrix

$$\Lambda(\mathbf{x}) = \mathbf{I} + \frac{\tau}{\gamma} \nabla \nabla U(\mathbf{x}) - \frac{\tau}{\gamma} \nabla U(\mathbf{x}) \frac{\nabla u(\mathbf{x})}{u(\mathbf{x})}, \tag{27}$$

that has been defined in Eq. (8). The condition (26) corresponds to requiring that the divergence of the irreversible (with respect to time-reversal transformations) currents is zero. To proceed further, we require that the irreversible currents vanish, i.e., that the expression in the brackets of Eq (26) is zero in the same spirit of Ref. [89]. This choice is consistent with an effective equilibrium approach and allows us to find the explicit approximate steady-state solution for  $p(\mathbf{x}, \mathbf{v})$  as

$$p(\mathbf{x}, \mathbf{v}) \propto g(\mathbf{x}) \exp\left(-\frac{\mathbf{v} \cdot \mathbf{\Lambda}(\mathbf{x}) \cdot \mathbf{v}}{2u^2(\mathbf{x})}\right),$$
 (28)

where  $g(\mathbf{x})$  is a function purely depending on  $\mathbf{x}$ , which is still to be determined. Expressing  $g(\mathbf{x}) = \rho(\mathbf{x}) \sqrt{\det[\Lambda(\mathbf{x})]}/(\sqrt{2\pi}u(\mathbf{x}))$  without loss of generality, we obtain Eq. (9), where  $\rho(\mathbf{x})$  represents the density of the system derived below.

To determine the function  $\rho(\mathbf{x})$ , we first identify the acceleration term [78]

$$u(\mathbf{x})\frac{d}{dt}\frac{\mathbf{v}}{u(\mathbf{x})} = \dot{\mathbf{v}} - \frac{\mathbf{v}}{u(\mathbf{x})}(\mathbf{v} \cdot \nabla)u(\mathbf{x})$$
(29)

in the dynamics (6) with  $\partial u(\mathbf{x})/\partial t = 0$ , see appendix C for more details. Assuming that the velocity relaxes faster than the position (as for example in the small-persistence regime) allows us to neglect both these terms in Eq. (6), obtaining the following overdamped equation:

$$\dot{\mathbf{x}} = -\frac{1}{\gamma} \mathbf{\Lambda}^{-1} \cdot \nabla U + \sqrt{2\tau} u(\mathbf{x}) \mathbf{\Lambda}^{-1} \cdot \mathbf{\chi} . \tag{30}$$

From this dynamics, it is convenient to switch to the effective Smoluchowski equation for the density of the system,  $\rho(\mathbf{x}, t)$ , and use the Stratonovich convention, obtaining:

$$\frac{\partial \rho}{\partial t} = \frac{\partial}{\partial x_i} \left( \frac{1}{\gamma} \Lambda_{ij}^{-1} \left( \frac{\partial U}{\partial x_i} \right) \rho + \tau u \Lambda_{ik}^{-1} \frac{\partial}{\partial x_i} \left[ \Lambda_{jk}^{-1} u \rho \right] \right). \tag{31}$$

Here and in what follows, we have explicitly written Latin indices for the spatial components of vectors and matrices and adopted also the Einstein's convention for repeated indices, for convenience.

To proceed, we assume the zero-current condition (as in Refs. [59, 105]), obtaining an effective equation for the stationary density  $\rho(\mathbf{x})$ :

$$\frac{1}{\gamma} \Lambda_{ij}^{-1} \left( \frac{\partial U}{\partial x_j} \right) \rho + \tau u \Lambda_{ik}^{-1} \frac{\partial}{\partial x_j} \left[ \Lambda_{jk}^{-1} u \rho \right] = 0.$$
 (32)

Multiplying by  $\Lambda_{lh}\Lambda_{hi}$  and summing over repeated indices, we get the following relation after some algebraic manipulations

$$\frac{1}{\gamma \tau u^2} \Lambda_{lj} \frac{\partial U}{\partial x_j} + \Lambda_{lk} \frac{\partial}{\partial x_j} \Lambda_{jk}^{-1} + \frac{\Lambda_{lk} \Lambda_{jk}^{-1}}{u \rho} \frac{\partial}{\partial x_j} [u \rho] = 0,$$
 (33)

whose solution for the density distribution  $\rho(\mathbf{x})$  reads:

$$\rho(\mathbf{x}) \approx \frac{\mathcal{N}}{u(\mathbf{x})} \exp\left(\frac{1}{\gamma \tau} \int_{-\infty}^{x} d\mathbf{y} \cdot \frac{\mathbf{\Lambda}(\mathbf{y}) \cdot \mathbf{F}(\mathbf{y})}{u^{2}(\mathbf{y})} + \int_{-\infty}^{x} d\mathbf{y} \cdot \mathbf{\Lambda}(\mathbf{y}) \cdot \nabla \cdot \mathbf{\Lambda}^{-1}(\mathbf{y})\right). \tag{34}$$

