Large-scale identification of viral quorum sensing systems reveal convergent

evolution of density-dependent sporulation-hijacking in bacteriophages

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ABSTRACT

Quorum sensing systems (QSSs) are genetic systems supporting cell-cell or bacteriophage-bacteriophage communication. By regulating behavioral switches as a function of the encoding population density, QSSs shape the social dynamics of microbial communities. However, their diversity is tremendously overlooked in bacteriophages, which implies that many density-dependent behaviors likely remains to be discovered in these viruses. Here, we developed a signature-based computational method to identify novel peptide-based RRNPP QSSs in gram-positive bacteria (e.g. Firmicutes) and their mobile genetic elements. The large-scale application of this method against available genomes of Firmicutes and bacteriophages revealed 2708 candidate RRNPP-type QSSs, including 382 found in (pro)phages. These 382 viral candidate QSSs are classified into 25 different groups of homologs, of which 22 were never described before in bacteriophages. Remarkably, genomic context analyses suggest that candidate viral QSSs from 6 different families dynamically manipulate the host biology. Specifically, many viral candidate QSSs are predicted to regulate, in a density-dependent manner, adjacent (pro)phage-encoded regulator genes whose bacterial homologs are key regulators of the sporulation initiation pathway (either Rap, Spo0E, or AbrB). Consistently, we found evidence from public data that certain of our candidate (pro)phage-encoded QSSs dynamically manipulate the timing of sporulation of the bacterial host. These findings challenge the current paradigm assuming that bacteria decide to sporulate in adverse situation. Indeed, our survey highlights that bacteriophages have evolved, multiple times, genetic systems that dynamically influence this decision to their advantage, making sporulation a survival mechanism of last resort for phage-host collectives.

KEYWORDS:

Bacteriophages - Quorum sensing – Communication - Sporulation – Manipulation – RRNPP

INTRODUCTION

Quorum sensing systems (QSSs) are genetic systems primarily supporting cell-cell communication (1,2), but also plasmid-plasmid (3), or bacteriophage-bacteriophage (4,5) communication. Upon bacterial expression, a QSS enables individuals of an encoding population (bacterial chromosomes, plasmids or intracellular bacteriophage genomes) to produce a communication signal molecule that accumulates in the environment as the population grows. At a threshold concentration, reflecting a quorum of the encoding population, the signal is transduced population-wide and thereupon regulates a behavioral switch (2,6,7). QSSs thereby shape the social dynamics of microbial communities and optimize the way these communities react to changes in their environments. If QSSs are well described in bacterial chromosomes, their diversity is under-explored in mobile genetic elements (MGEs), and particularly in bacteriophages, yet by far the most abundant biological entities on Earth (8). To date, only 2 types of QSSs have been

54 recently described in bacteriophages: the lysogeny-regulating "arbitrium" QSSs (4,5) and the host-
55 derived Rap-Phr QSSs (9). Expanding the diversity of bacteriophage-encoded QSSs would unravel
56 novel decision-making processes taken by these viruses, that would have major consequences on
57 the understanding of microbial interaction, adaptation and evolution.
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Expanding the diversity of viral QSSs implies developing methods to detect novel QSS families,
beyond homology searches that limits the results to representatives of already known families.
Here we demonstrate that an *in silico* detectable signature is common between distinct,
experimentally-characterized families of QSSs and is thus sufficiently generic to discover novel
QSSs while being specific to quorum sensing. These families rely on small peptides as
communication molecules, are specific to Firmicutes and their MGEs, and are grouped under the
name RRNPP, which stands for the Rap, Rgg, NprR, PlcR and PrgX families of quorum sensing
receptors (7,10–12)). We thus systematically queried the RRNPP signature against the NCBI
database of complete genomes of Viruses but also of Firmicutes, because a bacteriophage
genome can be inserted, under the form of a latent prophage, within the genome of its bacterial
host. For more applied considerations, we also searched for this signature within human-
associated bacteriophages from the Gut Phage Database (13). We report the identification of 382
(pro)phage-encoded candidate QSSs, classified into 25 distinct QSS families of homologs, of
which 22 were never described before in bacteriophages, which may represent a 7-fold increase of
the described diversity of viral QSS families.
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RRNPP-type QSSs often regulate adjacent genes, which is especially true (no counterexamples
yet known) for QSSs encoded by MGEs such as bacteriophages and plasmids (4,5,12,14).
Consistently, we meticulously examined the genomic context of our candidate (pro)phage-encoded
QSSs to predict their function. Remarkably, in many cases, we observed an unsuspected
clustering of different viral QSSs with (pro)phage-encoded regulator genes (i.e *rap*, *spo0E*, or
abrB) whose bacterial homologs are key regulators of the bacterial sporulation initiation pathway
(15–18). Consistent with this observation, we next found in the literature multiple independent
experimental data reporting that some of our candidate QSSs that we predict to be encoded by
Bacillus and *Clostridium* prophages affect the timing of sporulation in their respective host. Finally,
we uncovered a high abundance of *spo0E* and *abrB* genes, as well as one *rap*-based QSS in the
Gut Phage Database (13), highlighting that gastrointestinal viruses regulate, within humans, the
dynamics of formation of bacterial endospores specialized for host-host transmission (19).
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Here, our findings challenge the sporulation paradigm, which assumes that spore-forming
Firmicutes decide to sporulate in adverse situations (20). Indeed, our survey revealed that
bacteriophages have evolved, multiple times, QSSs that dynamically influence the sporulation

decision-making process for their own evolutionary benefit. Importantly, as the sporulation initiation
pathway can trigger a wide range of biological processes (sporulation, biofilm formation,
cannibalism, toxin production or solventogenesis) (21,22), our unraveled viral candidate QSSs also
likely manipulate, in a density-dependent manner, a substantially broader spectrum of the host
biology than spore formation alone. Considering that endospores formed by pathogens are linked
to serious health issues ranging from food-safety, bio-terrorism to infectious diseases (23–29) and
that endospores formed by commensal bacteria can be leveraged to treat gastrointestinal
dysbioses (30), these new insights may pave the way to major practical outcomes.
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RESULTS
Large-scale query of the RRNPP-type signature reveals hundreds of candidate QSSs
encoded by free bacteriophages or prophages
RRNPP-type QSSs are composed of two adjacent genes and are specific to gram-positive
Firmicutes bacteria and their bacteriophages. The emitter gene encodes a small pro-peptide that is
secreted, except in rare exceptions, via the SEC-translocon and matured extracellularly by
exopeptidases into a mature quorum sensing peptide. This mature peptide accumulates in the
medium as the emitting population grows, and is imported by the Opp permease at high
concentrations, therefore at high population densities. The receptor gene encodes an intracellular
protein inhibitor or a transcription factor that interacts with the imported mature peptide, via
peptide-binding motifs called tetratricopeptide repeats (TPRs). Upon binding with the signal
peptide, the receptor undergoes a conformational change, which translates into the subsequent
induction or inhibition of target pathways at high population densities (7,10–12) (**Fig. S1**).
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The detailed examination of similarities between different, functionally-validated RRNPP-type
QSS families revealed a generic signature of 5 criteria that can be very effectively detected *in silico*
(explained in details in **Fig. S2** and in **Materials and Methods**). In brief, detecting this signature
consists first, of identifying candidate receptors, defined as proteins of 250-460aa matching Hidden
Markov Models of TPRs (E-value of <1E-5, 1000x more stringent than default threshold), the
structural motifs involved in the binding of small peptides (and in the case of RRNPP QSSs, of
quorum sensing peptides). Second, it consists in retaining only the coding sequences of those
putative receptors that are located directly adjacent to the coding sequence of a candidate
communication pro-peptide, defined as a small protein of 15-65 aa predicted to be secreted via the
SEC-translocon by the stringent SignalP software (**Fig. 1** and **S2, Materials and Methods**). The
pubmed query '*"Tetratricopeptide" "Peptide" Secretion Firmicutes'*, despite no keywords directly
linked to quorum sensing, yields 10 (out of 11) results describing RRNPP-type QSSs, highlighting
the intrinsic link between this signature and quorum sensing. As this signature-based method does
not rely on homology search of already known QSSs, it has the potential to detect novel candidate

RRNPP-type QSS families, and thus novel 'languages' of peptide-based biocommunication via
quorum sensing. The same principle, *albeit* implemented differently, was recently applied by
Voichek *et al.* in the *Paenibacillus* genus, and proved its efficiency at detecting novel, functional
QSSs (31).

At first, we queried the RRNPP-type specific signature against the high-quality complete
genomes of Firmicutes (3,577 genomes (chromosomes + plasmids)) and Viruses (32,327
genomes) available at the NCBI. This systematic search led to the detection of 2681 candidate
QSSs. There were no false negatives for reference RRNPP-type QSSs: we identified 100% of the
Rap-Phr, NprR-NprX, PlcR-PapR, TraA-Ipd1 AimP-AimR and AimP$_{like}$-AimR$_{like}$ reference QSS
families in which the pro-peptide is not mentioned to be secreted otherwise than via the SEC-
translocon (4,5,12) (**Table S2, Materials and Methods**). Consistent with the fact that RRNPP-type
QSSs are specific to Firmicutes, only QSSs encoded by bacteriophages of Firmicutes were
identified in the dataset of all available viral genomes. Here, our 2681 unraveled candidate QSSs
are distributed as such: 2124 are encoded by chromosomes, 189 by plasmids (Bernard *et al.* in
prep), 10 by genomes of free phages of Firmicutes while 358 were predicted by Phaster (32) and
ProphageHunter (33) to belong to prophages (174 classified as intact/active prophages, 68 as
questionable/ambiguous prophages and 116 as incomplete prophages) (**Table S1, Materials and**
Methods). We next sought to characterize the diversity of this unprecedented, massive library of
phage- and prophage-encoded candidate QSSs.

