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Whole transcriptome analysis highlights nutrient limitation of nitrogen cycle bacteria in simulated microgravity

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Regenerative life support systems (RLSS) will play a vital role in achieving self-sufficiency during long-distance space travel. Urine conversion into a liquid nitrate-based fertilizer is a key process in most RLSS. This study describes the effects of simulated microgravity (SMG) on *Comamonas testosteroni, Nitrosomonas europaea, Nitrobacter winogradskyi* and a tripartite culture of the three, in the context of nitrogen recovery for the Micro-Ecological Life Support System Alternative (MELiSSA). Rotary cell culture systems (RCCS) and random positioning machines (RPM) were used as SMG analogues. The transcriptional responses of the cultures were elucidated. For CO₂-producing *C. testosteroni* and the tripartite culture, a PermaLifeTM PL-70 cell culture bag mounted on an inhouse 3D-printed holder was applied to eliminate air bubble formation during SMG cultivation. Gene expression changes indicated that the fluid dynamics in SMG caused nutrient and O₂ limitation. Genes involved in urea hydrolysis and nitrification were minimally affected, while denitrification-related gene expression was increased. The findings highlight potential challenges for nitrogen recovery in space.

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INTRODUCTION

The capacity to supply food, water, and a breathable atmosphere in a robust and reliable manner over time is one of the major challenges in long-distance space travel beyond low Earth orbit (LEO). In that regard, regenerative life support systems (RLSS) have recently attracted significant attention due to their potential to allow circular resource recovery and utilization in the scope of long-duration space missions. Over 30 years ago, the European Space Agency initiated the Micro-Ecological Life Support System Alternative (MELiSSA)¹. MELiSSA consists of five compartments populated by micro-organisms, higher plants or the crew. Its purpose is the total recovery of the elements or molecules in the crew's waste streams, converting them to potable water, oxygen and food². In the initial MELiSSA configuration, the third compartment (CIII) is responsible for the conversion of NH_4^+ to NO_3^{-2} . Currently, NH_4^+ is oxidized aerobically to NO_2^{-1} by the autotrophic gram-negative NH4+-oxidizing bacterium Nitrosomonas europaea. Nitrobacter winogradskyi, an autotrophic gramnegative NO_2^- -oxidizing bacterium, converts NO_2^- to $NO_3^$ aerobically, which is then used as a nitrogen source for cyanobacteria and higher plants in compartments IVa (CIVa) and IVb (CIVb), respectively². The initial nitrification system CIII is metabolically unable to directly treat urine. However, efficient urine treatment is necessary since urine contains 85% of recoverable N in a RLSS, mostly present as urea³. Urea can be hydrolyzed to NH_4^+ and CO_2 in a process called ureolysis. A previous study already showed the feasibility of ureolysis in combination with nitrification using the heterotrophic gramnegative urease-positive bacterium Comamonas testosteroni in a synthetic tripartite community together with *N. europaea* and *N.* winogradskyi⁴. Furthermore, such a heterotroph is needed to convert the oxidizable organics contained in urine, enabling

recovery of the majority of this carbon as CO_{2r} and to avoid fueling undesired microbial growth in a downstream compartment.

In the context of a RLSS design for space, the microgravity environment might play an important role in activity of the N-cycle species. It reduces shear forces and minimizes convection, hydrostatic forces and density differences in fluid systems⁵. Consequently, a nutrient-depleted zone can form around metabolically active bacterial cells because the nutrients only disperse through the slow diffusion process^{6,7}. Experimental work on bacteria in both real and simulated microgravity (SMG) has shown pronounced effects on the bacterial metabolism^{8,9}, nutrient availability¹⁰, bacterial proliferation^{9,11}, motility and biofilm formation^{12–14}, quorum sensing¹⁵, osmolarity^{14,16}, secondary metabolism¹⁷, stress resistance^{10,16,18} and virulence^{9,17}.

The effects of microgravity on ureolytic and nitrifying communities still have to be elucidated. Previous spaceflight experiments have shown that N. europaea and N. winogradskyi, inactivated by storage in respectively NH_4^+ or NO_2^- -depleted growth medium, can be reactivated by addition of the nitrogen electron donor after exposure to spaceflight in LEO^{19,20}. Active nitrification, on the other hand, has been performed in the Closed Equilibrated Biological Aquatic System (C.E.B.A.S.)^{21,22} and in a mission of the National Space Development Agency of Japan (NASDA)²³. In these artificial aquatic ecosystems, a consortium of ammoniumoxidizing bacteria removed NH₄⁺ excreted by fish to NO₃⁻, and retained good water quality for the fish²¹⁻²³. However, in situ ureolytic and nitrification activities in the context of RLSS design, and the effect of spaceflight on the responsible strains, have not been demonstrated yet. This paper represents terrestrial experiments conducted with microgravity analogs to understand the consequences of simulated microgravity (SMG) on gene expression of N-cycle bacteria.