Finally, by assuming a planar symmetry for both u and U, we have  $\nabla \cdot \Lambda^{-1} \equiv \hat{e}_x \cdot \partial \Lambda^{-1}/\partial x$ , where  $\hat{e}_x$  denotes the unit vector corresponding to the coordinate x, and can therefore use the explicit Jacobi relation

$$\mathbf{\Lambda} \cdot \hat{e}_x \cdot \frac{\partial \mathbf{\Lambda}^{-1}}{\partial x} = -\frac{1}{\det[\mathbf{\Lambda}]} \hat{e}_x \frac{\partial \det[\mathbf{\Lambda}]}{\partial x} = -\hat{e}_x \frac{\partial \ln \det[\mathbf{\Lambda}]}{\partial x}$$
(35)

for the determinant  $\det \Lambda$  of a matrix  $\Lambda$ . We remark that the general relation

$$\mathbf{\Lambda} \cdot \nabla \cdot \mathbf{\Lambda}^{-1} = -\nabla \ln \det[\mathbf{\Lambda}] \tag{36}$$

only holds in the above planar case (35) or for a constant swim velocity  $u(x) = v_0$ , see also appendix B of Ref. [72]. However, since there are no conceptual differences, we can plug the approximation (36) into the prediction (34) to obtain the compact representation (10) of  $\rho(x)$  in the main text.

The same stationary condition (33) can be obtained using the Fox approach [81] (when generalized to multiple components [106, 107]), while the corresponding time evolution differs from the UCNA dynamics (31) by the additional occurrence of the factors  $\Lambda_{ij}^{-1}$  and  $\Lambda_{ik}^{-1}$  therein. Note that, if we do not neglect the thermal Brownian noise in Eq. (2), also the stationary predictions of Fox and UCNA differ, even for a spatially constant swim velocity [72].

## C Effective change of variables for multiplicative noise

In this appendix, we briefly discuss a change of variables [78,84] which allows us to formally absorb the effect of the spatially dependent swim velocity into an effective force. Since  $u(\mathbf{x})$  is positive definite, we can define a new variable  $\tilde{\mathbf{x}}$  such that

$$\dot{\tilde{\mathbf{x}}} := \frac{\dot{\mathbf{x}}}{u(\mathbf{x})} \,. \tag{37}$$

Substituting into Eq. (3) yields

$$\dot{\tilde{\mathbf{x}}} = \frac{\gamma^{-1}\mathbf{F}(G^{-1}(\tilde{\mathbf{x}}))}{u(G^{-1}(\tilde{\mathbf{x}}))} + \eta, \tag{38}$$

where  $G^{-1}(\tilde{\mathbf{x}})$  denotes the inverse of the bijection  $G(\mathbf{x}) = \tilde{\mathbf{x}}$  mediating the variable transform  $\mathbf{x} \to \tilde{\mathbf{x}}$ .

There are two possible ways of interpreting Eq. (38). First, on the right-hand side, we can identify an effective external force and an additive noise. It is thus possible to argue that the multiplicative nature of the swim-velocity field  $u(\mathbf{x})$  can be absorbed into a convoluted expression of an external potential (and implicitly in the definition of  $\tilde{\mathbf{x}}$ ). However, since the new coordinate  $\tilde{\mathbf{x}}$  has the dimension of time rather than length, this is only a mathematical analogy, which, owing to the simpler form might be useful to find an explicit solution as, for example, in the case of a Run&Tumble model in one dimension [84]. Transforming back to the original coordinates explicitly requires the notion of the swim velocity  $u(\mathbf{x})$ , compare Eq. (37). Second, multiplying both sides of Eq. (38) with  $u(\mathbf{x})$ , we recover an equation with a multiplicative noise in which the combined term  $u(\mathbf{x})\dot{\tilde{\mathbf{x}}}$  has a proper dimension of a velocity. Moreover, upon first calculating the second time derivative  $\ddot{\tilde{\mathbf{x}}}$  and then multiplying with  $u(\mathbf{x})$ , we are able to identify the acceleration term which can be neglected to obtain the UCNA [78], compare Eq. (29). In other words, the physical interpretation of our results is the same whether or not we perform such a change of variables.