These (pro)phage-encoded candidate QSSs are distributed into 16 families, 13 of which
were never described before in bacteriophages
We next classified these 2681 unraveled candidate QSSs into families, defined as groups of
homologous receptors. To this end, we launched a BLASTp (34) all vs all of the 2681 receptors,
and retained only pairs of receptors yielding a sequence identity >=30% over more than 80% of the
lengths of the two sequences. Subsequently, the connected components of the resulting sequence
similarity network were used to define QSS families (**Materials and Methods**). We thereby
identified a total of 56 families of candidate QSS receptors, 16 of which included at least one
candidate QSS encoded by either a phage or a predicted prophage (**Table S1**). We next focused
our study on the computational characterization of the viral QSSs from these 16 families.

Homology assessment of these 16 families with reference RRNPP-type QSS receptors revealed
that only 3 families had already been characterized before in phages: the Rap-Phr family shared
between chromosomes, plasmids and bacteriophages (9,35), the AimR-AimP QSS family specific
to (pro)phages of the *B. subtilis* group (4), and the AimR-AimP-like QSS family specific to
(pro)phages of the *B. cereus* group (5) (**Table S2, Materials and Methods**). Accordingly, 13 of the

16 RRNPP-type candidate QSS families in which at least one candidate QSS is encoded by a
(pro)phage had never been described before in bacteriophages and may therefore substantially
expand the known diversity of viral QSSs (**Table 1**). Interestingly, 3 of these 13 families (families
n°1, 2 and 3) happen to be present in both bacterial chromosomes and phages/prophages, as in
the case of the Rap-Phr family (**Fig. S3**).
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171   **Table 1**: novel candidate QSSs in phages and predicted prophages

QSS id	Family	Receptor NCBI Id	DNA binding motif	Pro-peptide NCBI Id	SEC-secretion likelihood	Inferred mature peptide	Intergenic distance (bp)	QSS-encoding genome	Prophage Hunter prediction	Phaster prediction
1α	1	ALA47936.1	Yes	ALA47937.1	0.81	TDNPGY	-1	Brevibacillus phage Sundance	Phage genome (not applicable)	Phage genome (not applicable)
1β	1	AIG26090.1	Yes	AIG26091.1	0.94	NADPGY	13	*Brevibacillus latero-sporus* LMG15441	Ambiguous prophage (0.53)	-
1γ	1	VEF92012.1	Yes	VEF92013.1	0.98	RVEPDW	21	*Brevibacillus brevis* NCTC2611	Ambiguous prophage (0.79)	-
2	2	VEF92631.1	Yes	VEF92630.1	0.76	THGAG	-1	*Brevibacillus brevis* NCTC2611	Active prophage (0.83)	-
3α	3	AGF56487.1	Yes	AGF56488.1	0.93	DSRDPD	68	*Clostridium saccharo-perbutylacetonicum* N1-4(HMT)	Active prophage (0.98)	-
3β	3	AGF59421.1	Yes	AGF59420.1	0.97	NTTDPY	112	*Clostridium saccharo-perbutylacetonicum* N1-4(HMT)	Ambiguous prophage (0.63)	-
3γ	3	AQR95595.1	Yes	AQR95596.1	0.94	NTLDPN	74	*Clostridium saccharo-perbutylacetonicum* N1-504	Active prophage (0.85)	Intact prophage (100)
4α	4	VEF87222.1	Yes	VEF87223.1	0.99	GPPE	15	*Brevibacillus brevis* NCTC2611	Active prophage (0.93)	Intact prophage (150)
4β	4	VEF87585.1	Yes	VEF87586.1	0.98	GPPD	25	*Brevibacillus brevis* NCTC2611	Active prophage (0.95)	Intact prophage (150)
5α	5	QIC08170.1	Yes	QIC08171.1	0.96	ITEPEW	-4	*Brevibacillus* sp. 7WMA2	Active prophage (0.83)	-
5β	5	AIG27473.1	Yes	AIG27472.1	0.89	STAPDW	1	*Brevibacillus latero-sporus* LMG15441	-	Incomplete prophage (10)
6	6	AGR47394.1	Yes	AGR47395.1	0.97		74	Brevibacillus phage Emery	Phage genome (not applicable)	Phage genome (not applicable)
7	7	ANT39976.1	Yes	ANT39977.1	0.92		120	Bacillus phage vB_BtS_BMBtp14	Phage genome (not applicable)	Phage genome (not applicable)
8	8	ADI00470.1	Yes	ADI00469.1	0.94		190	*Bacillus seleniti-reducens* MLS10	Ambiguous prophage (0.64)	Intact prophage (150)
9	9	BCB03503.1	Yes	BCB03504.1	0.98		55	*Bacillus* sp. KH172YL63	Ambiguous prophage (0.72)	-
10	10	QHQ60545.1	Yes	QHQ60546.1	0.87		99	*Anaerocolumna* sp. CBA3638	Ambiguous prophage (0.55)	-
11	11	ARU61133.1	Yes	ARU61134.1	0.91		-8	*Tumebacillus avium* AR23208	-	Incomplete prophage (10)
12	12	AGV99457.1	Yes	AGV99458.1	0.65		-59	Bacillus phage phiCM3	Phage genome (not applicable)	Phage genome (not applicable)
13	13	QCU03546.1	Yes	QCU03545.1	0.44		149	*Blautia* sp. SC05B48	Ambiguous prophage (0.55)	-

These 13 uncharacterized families include a total of 19 viral representatives, all presented in

Table 1 and named by an integer, indicative of the QSS family, followed by a greek letter in case of

plural viral representatives in the family. QSSs 1α, 6, 7, 12 are encoded by genomes of free

phages whereas QSSs 1β, 1γ, 2, 3α, 3β, 3γ, 4α, 4β, 5α, 5β, 8, 9, 10, 11, 13, 14 are predicted to

belong to prophages (**Table 1**). Inducing prophage excision in each of the bacterial strains

containing these systems will indicate whether these candidate QSSs belong to active prophages,

able to re-initiate the lytic cycle after excision, or to cryptic prophages. The prediction of the activity

of each of these prophages are given in **Table 1**. For each of these 20 novel viral candidate QSSs,

the small, operonic intergenic distance between the receptor and the pro-peptide genes, together

with the high likelihood that the pro-peptide is secreted via the SEC-translocon are excellent

predictors that the genetic system is a QSS, functioning according to the canonical mechanism

depicted in **Fig. S1**. The multiple sequence alignment of predicted cognate propeptides in each

family of QSSs of size > 1 is shown in **Fig. S4**.

Rap-Phr QSSs that delay the timing of sporulation are found in many, diverse *Bacillus*

bacteriophages

Among the already characterized QSS families that are matched by (pro)phage-encoded

candidate QSS, the Rap-Phr is especially interestingly. Indeed, the Rap-Phr QSS family has long

thought to be specific to genomes of *Bacillus* bacteria (36,37). In the *Bacillus* genus, bacterial Rap-

Phr QSSs tend to be subpopulation-specific and regulate the last-resort sporulation initiation

pathway in a density-dependent manner (35). In Firmicutes, the sporulation program leads to the

formation of especially resistant endospores, able to resist extreme environmental stresses for

prolonged periods (sometimes several thousand of years (38)) and to resume vegetative growth in

response to favorable changes in environmental conditions (20). The sporulation pathway is

initiated when transmembrane kinases sense stress stimuli, and thereupon transfer their

phosphate, either directly (*Clostridium*) or via phosphorelay (*Bacillus, Brevibacillus*) to Spo0A, the

master regulator of sporulation (39,40). The regulatory regions of developmental genes enacting

the irrevocable entry into spore formation have a low affinity for the active Spo0A-P transcriptional

regulator, implying that only high Spo0A-P concentrations, and therefore intense stresses, can

commit a cell to sporulate (41). The research on the sporulation initiation pathway contributed to

build the following paradigm: in adverse circumstances, a bacterium senses environmental stress

factors, processes these input signals via an elaborated decision-making network of bacterial

genes/proteins and undergoes spore formation only if the Spo0A-P concentration outputted by this

regulatory circuit meets a certain threshold (16–18,42).

Notably, a Rap-Phr QSS ensures that Spo0A-P only accumulates when the Rap-Phr encoding

subpopulation reaches high densities (42). Thus, the Rap-Phr QSS has been proposed as a

means for a *Bacillus* cell to delay a costly commitment to sporulation as long as the ratio of
available food per kin-cell is compatible with individual survival in periods of nutrient limitation (42),
in line with the paradigm posing that the decision to sporulate is essentially a bacterial biological
process.