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Fig. 1 Simulated microgravity setup with PL-70 cell culture bags. Pictures of in-house designed 3D-printed cell culture bag holders for (a) Rotary cell culture system (RCCS) and (b) Random positioning machine (RPM) cultivation and (c) Mixing of crystal violet in normal gravity (NG) and low-shear modeled microgravity (LSMMG) after injection with a needle syringe through the sample port.

SMG is mimicked with a rotary cell culture system (RCCS) or a random positioning machine (RPM), which respectively produce low-shear modeled microgravity (LSMMG) or randomized simulated microgravity (RSMG). The RCCS continuously rotates perpendicular to the gravity vector, keeping the cells in a suspended orbit. As a result, it creates a constant free-fall of the cells through the culture medium. Solid body rotation of the liquid is generated and fluid dynamics are minimized^{7,24}. On the other hand, an RPM rotates with random accelerations and orientations in a 3D plane. This theoretically causes bacterial cells to experience a nullified net gravity vector^{25,26}. Fluid motion in the RPM, however, is characterized by increased shear forces and enhanced convection as opposed to LSMMG and real microgravity²⁵. Both microgravity-analog devices were used in this study to provide a more complete picture of the effects of different SMG conditions.

A global transcriptional analysis was performed on both axenic *C. testosteroni, N. europaea* or *N. winogradskyi* cultures as well as on the tripartite culture cultivated in SMG conditions. To our knowledge, this study is the first to analyze the effects of spaceflight-analog conditions on the gene expression profiles of nitrogen cycle bacteria.

RESULTS AND DISCUSSION

Fluid mixing in cell culture bags mounted on RCCS and RPM hardware

During the first cultivation of *C. testosteroni* and the tripartite culture in regular RCCS vessels, we noticed that the vessels were unable to eliminate gaseous CO_2 produced during ureolysis and oxidation of organics through its gas-permeable membrane. These gas bubbles heavily disrupt the solid-body rotation of the liquid in LSMMG. Consequently, they strongly increase shear rate and introduce additional fluid dynamics that negate the SMG environment. For this reason, an alternative to the conventional RCCS container, that was used for both LSMMG and RSMG, was introduced. PermaLifeTM PL-70 cell culture bags are made of a gas-permeable fluoroethyl polymer film that ensures gas exchange with the environment, but with a larger surface area and possibly

a higher gas-exchange rate than the gas-permeable membrane on the RCCS. Using in-house designed 3D-printed holders (Fig. 1a, b) for these cell culture bags, we were able to grow *C. testosteroni* and the tripartite community in LSMMG and RSMG with substantially less gas bubble formation. Throughout SMG cultivation, gas bubbles did not have to be removed, resulting in a continuous SMG environment without disruption to eliminate formed gas pockets.

The level of fluid dispersal in normal gravity (NG), LSMMG and RSMG in cell culture bags was assessed using a 0.03% crystal violet solution to validate their use for SMG experiments (Fig. 1c). In both NG and LSMMG, the crystal violet dispersed in a spiral-like pattern immediately after rotation started. After 10 min, 30 min and 1 h of rotation, slow mixing gradually occurred. After 2 h, the dye was completely mixed in both conditions (pictures after 2 h not shown).

In the conventional RCCS vessel, solid-body rotation takes place with minimal mixing occurring in LSMMG^{10,13}. With the use of cell culture bags, on the other hand, the observed mixing is probably a residual effect stemming from the non-cylindrical shape of the bag. Near the corners, the liquid deviates from the circular trajectory and consequently affects the uniformity of the circular motion in the center of the liquid, adding small shear dynamics. During the growth of C. testosteroni in LSMMG, an aggregate of bacterial mass remained stationary during rotation, as shown in the video in the supplemental information (Supplemental Movie 1). This provided us with a visual confirmation that the biomass and potentially the fluid in close proximity to the biomass exhibited negligible movement and remained in a "free-fall" state during the rotational motion of the system. Meanwhile, fluid mixing in the RPM was almost instantaneous, as was also previously observed in another study by Crabbe et al.¹⁰. Within 10 s, the dye was homogeneously dispersed in the liquid. The fluid dynamics of the RPM in a cell culture bag should be highly similar to any other experiment conducted with the RPM, since any container filled to capacity can be considered in an experimental setup with dimensions suitable for the RPM. Due to their efficacy in mitigating air bubble formation during SMG studies on C. testosteroni, these PL cell bags can also be utilized for future SMG