## D Multi-scale technique: derivation of Eq. (14)

In this appendix, we derive the perturbative result (14) for the probability distribution p(x, v) in the one-dimensional active system described by the Fokker-Planck equation (13). We adopt the multiple-time-scale technique, which is designed to deal with problems with fast and slow degrees of freedom. In the regime of small persistence time (where  $\tau$  is the smallest time scale of the system), the dynamics (13) exhibits the separation of time scales: in this case, the particle velocity rapidly arranges according to its stationary distribution and the spatial distribution evolves on a slower time scale.

To derive the multiple-time expansion, let us introduce the following dimensionless vari-

ables:

$$\tilde{t} = t \frac{v_0}{S}, \tag{39}$$

$$X = \frac{x}{S},\tag{40}$$

$$V = \frac{\nu}{\nu_0},\tag{41}$$

$$\tilde{F}(X) = -\frac{S}{v_0^2 \tau \gamma} \frac{\partial U(x)}{\partial x},\tag{42}$$

$$\tilde{\Gamma}(X) = 1 - \tau^2 \frac{v_0^2}{S^2} \frac{\partial \tilde{F}(X)}{\partial X}, \tag{43}$$

$$w(X) = \frac{u(x)}{v_0},\tag{44}$$

and the small expansion parameter  $\zeta^{-1} \propto \tau$ , where

$$\zeta = \frac{S}{\tau \nu_0} \tag{45}$$

is the ratio between the spatial period of the swim velocity S and the persistence length of the self-propulsion velocity  $v_0\tau$ . With our choice, a large (small) value of  $\zeta$  corresponds to the small-persistence (large-persistence) regime. Now, we express the Fokker-Planck equation (13) in these variables and find:

$$\frac{\partial P(X,V,\bar{t})}{\partial \bar{t}} + V \frac{\partial}{\partial X} P + \tilde{F}(X) \frac{\partial}{\partial V} P + \frac{1}{\zeta} R(X) \frac{\partial}{\partial V} V P 
+ \frac{1}{w(X)} \frac{\partial}{\partial X} w(X) \frac{\partial}{\partial V} (V^2 P) = \zeta L_{\text{FP}} P,$$
(46)

where we have further introduced the operator

$$L_{\rm FP} \equiv \frac{\partial}{\partial V} \left( V + w^2(X) \frac{\partial}{\partial V} \right) \tag{47}$$

and the function

$$R(X) \equiv \left[\frac{\partial \tilde{F}}{\partial X} - \tilde{F}(X)\frac{1}{w(X)}\frac{\partial}{\partial X}w(X)\right],\tag{48}$$

for convenience.

To develop our perturbative solution, we notice that the local operator  $L_{\rm FP}$  is proportional to the inverse expansion parameter  $\zeta$  in Eq. (46). We find that  $L_{\rm FP}$  has the following integer eigenvalues:

$$v = 0, -1, -2, \dots$$
 (49)

and the Hermite polynomials as eigenfunctions:

$$H_{\nu}(X,V) = \frac{(-1)^{\nu}}{\sqrt{2\pi}} \left( w(X) \right)^{(\nu-1)} \frac{\partial^{\nu}}{\partial V^{\nu}} e^{-\frac{V^2}{2w^2(X)}}. \tag{50}$$

Using these basis functions, we obtain the ansatz to write the solution of the partial differential equation as a linear combination:

$$P(X, V, \tilde{t}) = \sum_{\nu=0}^{\infty} \phi_{\nu}(X, \tilde{t}) H_{\nu}(X, V).$$

$$(51)$$

Upon substituting the expansion (51) in Eq. (46) and replacing  $L_{\rm FP}$  by its eigenvalues, we obtain the equation:

$$-\zeta \sum_{\nu} \nu \phi_{\nu} H_{\nu} = \sum_{\nu} \frac{\partial \phi_{\nu}}{\partial \tilde{t}} H_{\nu}$$

$$+ \sum_{\nu} V H_{\nu} \frac{\partial}{\partial X} \phi_{\nu} + \sum_{\nu} \phi_{\nu} V \frac{\partial}{\partial X} H_{\nu} + \tilde{F} \sum_{\nu} \phi_{\nu} \frac{\partial}{\partial V} H_{\nu}$$

$$+ \frac{w'}{w} \sum_{\nu} \phi_{\nu} \frac{\partial}{\partial V} V^{2} H_{\nu} + \frac{1}{\zeta} R \sum_{\nu} \phi_{\nu} \frac{\partial}{\partial V} V H_{\nu}, \qquad (52)$$

from which we must determine the unknown functions  $\phi_{\nu}(x,t)$ .