However, the Rap-Phr QSS family was recently shown to be mobile (35), and we previously
demonstrated that it can be found on plasmids and (pro)phages, in addition to bacterial
chromosomes (9). Accordingly, the delay in the timing of sporulation observed in a bacterium
expressing a Rap-Phr QSS can find its source in a non bacterial, third party genetic element, and
can therefore be dependent on the density of this genetic element entrapped within bacteria rather
than on the actual bacterial cell density. For example, we showed that a functionally validated Rap-
Phr system, the RapBL5-PhrBL5 system (NCBI IDs AAU41846.1 and AAU41847.1) of *B.*
licheniformis (35), initially thought to be encoded by bacterial genes, was actually assessed by
Phaster to belong to an intact prophage region (9). Consequently, the delay in Spo0A-P
accumulation shown to be controlled by RapBL5-PhrBL5, was in fact governed by a viral genetic
system. In the discussion section of this manuscript, we attempt to explain what evolutionary
advantages may underlie the selection of such manipulative Rap-Phr QSSs in bacteriophages.

Here, we identified 1753 chromosomal, 179 plasmidic, 324 prophage-encoded and 1 phage-
encoded *rap-phr* genetic systems in the complete genomes of Viruses and Firmicutes available at
the NCBI, unraveling an unsuspected massive use of Rap-Phr QSSs by bacteriophages (**Table S1**,
Materials and Methods). To further appreciate the diversity of these viral QSSs and to better
understand how Rap-Phr travel onto different kinds of genetic supports (chromosomes, plasmids,
phages), we inferred the maximum-likelihood phylogeny of these Rap quorum sensing receptors.
On the resulting, mid-rooted phylogenetic tree, we colored each leaf according to the type of
genetic element encoding the Rap-Phr QSS: blue for chromosomes, orange for plasmids and
purple for bacteriophages (**Fig. 2**). This unprecedented mapping reveals a high diversity of viral
Rap-Phr QSSs, in both prophages of the *Bacillus subtilis* and *Bacillus cereus* groups, because
these viral Rap-Phr were not monophyletic but distributed into at least 6 groups, interspaced
between bacterial clades. This polyphily of viral Rap-Phr QSSs suggest multiple, independent
acquisitions of Rap-Phr in bacteriophages, and thus multiple acquisitions of potential sporulation-
hijacking genetic systems. On another note, this phylogenetic tree highlights, for the first time, that
frequent transfers of communication systems can occur between bacterial chromosomes and
MGEs.

Bacteriophages have evolved many different genetic systems predicted to dynamically
modulate the bacterial sporulation initiation pathway via quorum sensing

We next focused our study on the computational characterization of the 19 novel candidate
QSSs described in **Table 1,** for which the function remains unknown. To infer what biological
processes these candidate QSSs might regulate, we took advantage of the following characteristic
of functionally-validated RRNPP-type QSSs encoded by MGEs: when the intracellular receptor is a
transcription factor that gets activated/deactivated upon binding with its cognate communication
peptide, the genes regulated by the QSS were found to be located in its vicinity (**Fig. S2**)
(4,5,12,14). Querying the HMMs of DNA binding domains found within functionally characterized
RRNPP receptors, we found that these 19 QSS receptors all harbor a DNA binding domain and
thus likely regulate the transcription of adjacent target genes (**Tables 1 and S1, Materials and**
Methods). Accordingly, we analyzed the genomic neighborhood of these QSS receptors to predict
their function.

Remarkably, we noticed that the two main regulators of Spo0A-P other than *rap*, *i.e.* the *spo0E*
dephosphorylator of Spo0A-P and the *abrB* regulator of the transition state from vegative growth to
sporulation (16–18), are often found in the genomic neighborhood of viral candidate QSSs.
Specifically, we identified *spo0E* directly adjacent to QSS1α (Brevibacillus phage Sundance), two
copies of *spo0E* directly adjacent with QSS3β (predicted prophage of *Clostridium*
saccharoperbutylacetonicum), and *abrB* in the genomic vicinity of QSS4β (predicted prophage of
Brevibacillus brevis) and QSS5α (predicted prophage of *Brevibacillus brevis* sp. 7WMA2) (**Fig.**
3A). These results especially make sense in light of a recently identified chromosomal RRNPP-
type QSS, shown to regulate the expression of its adjacent *spo0E* gene in a density dependent
manner (31). The functions of the other (pro)phage-encoded candidate QSSs were difficult to
predict from their genomic contexts and would require further exciting functional studies to
characterize which biological processes they might regulate in a (pro)phage-density dependent
manner.

At this stage of analysis, we found that QSSs 1α, 3β, 4β and 5α represent 21% of the predicted
novel viral candidate QSSs, which, added to the viral Rap-Phr QSSs, suggest a remarkable
functional association between quorum sensing and the regulation of sporulation in
bacteriophages. In addition to Rap-Phr of *Bacillus* phages, these results suggest that some
phages/prophages of the *Brevibacillus* and *Clostridium* genera likely rely on other QSS families to
communicate in order to keep track of their respective population density and regulate the
expression of the (pro)phage-encoded *spo0E* or *abrB* gene accordingly (**Fig. 4**). Consistently, by
influencing the total concentration of the Spo0E or AbrB regulator within bacterial hosts in a
(pro)phage-density dependent manner, these viral genetic systems might influence the dynamics
of Spo0A-P accumulation and thereby modulate the target pathways of the sporulation initiation
program. From an evolutionary viewpoint, the facts that Rap and the receptors of QSSs 1α, 3β, 4β

and 5α belong to distinct protein families, and are encoded by bacteriophages from different hosts,
suggest a remarkable convergent evolution, in bacteriophages, of the functional association
between viral quorum sensing and the manipulation of the bacterial sporulation initiation pathway.
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Furthermore, the AbrB and Rap proteins have not only been reported to regulate Spo0A-P
accumulation but also to inhibit the competence pathway in *Bacillus*. Indeed, AbrB represses
ComK, the transcription factor of late competence genes, whereas Rap may inhibit, in addition or in
place of Spo0F-P, the ComA-P regulator of early competence genes (18). Accordingly, the Rap-Phr
and AbrB-regulating QSSs encoded by bacteriophages could also modulate the host competence
pathway, in addition to the sporulation initation pathway (**Fig. 5**). The RapBL5-PhrBL5 QSS of *B.*
licheniformis prophage has even been experimentally demonstrated to delay both the sporulation
and the competence pathways (35). Altogether, our genomic analyses suggest that different
bacteriophages use different quorum sensing systems to dynamically manipulate a wide range of
host biological processes, spanning from competence to the phenotypes controlled by Spo0A-P
such as sporulation, biofilm formation, cannibalism, toxin production or solventogenesis (21,22,43).
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Experimental evidence supporting the prediction that prophage-encoded QSSs influence
the dynamics of sporulation in the *Clostridium* genus
As experimental data in *B. licheniformis* already support the prediction that viral Rap-Phr delay
the *Bacillus* sporulation program as a function of (pro)phage densities (9), we next tried to identify
whether publicly available biological data would substantiate our prediction that QSSs 1α, 3β, 4β
and 5α regulate the expression of (pro)phage-encoded *spo0E* or *abrB* genes, and thereby
dynamically manipulate the host sporulation initiation pathway. If we did not find experimental data
in *Brevibacillus* bacteria to test this hypothesis for QSSs 1α, 4β and 5α*,* we noticed that two recent
studies focuses on the functional characterization of putative RRNPP-type QSSs in solventogenic
Clostridium species, the type of hosts of the predicted QSS3βR-encoding prophage.
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The first study investigated the functions of the 5 RRNPP-type QSSs predicted in the genome of
Clostridium saccharoperbutylacetonicum str. N1-4(HMT), the lysogenized host of the predicted
QSS3α- and QSS3β-encoding prophages (44). In this study, the functions of the QSS3αR (locus
Cspa_c27220) and QSS3βR (locus Cspa_c56960) receptors were assessed although it was then
unknown that these two QSSs might actually correspond to two prophage regions. The results of
this study indicate that QSS3βR likely represses its two downstream *spo0E* genes, in line with our
prediction (**Fig. 3**). Consistent with the fact that Spo0E dephosphorylates Spo0A-P, the deletion of
QSS3βR, expected to alleviate *spo0E* repression, was shown to result in decreased Spo0A-P
levels and decreased sporulation efficiency. The same decrease in sporulation efficiency was
observed when QSS3αR is deleted, despite no sporulation regulators in the genomic

neighborhood of QSS3α, suggesting that the monophyletic QSS3βR and QSS3αR (**Fig. S3**) may
bind the same DNA motifs and thus repress a common set of target genes, including *spo0E.*
Further, the authors of the study showed that QSS3αR and QSS3βR overexpression, expected to
over-repress the *spo0E* inhibitor of Spo0A-P, each resulted in increased sporulation efficiency as
compared to the wild type phenotype, with basal QSS3βR expression. As the overexpression of a
QSS receptor should yield more free receptors than receptor-peptide complexes, this phenotype is
expected to reflect the function of a receptor below the quorum mediated by high concentration of
its cognate quorum sensing peptide. Hence, these results highlight that QSSs predicted to belong
to *C. saccharoperbutylacetonicum* prophages antagonize the host sporulation initiation pathway in
a density-dependent manner (**Fig. 4**).