studies concerning gas-producing microorganisms. For example, *Limnospira indica* and other photosynthetic oxygenic microorganisms can produce consumable biomass and convert CO_2 to O_2 , producing a considerable amount of gas bubbles in the process. This makes them difficult to cultivate them in SMG. These organisms often form a crucial element within a RLSS and insights into their growth under SMG conditions will be very valuable for the development of these systems.

Culture growth under simulated microgravity conditions

 OD_{600} measurements (Fig. 2a) and LIVE/DEAD ratios (Fig. 2b) of the cultures grown in RSMG, LSMMG and NG were determined at the experiment endpoint. This occurred after 3 days of growth in SMG for *C. testosteroni*, 5 days for the nitrifiers and 20 days for the tripartite culture. LIVE/DEAD ratios were calculated by dividing the total number of intact cells (LIVE) by the total number of damaged cells (DEAD) and was used as a viability indicator.

No significant differences in biomass were identified for the axenic nitrifying strains. *C. testosteroni* in RSMG grew significantly less biomass (ANOVA, p = 0.0059) in comparison to NG while measured cell density of the tripartite culture in LSMMG was significantly higher (ANOVA, p = 0.0255) compared to NG.

In previous SMG studies, increased growth was observed in several Escherichia coli strains, Salmonella enterica, Salmonella enteriditis, Stenotrophomonas maltophilia and Vibrio natriegens during growth in LSMMG or spaceflight conditions²⁷⁻³³, whereas Rhodospirillum rubrum, Staphylococcus aureus and E. coli K12 did not differ in proliferation in LSMMG^{15,34,35}. The aerobic growth rate of Lactobacillus acidophilus was increased in LSMMG but the final cell density did not, while anaerobically grown L. acidophilus displayed no differences in growth rate compared to NG^{36,37}. Finally, two studies on Pseudomonas aeruginosa or Limosilactobacillus (formerly Lactobacillus) reuteri in both RMSG and LSMMG displayed no proliferation differences compared to NG^{10,18}. An array of other species also show either increased or similar growth in LSMMG (reviewed in refs. 9,38). To our knowledge, C. testosteroni is the only bacterium that displayed decreased cell densities in RSMG, which has not been observed previously in other RSMGgrowing strains but is consistent with some spaceflight studies^{29,30}.

LIVE/DEAD analysis identified a significant decline in viability (ANOVA, p < 0.0001) of axenic C. testosteroni in LSMMG and of axenic N. europaea in RSMG (ANOVA, p = 0.0285) and LSMMG (ANOVA, p < 0.0001) while the viability of *N. winogradskyi* was increased in both RSMG (ANOVA, p < 0.0001) and LSMMG (ANOVA, p < 0.0001). No differences were observed in the viability of the tripartite culture compared to NG, but the viability was sharply decreased in comparison to the axenic cultures. However, this might be a consequence of the culture's age, reaching 20 days. At this stage in a batch configuration, C. testosteroni is already far into its stationary phase, which could have resulted in higher cellular turnover. In previous SMG experiments, V. natriegens¹¹ and L. reuteri18 displayed a higher survival compared to NG while no differences in viability were observed in Streptococcus mutans³⁹. The former observations are consistent with N. winoaradskvi's viability in SMG. On the other hand, we observed decreased viabilities of C. testosteroni and N. europaea, which was not found, to our knowledge, in other bacteria grown in SMG. Meanwhile, the viability of the tripartite culture in LSMMG was comparable to the NG control but the culture displayed an increased final cell density, indicating a potential positive effect on growth for all or some of the strains in LSMMG. How microgravity affects bacterial growth remains ambiguous and seems to be dependent on the bacterial species or strain^{27–32}, growth conditions (such as oxygen availability and type of medium)^{36,37}, and the method of simulating microgravity and the presence of other bacterial species, as observed in this study. Finally, similarities in proliferation and viability in SMG compared to NG do not necessarily reflect that the bacteria do not experience any effects from SMG. This was also observed in *S. mutans*, where similar proliferation and viabilities were observed accompanied by a significant shift in the transcriptomic and metabolomic profile when cultured in LSMMG³⁹.