Now, instead of truncating arbitrarily the infinite series in Eq. (52) at some order  $\nu$ , we consider the multiple-time expansion which orders the series in powers of the small parameter  $1/\zeta$ . In such a way we perform an expansion near the equilibrium solution. To this end, each amplitude  $\phi_{\nu}$  (apart from  $\phi_0(X, \tilde{t})$  which is of order  $\zeta^0$ ) is expanded in powers of  $1/\zeta$  as:

$$\phi_{\nu}(X,\tilde{t}) = \sum_{s=0}^{\infty} \frac{1}{\zeta^s} \psi_{s\nu}(X,\tilde{t}). \tag{53}$$

Then, we replace the actual probability distribution  $P(X, V, \bar{t})$  by an auxiliary distribution  $P_{\rm a}(X, V, \bar{t}_0, \bar{t}_1, \bar{t}_2, \ldots)$ , which reads:

$$P_{a} = \sum_{s=0}^{\infty} \frac{1}{\zeta^{s}} \sum_{v=0}^{\infty} \psi_{sv}(X, \bar{t}_{0}, \bar{t}_{1}, \bar{t}_{2}, ...) H_{v}(X, V).$$
 (54)

This distribution depends on many time variables  $\{\bar{t}_s\}$ , associated with the perturbation order s, which are defined as  $\bar{t}_s = \bar{t}/\zeta^s$ . The time derivative with respect to  $\bar{t}$  is then expressed as the sum of partial time-like derivatives:

$$\frac{\partial}{\partial \bar{t}} = \frac{\partial}{\partial \bar{t}_0} + \frac{1}{\zeta} \frac{\partial}{\partial \bar{t}_1} + \frac{1}{\zeta^2} \frac{\partial}{\partial \bar{t}_2} + \dots$$
 (55)

Substituting the expansions (53) and (55) into Eq. (52) one obtains at each order  $1/\zeta^s$  and for each Hermite function an equation involving the amplitudes  $\psi_{sv}(X,\tilde{t})$ . The perturbative structure of the resulting set of equations is such that the amplitudes  $\psi_{sv}(X,\tilde{t})$  can be obtained by the amplitudes of the lower order (s-1). In particular, we find the following equation for  $\psi_{00} = \phi_0$ 

$$\frac{\partial \psi_{00}(X,\bar{t})}{\partial \tilde{t}} = \frac{1}{\zeta} \frac{\partial}{\partial X} \left[ w(X) \frac{\partial}{\partial X} \left( w(X) \psi_{00} \right) - \tilde{F}(X) \psi_{00} + \frac{1}{\zeta^2} w(X) \frac{\partial}{\partial X} \left( w(X) R \psi_{00} \right) \right],$$
(56)

whose steady-state solution reads

$$\psi_{00}(X) = \frac{\mathcal{N}}{w(X)} \left( 1 - \frac{1}{\zeta^2} R(X) \right) \times \exp\left[ \int_{-\infty}^{X} dy \frac{\tilde{F}(y)}{w^2(y)} \left( 1 - \frac{1}{\zeta^2} R(y) \right) \right], \tag{57}$$

where  $\mathcal{N}$  is a normalization factor. In our perturbative procedure, all the remaining amplitudes are expressed in terms of the pivot function  $\psi_{00}(X)$ . The steady-state amplitudes of the higher-

order Hermite polynomials are given by:

$$\psi_{22} = \frac{1}{2}R(X)\psi_{00} \tag{58}$$

$$\psi_{33}(X) = -\frac{1}{6}w(X)\psi_{00}(X)\frac{\partial}{\partial X}R(X)$$
 (59)

$$\psi_{42} = -\frac{3}{2} \frac{\partial}{\partial X} [w(X)\psi_{33}] + R(X)\psi_{22}$$
 (60)

$$\psi_{44}(X) = -\frac{1}{4} \left( \frac{\partial}{\partial X} [w(X)\psi_{33}] - R(X)\psi_{22} \right), \tag{61}$$

where we have reported only the nonvanishing coefficients for  $s \le 4$ . Note that, if v > s, the coefficients  $\psi_{sv}$  are always zero.

Once Eq. (57) and the coefficients of the double series (54) have been determined, one returns to the original dimensional variables and obtains the perturbative result for p(x, v) reported in Eq. (14).

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