In the second study, 8 RRNPP-type QSSs in the genome of *Clostridium acetobutylicum* ATCC
824 have been studied (45). The authors mentioned that the open reading frames of 7 of the 8
QSS pro-peptides were not present in the annotation file of the genome deposited on the NCBI.
Our algorithm *a priori* captured only 1 QSS (QSSf) in this genome but succeeded at identifying 3
additional RRNPP-type QSSs when all these small ORFs were taken into account (QSSb, QSSg
and QSSh) (**Table S3**). Among the 8 QSSs, QSSf (locus CA_C1214) and QSSg (locus CA_C1949)
were identified by ProphageHunter as belonging to active prophages (likelihoods of 0.95 and 0.94,
respectively) and QSSg was also predicted by Phaster to be encoded by an intact prophage (score
of 150). Importantly, we found the *abrB* gene in the vicinity of QSSg, adding the latter to our initial
list of prophage-encoded QSS inferred to regulate the sporulation initiation pathway of the host
(**Fig. 3A**). In line with our prediction, the study showed that the QSSgR mutant was the only one of
the 8 QSS receptor-mutants that resulted in a significant reduction in the number of endospores as
compared to wild type after 7 days of culture (3-fold, p-value = 0.03).

The results from these two independent studies show that when certain QSS receptors
detected as prophages-encoded are deleted, the sporulation pathway of *Clostridium* is
antagonized. However, a QSS receptor is itself activated or inactivated upon binding with its
cognate mature peptide, whose concentration reflects the density of the QSS-encoding population.
Therefore, the QSSs of (pro)phages of solventogenic *Clostridium* might ensure that the inhibition of
the host sporulation initiation pathway by the QSS receptors is not constitutive but only happens at
high (pro)phage densities. As solventogenic *Clostridium* species acidify their medium as they grow,
this mechanism could perhaps enable (pro)phages to coerce their hosts to maintain Spo0A-P
levels that favors the costly alkalizing solventengenesis pathway over sporulation in response to
medium acidification, for the benefit of (pro)phage replication (**Fig. 4**). These data, coupled with
evidence from the RapBL5-PhrBL5 of *B. licheniformis* highlight that some (pro)phage-encoded
QSSs manipulate the host sporulation initiation pathway in a density-dependent manner.

Metagenomic evidence that intestinal bacteriophages regulate sporulation in the human gut microbiota, via a rich repertoire of *spo0E* and *abrB* regulators

If our identification of multiple families of (pro)phage-encoded candidate QSSs predicted to mediate sporulation-hijacking is interesting from a fundamental viewpoint, notably in microbiology and evolution, it may also be of interest for more practical fields such as medicine. Indeed, as sporulation enables bacteria to resist various harsh environmental conditions, it represents a route for bacteria to travel between environments, and notably to end up within human bodies. Consequently, the endospore is the infectious form of many pathogens, among which *Bacillus anthracis* (26), the causative agent of anthrax or *Clostridium* (reclassified as *"Clostridioides"*) *difficile*, an emergent pathogen responsible for almost 223,900 hospitalizations and at least 12,800 US deaths in 2017 alone (23). It is notably well known that differentiating into an endospore allows anaerobic bacteria to resist air exposure and thus transmit between humans. Sporulation therefore participates in the dynamics of exchange of gastrointestinal bacteria between humans, which may cause outbreaks of nosocomial infections in the case of pathogenic species (24,29). In a recent study, Browne et al estimated that at least 50-60% of the bacterial genera from the intestinal microbiota of a healthy individual produce resilient spores, specialized for host-to-host transmission (19). These fascinating observations prompted us to wonder whether bacteriophages can influence the dynamics of spore formation in the human gut microbiota and therefore influence the dynamics of host-to-host transmission of intestinal bacteria.

We hence queried the HMMs of Rap (PFAM PF18801), Spo0E (PFAM PF09388) and AbrB (SMART SM00966) against the protein sequences predicted from all the MAGs of bacteriophages present in the Gut Phage Database (13). This HMMsearch revealed 1 match for Rap, 172 for Spo0E and 861 for AbrB (E-value < 1E-5), hinting at likely phage-mediated sporulation regulations in the human gut microbiota (**Table S4**). The RRNPP-type signature furthermore led to the identification of 17 candidate QSSs in MAGs of intestinal bacteriophages, distributed in 10 families, of which only 2 were previously described in this study: family QSS14 (Prophage of *Blautia*) and the Rap-Phr family (**Fig. 3B** and **Table S5**). Altogether, these computational results suggest, for the first time, that intestinal bacteriophages interfere with the sporulation of intestinal bacteria and thereby influence the dynamics of transmissibility of bacteria between humans.

DISCUSSION

If bacterial quorum sensing was discovered in 1970 (46), the first characterization of a functional QSS in a bacteriophage only dates back to 2017, where its was shown to coordinate the lysis-lysogeny transition as a function of phage densities (4). Evidence has emerged only recently that bacteriophages may use or exploit quorum sensing mechanisms to interfere, for their evolutionary

benefit, with the biology of bacterial hosts (9,47). These findings open fascinating perspectives
that will significantly enrich extant models or bacteria-phages co-evolution. However, the diversity
of viral QSSs remains tremendously overlooked, with only two "arbitrium" families (4,5) and the
rap-phr family (9). Here, using a signature-based computational approach, we were able to identify
22 families of candidate RRNPP-type QSSs that were never described before in bacteriophages:
14 in reference genomes from the NCBI (**Tables S1** and **S3**) and 8 additional in MAGs of interstinal
bacteriophages from the Gut Phage Database (13) (**Table S5**). Altogether, our results might thus
expand the known diversity of viral QSS families by 7-fold. Our computational results therefore
pave the way to an exciting research on the characterization of novel density-dependent social
processes in bacteriophages, which would unravel unknown decision-making processes in viruses.
404
Analyzing the genomic context of our viral candidate RRNPP-type QSSs to predict their
function, we found that the regulation of sporulation by a modulation of Spo0A phosphorylation is
well represented. In a recent study, we reported that the Rap-Phr RRNPP-type QSS family, known
to regulate the competence and sporulation initiation pathways in *Bacillus* bacteria, can actually be
carried by (pro)phages (9). Building on this previous work, we now unraveled a massive unknown
abundance and diversity of viral Rap-Phr QSSs, in both (pro)phages of the *Bacillus subtilis* and
Bacillus cereus groups (**Fig. 2**, **Table S1**). Furthermore, we discovered that (pro)phage-encoded
QSSs can dynamically manipulate the host biology beyond the sole *Bacillus* genus, and beyond
the sole Rap-Phr mechanism. Indeed, we identified 7 (pro)phage-encoded candidate RRNPP-type
QSSs (coined QSSs 1α, 3α, 3β, 3γ, 4β, 5α and g) predicted to regulate the expression of a
(pro)phage-encoded sporulation regulator (*spo0E* or *abrB*) (**Fig. 3**). Moreover, we found in the
literature experimental data reporting that QSSs 3α, 3β, 3γ and g affect the timing of sporulation in
their respective host. Because the receptors of the Rap-Phr, 1α, 3α, 3β, 3γ, 4β, 5α and g QSSs are
distributed into 6 different gene families, and are encoded by (pro)phages of different hosts, our
results highlight, for the first time in bacteriophages, a remarkable convergent evolution of density-
dependent mechanisms of manipulation of a substantial spectrum of the bacterial biology: from
competence (18) (**Fig. 5**) to Spo0A-P target pathways (sporulation, biofilm formation, toxin
production or solventogenesis (21,22,43)) (**Fig. 4**).
423
These findings would have major implications, both fundamental and applied. For instance,
these sporulation- and competence-modulating QSSs in bacteriophages of *Bacillus*, *Clostridium*
and *Brevibacillus* bacteria could shed some new light on the molecular mechanisms underlying
antibiotic-resistance and host-to-host transmission of bacteria, with potential practical applications.
Indeed, bacterial competence is well known to contribute to the spread of antibiotic resistance
genes whereas sporulation is a developmental program through which many bacteria become
transmissible and resistant to a wide range of chemical products, including antibiotics.