To determine differences in the relative abundance of the three strains present in the synthetic community, gPCR was conducted (Fig. 2c). C. testosteroni exhibited the highest biomass proportion in all three conditions, with an average abundancy of 80%, 76%, and 77% after 20 days of growth in respectively NG, RSMG and LSMMG. N. europaea accounted for 19%, 23%, and 21% while N. winoaradskvi contributed 1.5%, 1.4% and 1.4% to the tripartite community. N. europaea and N. winogradskyi grew in a ratio of ~15:1 across all three conditions. In a previous chemostat coculture study, the ammonia and nitrite oxidizers were present in a ratio of 4:1, while in a biofilm reactor, the relative abundance varied from 9:1 to 3:7 along the height of the bioreactor⁴⁰⁻ the bioreactor, NH_4^+ at the inlet was consumed by a high population density of *N. europaea*. Due to high NH_4^+ concentrations, N. europaea in the lower regions was very active and likely outcompeted N. winogradskyi for O_2 , since N. europaea possesses a lower half saturation constant (K_m) (1–15 μ M O₂) than N. winogradskyi (22–166 µM O2)43. Gradually, N. winogradskyi abundance increases due to heightened NO₂⁻ availability and lower NH_4^+ levels through NH_3 oxidation by *N. europaea*^{41,42}. In the current study, it is possible that N. europaea outcompeted N. winogradskyi for all O₂ in SMG and NG in a batch configuration, as suggested by Ilgrande et al.⁴. In their clinostat experiment (another type of SMG simulator closely related to RCCS microgravity simulation) of the tripartite culture, no NO₃⁻ accumulation was observed in LSMMG nor NG, suggesting inactivity and inhibition of NO₂⁻ oxidation of *N. winogradskyi* and, consequently, its growth⁴. The negative impact on *N. winogradskyi* growth in a tripartite context in batch culturing was also observed in this study. To our knowledge, no data exists on relative abundance in a tripartite ureolytic and nitrifying culture. In SMG, the relative distribution of N-cycle bacteria does not appear to be affected in the tripartite culture. The final cell density of the tripartite culture was significantly higher in LSMMG compared to NG, however. This suggests that all species increased their proliferation in the LSMMG scenario, possibly through a synergistic promotion of each other's growth.

Whole transcriptome analysis of nitrogen cycle bacteria in simulated microgravity conditions

The transcriptomic landscape of Comamonas testosteroni in SMG. In axenic C. testosteroni exposed to SMG conditions, the effect of RSMG was notably greater than the effect of LSMMG on the transcriptome compared to NG. We identified 1168 differentially expressed genes (DEG) ((p < 0.05) and $-1 \ge \log_2$ fold change $(FC) \ge 1$ or $|FC| \ge 2$) of which 469 were upregulated and 699 were downregulated in RSMG. In contrast, only 71 DEGs in LSMMG were found, of which 20 genes were overexpressed and 51 genes were underexpressed (Supplementary Data 1). An overview of the number of DEGs per cluster of orthologous groups (COGs) is provided in Fig. 3. In the next sections, these DEGs and the implications of their differential expression will be discussed. From here on out, when discussing the 'axenic' strain, we refer to it within a monoculture context. On the other hand, when addressing the strain in the tripartite culture, we discuss that strain within the tripartite community.

'Amino acid transport and metabolism', 'Energy production and conversion', 'Inorganic ion transport and metabolism', and 'Transcription' COGs were most represented in RSMG. In LSMMG, on the other hand, only the 'Amino acid transport and metabolism' and 'Energy production and conversion' were

LSMMG





Fig. 3 Differentially expressed genes per cluster of orthologues genes (COG) category of axenic *C. testosteroni* in simulated microgravity conditions. Number of genes that are differentially regulated in each COG category in axenic *C. testosteroni* grown in low-shear modeled microgravity (LSMMG) and randomized simulated microgravity (RSMG) conditions. COG categories 'Function unknown' and 'General function prediction only' were excluded.

abundantly represented. Respectively 24 and 429 DEGs were annotated to 'Function unknown' in LSMMG and RSMG. No genes were annotated to 'General function prediction only'.