Consistently, the sporulation of pathogenic bacteria represents a serious threat for human health.
For instance, it is under the form of endospores that *B. cereus* causes anthrax and food poisoning
and that *C. botulinum*, *C. perfringens* and *C. difficile* cause food poisoning, wood infection and
intestinal diarrhea, respectively (27,28). Hence, understanding which and how bacteriophages
dynamically modulate the competence and sporulation initiation pathways in Firmicutes bacteria
might open fascinating perspectives in microbiology, medicine and food industry.
437
Our results also have a fundamental implication. They challenge the sporulation paradigm,
which assumes that bacteria sporulate in adverse circumstances and implies that only bacterial
genes govern the sporulation decision-making process. Indeed, our computational survey invites to
reconsider the sporulation decision-making process as a biological process falling under the scope
of the (pro)phage-host collective, rather than a strict bacterial process of last resort. With this
regard, it is interesting to note that non-sporulating bacteria have been observed to form spores
when they are lysogenized by "spore-converting bacteriophages" (48–50). The converse case,
namely, the impairment of the capacity to sporulate caused by a prophages has also been
observed (51). Either way, these previously described activation or inhibition of the host sporulation
pathway by prophages happened to be constitutive and were therefore not the result of a decision-
making process, unlike the dynamical modulation of the sporulation pathway described in this
study, which is indeed predicted to be function of (pro)phage densities. Adopting an evolutionary
perspective provides original explanations on why (pro)phages may dynamically manipulate
bacterial sporulation. *Erez et al.* brilliantly demonstrated that the viral "arbitrium" QSS coordinates
the transition from the lytic cycle to the host-protective lysogenic cycle at high concentration of
arbitrium peptide (*i.e.* high phage densities), when a lot of host cells have been lysed and the
phage-host collective likely needs to be protected (4). On this basis, we can predict that the
manipulative phage-encoded candidate QSSs described in our study function according to the
same principle and optimize the trade-off between the replication of the phage and the protection
of the phage-host collective. Specifically, they could i) hijack the host sporulation/competence
pathway when densities of intracellular phage genomes reflect best timings for phages to maximize
their fitness irrespective of the fitness of their hosts, and ii) alleviate this manipulation when phage
densities reflect a benefit in letting hosts enact the survival/adaptive sporulation/competence
pathways. For instance, at low densities of free phages, when only a few bacteria are lysed and
the host population is not yet endangered, we can hypothesize that it might be beneficial for
phages to inhibit the sporulation/competence pathways for the following reasons. First, a phage
genome that is inside a sporulating will not be replicated by the cell (52). Second, the sporulation
initiation pathway can trigger cannibalistic behaviors that may kill neighbor cells and thereby
reduce opportunities for phages to replicate their genome (22,43). Third, the competence pathway
is proposed to enable a bacterium to pick up from the environmental pangenome the CRISPR-cas

system that specifically targets the phage DNA (53). However, when phages have well replicated at
the expense of their hosts, and when the survival of the phage-host collective is thus likely
compromised, it might then be best for phages to alleviate the manipulation of host survival
mechanisms. Indeed, under harsh environmental conditions, a time might eventually come when it
would be more advantageous for intracellular phage genomes to be protected inside bacterial
endospores rather than to keep promoting phage replication through sporulation inhibitions. In
addition to, or in place of their effects during the lytic cycle, we could also consider that the viral
QSSs described in this study may have been selected because of their beneficiary effects during
the lysogenic cycle. In light of this perspective, these viral QSSs could be considered as adaptive
genes for the host, conferring an evolutionary advantage upon the prophage-host collective relative
to non-lysogenized bacteria (54,55). For instance, as medium levels of Spo0A-P can enact the
biofilm pathway, prophage-encoded QSSs that antagonize Spo0A-P accumulation could provide
the lysogenized subpopulation with a means to temporarily delay the production of biofilm
molecules, hence temporarily increasing the fitness of the prophage-host collective (55).
482

CONCLUSION
In light of the density-dependent host-hijacking mechanisms discussed in this study, many
(pro)phage-encoded QSSs are likely to be extremely sophisticated regulatory systems, that can
subtly modulate the biology of a (pro)phage-host collective. Their in-silico identification constitutes
a fundamental step towards refining models of phage-host co-evolution, discovering novel
decision-making processes in bacteriophages, and foremost understanding the fundamental
molecular mechanisms underlying bacterial sporulation and competence, with major theoretical
and practical outcomes. The next step will naturally be to experimentally characterize the viral
candidate QSSs described in this study. Accordingly, we provided all the NCBI identifiers of the
pro-peptide and receptor proteins of our candidate (pro)phage-encoded QSSs in the main and
supplementary tables. We designed this survey to make it as easy as possible for experimentalists
to build on further functional studies, as we believe that this work has the potential to open many
fascinating perspectives in many different areas of biology.
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METHODS
Construction of the RRNPP-type signature
We carefully mined the literature to identify all experimentally characterized RRNPP-QSSs from
different families, fetch their representative sequence on the NCBI (56), visualize their genomic
context, and analyse their similarities to delineate decision rules for the detection of candidate
RRNPP-type QSSs. This dataset was composed of the following reference QSSs: *rapA-phrA*,
nprR-nprX, *plcR-papR*, *rgg2-shp2*, *aimR-aimP*, *prgX-prgQ* and *traA-iPD1*. The extreme values in
the lengths of these experimentally validated receptors and pro-peptides (**Fig. S2**) were used as

references to define ranges of acceptable lengths for candidate receptors and pro-peptides. PlcR being the shortest receptor (285aa) and NprR being the longest (423aa), we established **rule n°1** that candidate receptors must have a length comprised between 250aa and 460aa. Likewise, on the basis that Shp2 is the shortest pro-peptide (21aa) and AimP is the longest (49aa), **rule n°2** poses that candidate pro-peptides must have a length comprised between 15aa and 65aa. Because the genes encoding the receptor and the propeptide are always directly adjacent to each other in reference RRNPP QSSs (**Fig. S2**), **rule n°3** poses that the two genes of RRNPP-type candidate QSSs must be direct neighbors. Next, using InterProScan version *5.36-75.0* (57)*,* the protein sequences of reference RRNPP-type receptors were queried against the InterPro database of structural motifs to identify HMMs of tetratricopeptide repeats (TPRs) and DNA binding domains that are characteristic of these proteins. These HMMs (displayed in **Fig. S2**) were further retrieved and compiled in two distinct libraries, using hmmpress from the HMMER suite version *3.2.1* (58)*.* This allowed defining **rule n°4** that a candidate receptor must be matched by at least one HMM of the library of TPRs found within reference receptors (E-value<1E-5, 1000x times more stringent than default inclusion threshold). The HMM library of DNA binding domains was designed to predict whether a candidate receptor might function as an intracellular transcription factor. Finally, SignalP version *5.0b Linux x86_64* was run with the option '-org gram+' against the reference RRNPP-type pro-peptides to illustrate the reliability of this software to predict the SEC-dependent excretion of small quorum sensing peptides (59). Indeed, only the PrgQ and Shp reference pro-peptides were not predicted by SignalP to harbor a N-terminal signal sequence addressed to the SEC-translocon (**Fig. S2**), consistent with the fact that they are the only RRNPP-type pro-peptides mentioned to be exported via another secretion system, namely the ABC-type transporter PptAB (12). This legitimized the use of SignalP to establish **rule n°5** that a candidate pro-peptide must be predicted by SignalP to be secreted via the SEC-translocon.

Construction of the target datasets

The complete genomes of Viruses and Firmicutes were queried from the NCBI 'Assembly' database (56), as of 28/04/2020 and 10/04/2020, respectively. The features tables (annotations) and the encoded protein sequences of these genomes were downloaded using 'GenBank' as source database. The Gut Phage Database (13) was downloaded as of 29/10/2020, from the following url: http://ftp.ebi.ac.uk/pub/databases/metagenomics/genome_sets/gut_phage_database/

Detection of RRNPP-type candidate QSSs

We launched the systematical search of the RRNPP-type signature independently against i) the complete genomes of Viruses and Firmicutes available on the NCBI and ii) the MAGs of bacteriophages from the Gut Phage Database. **Step n°1** consisted in reducing the search space by sub-setting all the protein sequences of a dataset into two libraries: a library 'potential receptors'

containing the protein sequences of length between 250aa and 460aa and a library 'potential pro-
peptides' containing the protein sequences of length between 15 and 65aa. **Step n°2** further
reduced the search space by filtering all the proteins from one library whose coding sequence was
not directly adjacent with the coding sequence of a protein from the other library. In **step n°3**, an
HMMsearch of the HMM library of TPRs was launched with HMMER version *3.2.1* against the
remaining 'potential receptors' and only the sequences matched by a HMM with an E-value < 1E-5
(1000x times more stringent than default inclusion threshold) were conserved. Another coding
sequence adjacency filter was applied in **step n°4** to reduce the search space in the 'potential pro-
peptides' library. **Step n°5** filtered out all the remaining 'potential pro-peptides' that were not
predicted by SignalP to be secreted via the SEC-translocon. At last, the two libraries were
intersected to define candidate QSSs based on coding sequence adjacency. If a candidate
receptor happened to be flanked on both sides by two pro-peptides (or vice-versa), therefore if a
protein happened to be assigned to two distinct QSSs, only the QSS with the smallest intergenic
distance between the two genes was retained. Eventually, QSSs with intergenic distance >600 bp
were filtered out. Of the total of 2718 QSSs detected after the intersection of the two libraries, only
19 have been discarded by these ultimate filtering criteria. As a post-processing step, an
HMMsearch of the HMM library of DNA binding domains was launched against the candidate
RRNPP-type receptors to identify the receptors that are susceptible to be transcriptional regulators
(E-value < 1E-5).
561
Classification of the candidate QSSs into families
Because quorum sensing pro-peptides offer few amino acids to compare, are versatile and
subjected to intragenic duplication (35), we classified the QSSs based on sequence homology of
the receptors. We launched a BLASTp (34) All vs All of the receptors of the 2681 candidate QSSs
identified in the complete genomes of Viruses and Firmicutes. The output of BLASTp was filtered
to retain only the pairs of receptors giving rise to at least 30% sequence identity over more than
80% of the length of the two proteins. These pairs were used to build a sequence similarity network
and the families were defined based on the connected components of the graph (mean clustering
coefficient of connected components=0**.**97).
571
Identification of already known families
A BLASTp search was launched using as queries the RapA (NP_389125.1), NprR
(WP_001187960.1), PlcR (WP_000542912.1), Rgg2 (WP_002990747.1), AimR (APD21232.1),
AimR-like (AID50226.1), PrgX (WP_002366018.1), TraA (BAA11197.1) reference receptors, and
as a target database, the 2681 candidate QSS receptors found in complete genomes of Viruses
and Firmicutes. If the best hit of a reference RRNPP-type receptor gave rise to a sequence identity

>= 30% over more than 80% mutual coverage, then the family to which this best hit belongs is
considered as an already known family (**Table S2**).
580

Prophage detection

All the NCBI ids of the genomic accessions of chromosomes or plasmids of Firmicutes encoding
one or several candidate QSSs were retrieved and automatically submitted to the Phaster webtool
(32). Eventually, each QSS was defined as viral if its genomic coordinates on a given
chromosome/plasmid fell within a region predicted by Phaster to belong to a prophage (qualified as
either 'intact', 'questionable' or 'incomplete' prophage). Phaster results were complemented by
ProphageHunter (33), a webtool that computes the likelihood that a prophage is active (able to
reinitiate the lytic cycle by excision). Because ProphageHunter cannot be automatically queried,
we only called upon this webtool for chromosomes/plasmids which encode QSSs that are not part
of the biggest families, namely Rap-Phr (2257 candidate QSSs) and PlcR-PapR (223 candidate
QSSs). Likewise, coordinates of candidate QSSs were eventually intersected with predicted
prophage regions to detect potential prophage-encoded candidate QSSs that could have been
missed by Phaster (**Table 1**).
594

Prediction of the mature quorum sensing peptides

For each uncharacterized families of candidate receptors of size >1 with at least one (pro)phage-
encoded member, the cognate pro-peptides were aligned in a multiple sequence alignment (MSA)
using MUSCLE *version 3.8.31* (60). Each MSA was visualized with Jalview *version 1.8.0_201*
under the ClustalX color scheme which colors amino acids based on residue type conservation
(61). The region of RRNPP-type pro-peptides encoding the mature quorum sensing peptide usually
corresponds to a small sequence (5-6aa), located in the C-terminal of the pro-peptide, with
conserved amino-acids types in at least 3 positions (4,9,37,45). Based on the amino-acid profile of
C-terminal residues in each MSA, putative mature quorum sensing peptides were manually
determined (**Fig. S4**).
605

Phylogenetic trees of the Rap, QSS1R, QSS2R and QSS3R families

For each family shared between chromosomes and (pro)phages, a multiple sequence alignment
(MSA) of the protein sequences of the receptors was performed using MUSCLE *version 3.8.31*
(60). Each MSA was then trimmed using trimmal *version 1.4.rev2*2 with the option '-automated1',
optimized for maximum likelihood phylogenetic tree reconstruction (62). Each trimmed MSA was
then given as input to IQ-TREE *version multicore 1.6.10* to infer the maximum likelihood
phylogenetic tree of the corresponding family under the LG+G model with 1000 ultrafast bootstraps
(63). Each tree was further edited via the Interactive Tree Of Life (ITOL) online tool (**Fig. 2 and S3**)
(64).

Analysis of the genomic context of QSSs

The genomic context of the 20 (pro)phage-encoded candidate QSSs from unknown families were visualized using the nucleotide graphic report on the NCBI. We systematically retrieved the functional annotation of adjacent genes, and analyzed their sequences with a "Conserved Domains" search as well as a BLASTp search against the NR (non-redundant) protein database maintained by the NCBI. The genomic contexts of predicted sporulation-regulating QSSs are shown in **Fig. 3**.

Identification of rap, spo0E and AbrB genes in the Gut Phage Database

With HMMER, we launched an HMM search of reference HMMs of Rap (PFAM PF18801), Spo0E (PFAM PF09388) and AbrB (SMART SM00966) against all the protein sequences predicted from the ORFs of the MAGs from the Gut Phage Database. The hits were retained only if they gave rise to an E-value < 1E-5 (**Table S4**).

ABBREVIATIONS:
- HMMs: Hidden Markov Models
- MAGs: Metagenomics-Assembled-Genomes
- MGEs: Mobile Genetic Elements
- NCBI: National Center for Biotechnology Information
- Phages: Bacteriophages
- QSSs: Quorum Sensing Systems
- RRNPP: Rap, Rgg, NprR, PlcR and PrgX families of QSS receptors
- TPRs: TetratricoPeptide Repeats

AUTHOR CONTRIBUTIONS

C.B, Y.L, E.B and P.L conceived the study. C.B performed the analyses. C.B, Y.L and E.B wrote the manuscript with input from all authors. All documents were edited and approved by all authors.

DECLARATIONS

Ethis approval and consent to participate

Not applicable

Consent for publication

Not applicable

Availability of data and materials

All the NCBI or Gut Phage Database IDs of the proteins discussed in this manuscript are available in the supplementary tables.

Competing Interests

The authors of this manuscript have no competing interests to disclose.

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Authors' Contribution

C.B, Y.L, E.B and P.L conceived the study. C.B performed the analyses. C.B, Y.L and E.B wrote the manuscript with input from all authors. All documents were edited and approved by all authors.

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 FIGURE LEGENDS

Figure 1: Study design.

The RRNPP-type signature was independently queried against the complete genomes of

Firmicutes and Viruses from the NCBI and against the Gut Phage Database. This consisted of only

retaining pairs of adjacent genes encoding a medium-length protein matched by HMM models of

TPRs (the candidate receptor) and a small protein predicted by SignalP to harbor a N-terminal

signal sequence for the SEC-translocon (the candidate pro-peptide), respectively. The candidate

QSSs were further classified into families, defined as groups of homologous receptors in a

BLASTp all vs all. This study further focused on families in which at least one QSS is encoded by a

phage or a genomic region predicted by Phaster and/or ProphageHunter to belong to a prophage

inserted within a bacterial genome. Subsequently, each QSS family with viral representatives was

computationally characterized. Protein families of receptors shared between bacterial genomes

and phage genomes were aligned, trimmed and given as input to IQ-TREE to construct

phylogenetic trees in order to visualize if and how QSSs travel onto different kinds of genetic

supports (chromosomes, plasmids, phage genomes) rather than to stay in their hosts lineages. In

QSS families comprising more than one QSS, the propeptides were also aligned and visualized

with Jalview to predict the sequence of each mature peptide. Finally, as RRNPP-type receptors

that are transcription factors tend to regulate adjacent genes, the genomic neighborhood of each

(pro)phage-encoded receptor with a detected DNA binding domain was analyzed to predict the

functions regulated by the QSS.

Tree scale: 0.1 ⊢⊣

Strip color

Chromosome

Plasmid

Free phage

Intact prophage

Questionable prophage

Incomplete prophage

Branch color

Rap (B. cereus group)

Rap (B. subtilis group)

NprR
(extremophile Bacillaceae)

NprR (B. cereus group)

RapBL5 of Bacillus
licheniformis prophage

Rap of Bacillus
phage phi3T

 Figure 2: Polyphily of viral Rap-Phr QSSs linked to sporulation regulation.

The figure displays the maximum-likelihood phylogenetic tree of the family comprising the Rap (no
DNA binding domain) and the NprR (DNA binding domain) receptors that are part of a detected
RRNPP-type QSS. The clustering of Rap and NprR into the same protein family is consistent with
the common phylogenetic origin proposed for these receptors (65). The tree was midpoint rooted
and a small black circle at the middle of a branch indicates that the branch is supported by 90% of
the 1000 ultrafast bootstraps performed. Branch colors are indicative of the type of receptor (Rap
or NprR) and of the bacterial group that either directly encodes the QSS or hosts a (pro)phage that
encodes the QSS. The colorstrip surrounding the phylogenetic tree assigns a color to each leaf
based on the type of genetic support that encodes the QSS: blue for chromosomes, orange for
plasmids, dark purple for free phage genomes, different levels of purple for Phaster-predicted
intact, questionable and incomplete prophages. The Rap receptors of Bacillus phage phi3T (only
Rap found in a free phage genome) and of *B. licheniformis* intact prophage (viral Rap shown to
modulate the sporulation and competence pathways of its host) are outlined.

A NCBI Complete Genomes

Bacillus phage phi3T
Rap-Phr

Brevibacillus phage Sundance
QSS1α

Spo0E

ALA47936.1

Rap
Negative
regulator of
sporulation

APD21157.1

Ambiguous prophage
of *Clostridium
saccharoperbutylacetonicum*
QSS3β

putative
biotin operon
repressor

Spo0E

Spo0E
Negative
regulator of
sporulation

AGF59421.1

Active prophage of
Brevibacillus brevis
QSS4β

DNA entry nuclease
excisionase
DNA entry nuclease
AbrB
Germination protease
Yyac
Replication terminator Tap protein

VEF87585.1

Active prophage of
Brevibacillus 7WMA2
QSS5α

AbrB

QIC08170.1

Active prophage
of *Clostridium
acetobutylicum*
QSSg

AAK79911.1

phage-related
anti-repressor

AbrB
Ambi-active
regulator of
sporulation

B Gut Phage Database

Prophage of
Bacillus subtilis
Rap-Phr

ivig_3329_23

QS receptor

QS pro-peptide

Sporulation
regulator

Transcription factor

Other protein

Uncharacterized
protein

 Figure 3: Key sporulation regulators in the genomic neighborhood of (pro)phage-encoded

QSSs.