RSMG has a strong effect on the metal ion homeostasis of Comamonas testosteroni. Metal ion homeostasis was among the most affected cellular processes of axenic C. testosteroni in RSMG. An overview of the DEGs involved in these processes can be found in Table 1. Expression of three heavy metal efflux systems of the resistance nodulation division (RND) family was strongly repressed with a FC of -11.47 down to -40.50. Expression of one RND efflux pump was upregulated. Downregulation of heavy metal efflux pumps was previously observed in LSMMG experiments on V. natriegens¹¹ and E. coli^{44,45}. On the other hand, upregulation of some heavy metal transport proteins was observed in Cupriavidus metallidurans in RSMG⁴⁶ and in Burkholderia contaminans and the yeast Candida albicans subjected to LSMMG or spaceflight, respectively^{13,47}. These heavy metal transporters were mostly predicted to have a role in multidrug resistance⁴⁸. Other than differential expression of heavy metal pump genes, increases in antibiotic resistance in some strains was observed after spaceflight or LSMMG exposure^{36,47,49}. In this study, the observed downregulation of these genes in axenic C. testosteroni could suggest a reduction in multidrug resistance after proliferation in RSMG. However, no general consensus behind the mechanisms that result in either heightened or diminished multidrug resistance in SMG or spaceflight conditions has been established.

Upregulation of a range of genes involved in metal ion import was also observed, while iron storage bacterioferritin- and Mg^{2+} import-coding genes were repressed. Fe-S cluster assembly protein-coding gene *cyaY* (JMRS01_700189), which slows down Fe-S assembly⁵⁰, was also downregulated. Upregulation of iron and metal import genes implies iron or metal limitation for the bacteria⁵¹. Hence, it is possible that *C. testosteroni* grown in RSMG experienced iron limitation due to depletion of these resources in the vicinity of the cell. Moreover, through downregulation of *cyaY*, the bacteria seemed to promote Fe-S cluster assembly in RSMG, which is essential in various cellular processes. In LSMMG, on the other hand, only two DEGs involved in metal ion homeostasis were identified. As such, it does not seem that axenic *C. testosteroni* is altering its metal ion homeostasis in this SMG condition.

Comamonas testosteroni experiences enerav limitation in RSMG. The transcriptome of axenic C. testosteroni in RSMG suggests a deprivation of essential nutrients and O₂. For one, 27 out of 33 identified DEGs involved in amino acid biosynthesis were repressed while transcript levels of six were increased (Table 2). Translation machinery was also generally inhibited, with expression of 43 out of 62 DEGs involved in ribosomal biogenesis, tRNA and aminoacyl-tRNA biosynthesis and other translation-related genes being downregulated. A SoxR-coding gene (soxR; JMRS01_360005) was downregulated 6.82-fold. This protein plays an important role in the transcriptional regulation of oxidative stress resistance and mainly regulates the transcription of genes involved in biosynthesis of amino acids, cell wall synthesis, and divalent metal ion transport (Mn²⁺, Zn²⁺, Mg²⁺)^{52,53}. Inhibition of amino acid biosynthesis genes could be a consequence of decreased transcription of soxR. Expression of other genes involved in the oxidative stress response were also affected. The expression of superoxide dismutases (SOD)-(JMRS01_50032, JMRS01_860045) and cytochrome-c peroxidase (ccp; JMRS01_560029) -coding genes, involved in the direct elimination of toxic radicals, was promoted. On the other hand, glutathione biosynthesis-related genes and a range of genes involved in indirect oxidative stress resistance were inhibited. Expression of rpoH (JMRS01_260040) was downregulated with a FC of -2.98. In E. coli, RpoH regulates transcription of several heat shock proteins (HSP) and chaperones such as DnaK, DnaJ, GrpE, GroEL and GroES as well as proteases^{54,55}. Concomitant with literature, expression of genes coding for those proteins decreased as well following rpoH repression in RSMG. In summary, the main direction of expression of stress response genes in axenic C. testosteroni in RSMG was downward, which was also observed in L. reuteri after growth in RSMG¹⁸. Decreasing expression of genes coding for chaperones could be a direct result of an energy deficit and a decrease in protein synthesis and, consequently, protein folding requirements.

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Gene ID	Gene name	Description	Fold change in RSMG	Fold change in LSMN
METAL ION EXPOR	Г			
MRS01_360163	N/A	Efflux transporter, RND family, MFP subunit	-13.64	ND
MRS01_360164	N/A	Heavy metal efflux system protein	-22.78	ND
MRS01_360165	N/A	Outer membrane protein, heavy metal efflux system	-11.47	ND
MRS01_860360	N/A	Heavy metal efflux system protein	-11.55	ND
MRS01_860361	N/A	Membrane fusion protein, heavy metal efflux system	-23.10	ND
MRS01 860362	N/A	RND efflux system, outer membrane lipoprotein, NodT family	-15.03	ND
MRS01 1050029	N/A	Outer membrane protein, heavy metal efflux system	-19.84	ND
MRS01 1050030	N/A	Heavy metal efflux system protein	-23.10	ND
MRS01_1050031	N/A	Membrane fusion protein, heavy metal efflux system	-40.50	ND
WRS01_320074	N/A	Outer membrane heavy metal efflux system	2 07	ND
MRS01_600011	Ν/Δ	Efflux RND transporter periplasmic adapter subunit	2.07	_213
MPS01_600012	N/A	Putativo hosiau motal offlux nump. CzcA family	2.77	-2.15 ND
VIRSU1_000012	N/A	Putative neavy metal emux pump, CZCA family	2.71	
		Putative outer memorane emux protein	5.41	ND
	I			
		Mahdalan waarin kindiga wa 11,2	2.02	ND
VIKS01_10023	mopIII	woiybaenum-pterin binding protein 3	2.93	ND
MRS01_240055	modB	Molybdate transport system permease	2.22	ND
MRS01_260193	modB	Molybdate transport system permease	2.28	ND
lagnesium				
MRS01_360413	corA	Magnesium transport protein	-2.71	ND
MRS01_600152	mgtE	Putative MgtE-domain containing protein	-7.16	ND
MRS01_600153	mgtA	P-type Mg ²⁺ transporter	-14.00	ND
MRS01_600154	mgtC	Mg ²⁺ transporter-C	-7.14	ND
MRS01_1050028	mgtA	P-type Mg ²⁺ transporter	-5.35	ND
inc				
MRS01_10033	gufA	Zinc-iron permease	3.05	ND
on				
MRS01_10040	exbD	Biopolymer transport protein ExbD1	2.20	ND
MRS01_10048	fiu	Catecholate siderophore receptor	-7.21	ND
MRS01_160014	fecA	Iron complex outer membrane receptor protein	3.68	ND
MRS01_160015	fes	Putative Fe ³⁺ -enterobactin esterase	9.06	ND
	fecA	TonB-dependent receptor	-3.12	ND
MRS01 240067	N/A	Iron complex transport system permease protein	3.03	2.23
MRS01_210007	hmuV	Hemin import ATP-binding protein	16.11	ND
MRS01_100023	hmull	Hemin transport system permease	23 59	ND
MRS01_400020	hmuT	Hemin transport system permease	13.27	ND
MR301_400029	hmus	Putative homin transport protein	25.91	
MR501_400050	NI/A	Concerved protein of unknown function	16.69	
MRS01_400031	IN/A	Conserved protein of unknown function	10.08	ND
WIRSU1_400032	nmuk		0.//	ND
WRS01_400036	bir		-2.95	ND
MRS01_430016	fecl	RNA polymerase sigma-/0 factor, ECF subfamily	2.57	ND
MRS01_430017	fecR	Anti-Fecl sigma factor, FecR	2.69	ND
MRS01_430018	fecA	Putative TonB-dependent receptor	1.91	ND
MRS01_510008	fecA	Outer membrane receptor for ferric coprogen	2.17	ND
MRS01_560010	fecA	Fe ³⁺ dicitrate transport protein FecA	-2.28	ND
MRS01_560028	bfr	Bacterioferritin	-2.71	ND
MRS01_600115	fiu	Iron catecholate outer membrane transporter Fiu	8.69	ND
MRS01_600116	ybiX	PKHD-type hydrolase YbiX	8.57	ND
MRS01_600118	fecA	Outer membrane receptor for ferrienterochelin and colicins	5.82	ND
MRS01_600258	N/A	Iron complex transport system substrate-binding protein	12.55	ND
MRS01 600259	fecA	Putative TonB-dependent receptor	11.88	ND

Table 2. Differentially expressed genes involved in amino acidbiosynthesis and degradation of axenic Comamonas testosteroni inrandomized simulated microgravity (RSMG) growth conditions.