The genomic contexts of viral QSSs that are adjacent with homologs of regulators of the

sporulation initiation pathway are displayed. Panel A corresponds to QSSs found inside complete

genomes of the NCBI whereas panel B corresponds to QSSs found within MAGs of intestinal

bacteriophages from the Gut Phage Database. Arrow sizes and distances between arrows are

approximately proportional to gene lengths and to intergenic distances, respectively. Genes are

colored according to their functional roles, as displayed in the legend. The *rap* gene is colored in

both green and brown because it functions both as a QSS receptor and as a potential inhibitor of

the sporulation initiation pathway. The text inside quorum sensing receptor genes correspond to

the NCBI or Gut Phage Database identifier of the related protein. The taxonomic label of each

genomic context refers to the name of the genome that encodes the QSS. The Rap-Phr operon of

phage phi3T displayed in the top left is representative of all the other 324 prophage-encoded Rap-

Phr found inside *Bacillus* genomes.

Bacillus bacteria

Stress

KinA,B,C,D,E — P

Rap-Phr antagonizes sporulation at low (pro)phage densities

Spo0F

Spo0F — P ⊣---- **Rap** ⊣---- **Phr**

Spo0B

Spo0B — P

Spo0A

QSS1αR •---- **QSS1αP**

σH ← **Spo0A** — P ⊣--- **Spo0E**

QSS4βP

BIOFILM & CANNIBALISM ⊣ **AbrB** •— **QSS4βR**

SPORULATION **QSS5αR**

Concentration

QSS5αP

Clostridium bacteria

Stress

Histidine kinases — P

QSS3β antagonizes sporulation at high (pro)phage densities

Spo0A

QSS3βR ⊣---- **QSS3βP**

Spo0A — P ⊣--- **Spo0E**

TOXINS SOLVENTOGENESIS

SPORULATION

Concentration

(?) **AbrB** •— **QSSgR**

QSSgP

Legend

Quorum of (pro)phages is met

---- Regulation at the protein level

— Regulation at the transcriptional level

 Figure 4: Predicted modulations of the sporulation initiation pathway mediated by
(pro)phage-encoded QSSs

The left and the right panels display the sporulation initiation pathway of the *Bacillus* genus and of the *Clostridium* genus, respectively. Transcriptional regulations are depicted by plain lines, whereas regulations at protein levels are depicted by dashed lines. At the end of each line, an arrow depicts an activation, a "T" symbol depicts an inhibition while a circle depicts an unknown direction of regulation. Written in grey are the inactive forms of sporulation proteins whereas their active, phosphorylated forms are written in black. The gradient of concentration starting from Spo0A-P indicates that sporulation is triggered by high levels of the master Spo0A-P regulator. Lower concentrations of Spo0A-P can trigger other bacterial processes than sporulation, as they may relieve a specific environmental stress and thus prevent, through alleviation of Spo0A phosphorylation, from a costly commitment to spore formation. The brown proteins (Rap, Spo0E and AbrB) depict regulators of Spo0A-P accumulation that are encoded by both bacteria and (pro)phages. The expression of (pro)phage-encoded *rap*, *spo0E* or *abrB* thus likely amplifies, by additive effect, the step of the host pathway controlled by each corresponding bacterial homolog. Red and green proteins depict the mature peptide and the receptor of a (pro)phage-encoded QSS inferred to regulate (pro)phage-encoded Rap, Spo0E or AbrB. An icon of grouped phages signifies that the regulation from the mature peptide to the receptor is expected to happen only at high (pro)phage densities. Each icon has its own color to highlight that the QSS genetic systems are encoded by different (pro)phages. These mechanisms are proposed to enable some bacteriophages to modulate the host sporulation initiation pathway in a density-dependent manner.

Bacillus bacteria

High densities of Bacilli

ComP — **P**

ComA

ComA — **P** ⊣├---- **Rap** ├---- **Phr**

Rap-Phr antagonizes competence at low (pro)phage densities

ComS

MecA

ComK ⊣── Rok

COMPETENCE

AbrB

QSS4βP

● QSS4βR

● QSS5αR

QSS5αP

Quorum of (pro)phages is met

---- Regulation at the protein level

── Regulation at the transcriptional level

Figure 5: Predicted modulations of the competence pathway mediated by (pro)phage-encoded QSSs

This figure displays the competence pathway of the *Bacillus* genus and is built according to the same codes as figure 5. The modulations of AbrB and Rap total concentrations mediated by (pro)phage-encoded QSSs are proposed to enable encoding bacteriophages to interfere with the host competence pathway in a density-dependent manner.

SUPPLEMENTAL INFORMATION

- **Fig. S1**: canonical mechanism of RRNPP-type QSSs
- **Fig. S2**: common features between experimentally validated RRNPP-type QSSs
- **Fig. S2**: phylogenetic trees of candidate receptor families shared between (pro)phages and bacterial genomes
- **Fig. S3**: multiple sequence alignments of QSS families cognate pro-peptides
- **Table S1**: Candidate QSSs of the 16 families with at least 1 (pro)phage-encoded candidate QSS detected in NCBI complete genomes
- **Table S2**: Candidate QSSs matching already known QSS families
- **Table S3**: QSSs in the genome of *Clostridium acetobutylicum* ATCC 824
- **Table S4**: Hits of Rap, Spo0e and AbrB HMMs in the Gut Phage Database
- **Table S5**: Candidate QSSs found in the Gut Phage Database

 Supplementary figures legend

Figure S1: **canonical mechanism of RRNPP-type QSSs**.

The left panel shows the behavior of a RRNPP-type QSS at low population densities of its encoding

DNA molecule: a bacterial chromosome, a plasmid, a free phage genome, or a prophage inserted into

the bacterial genome. Upon bacterial expression of the QSS, an intracellular receptor (in green) and a

pro-peptide (in red) are produced. The pro-peptide contains a N-terminal signal sequence (in dark red)

that tags the protein for transport through the cell membrane, typically via the SEC-translocon. Upon

secretion, the propeptide is cleaved by exopeptidases, which releases a small mature quorum sensing

peptide into the extracellular medium. The right panel shows the behavioral switch that is triggered

when high concentrations of the peptide are reached, reflecting high densities of the encoding

population. The peptide is robustly imported by bacteria and within QSS-expressing cells, binds with

the tetratricopeptide repeats (TPRs) of its cognate receptor. Upon binding with the peptide, the

receptor undergoes a conformational change and gets either turned-on or -off. This results in the

subsequent downregulation or upregulation of target gene(s) according to the four displayed

scenarios, depending on whether the receptor acts as a repressor or as an activator. Of note, such

regulations can also happen at the protein level if the receptor is a protein regulator rather than a

transcription factor. This quorum sensing mechanism allows a RRNPP-type QSS-encoding population

to coordinate behavioral transitions in a density-dependent manner.

Figure S2: **Common features between experimentally validated RRNPP-type QSSs**.

Each genomic context corresponds to the representative QSS of an experimentally-characterized
RRNPP-type QSS family: rapA-phrA (loci BSU_12430 and BSU_12440 in B. subtilis genome
NP_389125.1), nprR-nprX (loci BTHUR0002_RS02765 and BTHUR0002_RS32155 in B. thuringensis
genome NZ_CM000747.1), plcR-papR (loci EJ379_RS27345 and EJ379_RS27340 in B. cereus
genome NZ_CP034551.1), rgg2-shp2 (loci SD90_RS02145 and SD90_RS09265 in S. pyogenes
genome NZ_CP010450.1), aimR-aimP (loci phi3T_89 and phi3T_90 in B. phage phi3T genome
KY030782.1), prgX-prgQ (genes prgX and prgQ in E. faecalis plasmid pCF10 AY855841.2) and traA-
iPD1 (genes traA and iPD1 in E. faecalis plasmid pPD1 D78016.1). The icon at the left of each context
indicates the genetic element that encodes the QSS (bacterial chromosome, phage genome or
plasmid) and the associated label indicates the genome to which this genetic element belongs. The
green gene corresponds to the quorum sensing receptor and the red gene to its cognate propeptide.
The intergenic distance between the two genes is given in number of base pairs. The length of each
gene is given by the number of amino acids in the translated protein. The hairpin symbol depicts an
intrinsic terminator and a grey gene indicates an adjacent, target gene regulated by the QSS. The
number above each pro-peptide corresponds to the likelihood, computed by SignalP, that the
propeptide harbors a N-terminal signal sequence for the SEC-translocon. A likelihood score colored in
red means that the propeptide is predicted by SignalP to be secreted via the SEC-translocon whereas
a score colored in grey means that it is predicted to be secreted otherwise. The green letters above
the C-terminal encoding region of each receptor indicate the names of the HMM (PFAM, SMART,
TIGR) or of the HMM family (CATH, SuperFamily) of Tetratricopeptide repeats (TPRs) that are found
within the sequence of the translated protein. The roman numbers above the N-terminal encoding
region of each receptor indicate the names of the HMM or of the HMM family of DNA binding domains
found in the sequence of the translated protein.