GenelD	Gene name	Description	Fold change
AMINO ACID BIC	SYNTHE:	SIS	
Multiple pathwa	ys	Aspartato somialdobudo	21 70
JMRS01_60051	asa	dehydrogenase	-31./8
Alanine, aspartat	e and gl	utamate	
JMRS01_340010	ansB	Putative L-asparaginase type II	-8.33
JMRS01_700160	gltD	Glutamate synthase small chain subunit	2.04
JMRS01_820040	asdA	Aspartate 4-decarboxylase	2.04
Glycine, serine a	nd threo	nine	
JMRS01_510022	itaE	Threonine aldolase	2.53
JMRS01_550028	dapdh	Meso-dieaminopimelate D- dehydrogenase	-2.94
JMRS01_600042	serA	2-hydroxyacid dehydrogenase	-2.94
Cysteine and me	thionine		
JMRS01_360053	metH	Methionine synthase	-2.27
JMRS01_360273	metXS	Homoserine-O-succinyltransferase	2.39
JMRS01_360274	metW	Methionine biosynthesis protein	2.16
JMRS01_360400	mtnN	Adenosylhomocysteine nucleosidase	-2.94
JMRS01_530020	metY	O-acetyl-L-homoserine sulfhydrylase	-2.50
Valine, leucine a	nd isoleu	cine	
JMRS01_60054	leuD	3-isopropylmalate dehydratase small subunit	-2.63
JMRS01_60055	leuC	3-isopropylmalate dehydratase large subunit	-3.22
JMRS01_210055	leuA	2-isopropylmalate synthase	-6.25
JMRS01_260037	ilvD	Putative dihydroxy-acid dehydratase	-2.27
JMRS01_360067	ilvE	Branched-chain amino acid aminotransferase	-2.86
JMRS01_560065	leuD	3-isopropylmalate dehydratase small subunit	-2.33
JMRS01_860066	ilvD	Dihydroxy-acid dehydratase	-2.08
Lysine			
JMRS01_260004	lysA	Diaminopimelate carboxylase	-3.85
JMRS01_380130	lys1	Saccharopine dehydrogenase	-2.78
JMRS01_410012	dapA	Dihydrodipicolinate synthase	-11.11
Arginine and pro	oline		
JMRS01_150051	argA	Amino acid N-acetyltransferase	-3.13
JMRS01_360204	argC	N-acetyl-γ-glutamylphosphate reductase	-6.25
JMRS01_600032	ocd	Ornithine cyclodeaminase	-3.13
JMRS01_600033	rocF	Arginase	-2.78
Histidine			
JMRS01_700069	hutG	N-formylglutamate deformylase	2.38
JMRS01_700136	hisA	1-(5-phosphoribosyl)-5-[(5- phosphoribosylamino) methylideneamino] imidazole-4- carboxamide isomerase	-2.22
JMRS01_700145	hisG	ATP phosphoribosyltransferase	-2.70

ntinued

GenelD	Gene name	Description	Fold change
Phenylalanine, ty	rosine ar	nd tryptophan	
JMRS01_300045	NA	Chorismate mutase	-2.22
JMRS01_360043	trpB	Tryptophan synthase β -chain	-2.63
JMRS01_550016	aroQ	3-dehydroquinate dehydratase	-2.50
JMRS01_590020	aroE	Shikimate dehydrogenase	-3.33
AMINO ACID DE	GRADATI	ON	
Valine, leucine ar	nd isoleu	cine	
JMRS01_190026	scoA	Putative 3-oxoacid CoA transferase subunit A	-2.33
JMRS01_330069	acsA	Acetoacetyl-CoA synthetase	-2.13
JMRS01_380122	mmsA	Methylmalonate-semialdehyde dehydrogenase	-3.13
Histidine			
JMRS01_360012	hutU	Urocanase hydratase	-2.44
Tyrosine			
JMRS01_600104	hpd	4-hydroxyphenylpyruvate dioxygenase	-2.94
JMRS01_810062	nagK	Fumarylpyruvate hydrolase	-4.35
Tryptophan			
JMRS01_860320	kynA	Tryptophan 2,3-dioxygenase	-3.13

Nitrate:nitrite antiporter NarK-coding genes (JMRS01_360321, JMRS01_360322), involved in denitrification⁵⁶, were upregulated with a FC of 4.59 and 11.16. In anoxic or micro-oxic conditions, C. testosteroni has been shown to increase transcription of narK and other denitrification genes⁵⁷. Also, changes in denitrification gene expression were observed in an SMG study on V. natriegens and in P. aeruginosa after exposure to both SMG and spaceflight conditions and were linked to an anaerobic environment^{10,11,58}. Due to limited mass transfer in RSMG, anoxic conditions may have been generated, thereby inducing denitrification for energy production without O₂ as the final electron acceptor. Meanwhile, the presence of NO₃⁻ in the SUSS medium could act as an additional inducer for denitrification gene expression. Moreover, cytochrome bo3 ubiquinol oxidase (cyoABCD; JMRS01_170046-49), usually expressed in O₂rich conditions⁵⁹, was downregulated. In addition, while no aromatic compounds were available in the SUSS medium, genes of the hybrid aerobic degradation of benzoate pathway (box; benzoate oxidation) were underexpressed. This could implicate the activation of a broad transcriptional regulatory response to O₂ limitation in RSMG in axenic C. testosteroni to diminish resource utilization for underused aerobic processes.