A QSS1R family

Tree scale: 1

B QSS2R family

Tree scale: 1

C QSS3R family

Tree scale: 0.1

 Figure S3: Phylogenetic trees of candidate receptor families shared between (pro)phages and bacterial genomes

Each maximum-likelihood phylogenetic tree is unrooted. Black dots indicate that the branch is supported by 90% of the 1000 ultrafast bootstraps performed. The color of the leaves indicate the genetic element encoding the QSS: blue for chromosomes, orange for plasmids, purple for phage genomes and predicted prophages.

QSS1 family

```
VEF92013.1__15653/1-36    1 -MQKLLLVFALVVFFSSPVVSEAYDP------------------------TSEPYRVEPDW    36
VEF87511.1__15653/1-40    1 MKKWILSLCMLTAFVTLPVLVEQPAK---------------------QTNSIIQYGWPEPW    40
AIG26091.1__1534/1-45     1 MRKKIVLMLLTLGLITNMGFALVKTDEANNL----------------NTFSMRANNADPGY  45
AWX59017.1__4003/1-59     1 MKKKASFLLVALSMVLGSFLAIDVPYKNSNNDSLLAVDVPYGISKEKSNSPQRVPDPGY    59
ALA47937.1__5003/1-48     1 -MKRIFWGVSVFLTMFSFSLLALENDKTEHSTNKI------------QHYAITVYTDNPGY    48
AIG25196.1__1534/1-46     1 MMKKIVISTIIFSTFLSLTFIVYDKFMGVYSE---------------KYSASKVYNEDPGH    46
AIG25890.1__1534/1-46     1 -MKKLVIVSVVFSSILSSFVFIDMDNCSEKEYA--------------SYQSIQVFFEDPGH    46
AIG24640.1__1534/1-45     1 -MKKIVVATSIILASLSLTFLFSIERQTENQI---------------VSGHIKVYTGDPGH    45
QIC04468.1__14625/1-47    1 MKKFVLTASVLLLSLSLSTPFLSVDK--PIEKRLF------------STNTFKPYTGDGGH    47
VEF91398.1__15653/1-46    1 MRKFLAVLSRVSLVIACFLVVVSTGANSMSLP---------------KKPPIIMYSDNPEG    46
AIG25410.1__1534/1-46     1 MKKRLTVLMTASLVLCSSLFAVAIFSNSEDHV---------------VYSSIKVYTDNPGH    46
AIG24914.1__1534/1-46     1 MKKYLALITTVSLVLLSSLFTMEITGKFEVNN---------------VASSMKPYTDDPQG    46
QIC07891.1__14625/1-45    1 -MKKYLTIIATVSFVICSLFTVASFLDFEKYG---------------EQQSAKTFHDDPQG    45
AIG25316.1__1534/1-45     1 -MKKTVVATVLSLTLLVAMNVVPLYKTTDSNI---------------TAFKVIPTVVDPGH    45
AIG28939.1__1534/1-44     1 -MKKVIGMLLMSVTMLVTVTLTDSVVPTPSG----------------TSLQVQPSDYDPGY    44
AIG27198.1__1534/1-48     1 -MKKLISILTLALAIICFISTESPTSDSNATTKKI------------GLYTIQQNHYDPGY    48
QIC05360.1__14625/1-48    1 -MKKLISILTLALAIICFISTESPTSDSNATTQKI------------GLYTIQQNHYDPGY    48
AIG28870.1__1534/1-44     1 -MKKAIITIFMTLALVTSIGSIDSFSHVAEA----------------SKPHAIQYVYDPGF    44
```

QSS2 family

```
AVF28101.1__8996/1-49     1 -MKI-KNWILCITVAITLIGGSSAFSTTTQATASN-----------ATIALS-DHGVGGDYAS    49
AVF32604.1__8997/1-49     1 -MKI-KNWILCITVAITLIGGSSAFSTTTQATASN-----------ATIALS-DHGVGGDYAS    49
AVF23670.1__8994/1-46     1 -MKI-KKYLVFLILTFSLLYVVNGINPDKTHEAAK-----------QSVIAYAENGVGE----    46
QHZ49846.1__14754/1-46    1 -MKI-KKYLVFLILTFSLLYVVNGINPDKTHEAAK-----------QSVIAYAENGVGE----    46
AVF24715.1__8996/1-58     1 MKKF-KKLLLSVVLAAAILGGGIALNLPQTSEDSAVAALHGTGQAPANMSVAALHGTGQ---    58
AVF29476.1__8997/1-58     1 MKKF-KKLLLSVVLAAAILGGGIALNLPQTSEDSAVAALHGTGQAPANMSVAALHGTGQ---    58
QHZ55460.1__2483/1-47     1 MKKFVKGFVLSLCLVLGLGFGINVHIADGKVITIK-----------PPIIQY-DHGVGG---    47
AHM68195.1__2742/1-33     1 -MQF-KNLKYMLIIG---LFGFLELS---------------------HTITVF-GHGTGA---    33
VEF92630.1__15653/1-42    1 ---M-RSMILLLTVLFGLSHGIV-VPDHQEVLSSH------------HVVTTY-THGAGG---    42
VEF91032.1__15653/1-44    1 -MKL-KMFSLSFALFFSLCIGIVNSETSSSNTMSR------------PNVTTY-THGMG----    44
```

QSS3 family

```
AGF56488.1__2211/1-54     1 MKKLLLLTMVACVVLLSNVAFAATKTTSTTTDTKSTITS-SSGEKFHLDSRDPDGW------    54
AQR95596.1__6751/1-54     1 MKKLLLLTMVACVVLLSNVAFAATKTTNTTTDTKSTITS-SSGEKFHLDSRDPDGW------    54
AQR92768.1__6751/1-53     1 MKKIVLAVLATSMLLTNVAFASTETTHTKSTQNSTISKVTQNNGYKLMTHDAN---------    53
AGF53864.1__2211/1-49     1 MKKIILAVIATSMLLTNVAFASTKTTH----KNTNSTKVTQNNVYSVNSIDPH---------    49
AGF55936.1__2211/1-53     1 MKKIILAVMATSMLLTNVAFASTKTTHTKITKNSTVSSVDPNNVYHLNTLDPN---------    53
AQR94680.1__6751/1-64     1 MKKIILAVMATSMLLTNVAFASTKTTHTKITKNSTVSSVDPNNVYHLNTLDPNNVYHLNTLDPN    64
AGF59420.1__2211/1-53     1 MKKIILAVIATSMLLTNVAFASTKTTHTNTGKNTTVSSVKQNSMYHLNTTDPY---------    53
```

QSS4 family

```
VEF87223.1__15653/1-63    1 -MKRILFATFAALMIGLVTPSTGVFAGPPENDKVAP-IAIDHSDGVEKFPRQKPPIVVYGPPEND    63
VEF87586.1__15653/1-63    1 MKKKLIFIPSLALLIGLFTANEVSLAGPPDGWGIAPETKVIQTGDSEPTTWGVSPLG--GPPDGW    63
```

QSS5 family

```
AIG27472.1__1534/1-48     1 -MKKLFASSLVLFAFLLMSSSMVSTEESVQVTAEKATAHFIQYSTAPDW    48
QIC08171.1__14625/1-46    1 MKKKLVAFSLALVTLVGI-SSVVGAEKSIQNVHSKPSA--IQYITEPEW    46
```

QSSg family

```
QspH/1-38                 1 ----MNSRVKKLLFLVLCSFII---IGYLSVNHISVLASYPGWSW-------    38
AAK81614.1/1-41           1 -MGNMNSRVKKLLFLVLCSFII---IGYLSVNHISVLASYPGWSW-------    41
QspB/1-50                 1 --MLPKKSNKFILVLILCAIVFVSAFALNTSGTRSLLGAEPTWGWNISKLLF    50
QspF/1-39                 1 ----MFFKRYKKLLFIAGILAAV---LTINLGLNGNLLSGLPLMVW-------    39
QspD/1-41                 1 -MFFLKKHKKFLSMLVLTLVI--GVLVTTKGGISILSMFPDAPW-------    41
QspA/1-41                 1 -MITVLKKHRFLISVLTLGVLF---LCIVFTNSSYILSGAPCIPW-------    41
QspC/1-38                 1 ----MFLKRHKLIFSILLLGTLI---LGVTFFKS-SLLAFYPGMPW-------    38
QspE/1-41                 1 MRIVFFKRHKFLLTVLALGILF---LGATFFGN-SLLSAFPDLPW-------    41
QspG/1-39                 1 ----MLLKKHKLAFSVLALTLLF---LGVNFLGNNVGLSVSPMTPW-------    39
```

Figure S4: Multiple sequence alignments of QSS families cognate pro-peptides

The figure displays the multiple sequence alignment of cognate propeptides for each receptor family of

size > 1 that includes at least one (pro)phage-encoded QSS. A purple circle at the left of each protein

identifier of the propeptide indicates that the QSS was found in a free phage genome whereas a

purple circle indicates that the QSS was found in a predicted prophage region. The residues are

colored according to the ClustalX colorscheme

(http://www.jalview.org/help/html/colourSchemes/clustal.html), which colors amino acids based on

residue type conservation (hydrophobic, positively charged, negatively charged, polar etc…). Pro-

peptides are characterized by a N-terminal region composed of positively charged amino acids (R, K),

followed by a hydrophobic region. The mature peptide (typically 5 to 6 aminoacids) is usually encoded

by a C-terminal region of the propeptide and is characterized in the alignment by the entanglement of

conserved and variable positions.