A wide array of genes involved in motility and biofilm formation were also differentially regulated in axenic *C. testosteroni* in RSMG. An overview of these genes is provided in Table 3. In the flagellar assembly gene cluster (JMRS01_1070011 – 55), 18 genes were differentially upregulated and expression of six more was significantly increased (p < 0.05). One pilus assembly gene cluster was downregulated, while two others were upregulated. Moreover, genes coding for capsular polysaccharide (CPS) export proteins were upregulated (*lipA*; JMRS01_380113, *lipB*; JMRS01_380114). CPSs play a role in biofilm formation but are also involved in protection against environmental threats and as virulence factors⁶⁰. Finally, transcription of five genes coding for predicted diguanylate cyclases (DGCs) were upregulated while transcription of two was downregulated. Upregulation of flagellar assembly genes suggests increased motility and is also crucial for biofilm formation⁶¹. Pili also

GenelD	Gene name	Description	Fold change in RSMG	Fold change in LSMMG
Flagellar assembly				
JMRS01_50022	flhD	Master regulator, transcriptional activator	1.87	ND
JMRS01_810020	fleN	FleQ anti-activator protein	2.41	-1.57
JMRS01_1070016	fliM	C-ring protein	2.46	ND
JMRS01_1070015	fliN	C-ring protein	3.25	-1.97
JMRS01_1070014	fliO/fliZ	Export gate protein	3.58	-2.06
JMRS01_1070013	fliP	Export gate protein	3.46	-2.25
IMRS01_1070012	fliQ	Export gate protein	4.06	ND
JMRS01_1070011	fliR	Export gate protein	2.62	ND
JMRS01_1070024	N/A	Conserved protein of unknown function	2.03	ND
JMRS01_1070019	fliJ	ATPase complex	2.07	ND
JMRS01_1070017	fliL	Flagellum associated protein	1.91	ND
IMRS01_1070040	flhB	Export gate protein	1.80	ND
JMRS01 1070038	flhF	Polar landmark protein	2.35	ND
MRS01 1070041	flaZ	c-di-GMP phosphodiesterase	2.22	-1.78
IMRS01 1070055	flaM	Negative regulator of flagellin synthesis. FliA anti- σ 28 factor	-1.81	ND
MRS01 1070036	fliA	RNA polymerase σ 28-factor (class III activator)	2.85	-2.27
IMRS01_1070027	cheY	Chemotaxis protein CheY	-1.51	ND
IMRS01_1070029	motA	Motility protein A	1 83	ND
IMRS01_1070028	motR	Motility protein R	2.08	ND
IMRS01_1070020	fliC	Flagellin	2.00	ND
MRS01_1070031	fliD	Flagellar book-associated protein 2	1.64	_1.43
MRS01_1070033	fiic	Flagellar hiosynthesis protein	1.04	-1.45 ND
MR501_1070034	niis Ait	Flagellar biosynthesis protein	1.92	1.42
MR301_1070035	fill	Pring protoin	2.40	- 1.45 ND
MRS01_1070043	ngi flat	F-ing piotein	2.40	
MRS01_1070044	ngj A-K	Flagellar food assembly protein	2.27	1.05
MRS01_1070045	ngr. Al-l	Flagellar hook-associated protein 1	2.40	-1.95
	ligL	Flagellar hook-associated protein 3	2.77	-2.03
vilus formation	52		2.40	ND
MRS01_160001	cpaE2		-2.48	ND
MRS01_160007	N/A	Putative lipoprotein	-3.03	1.61
MRS01_160008	N/A	Putative type II and III secretion system protein	-3.86	ND
MRS01_160009	срав	Pilus assembly protein CpaB	-4.4/	1.85
MRS01_160010	сраА	Prepilin peptidase	-2.73	ND
MRS01_300024	сраВ	Pilus assembly protein CpaB	1.60	-1.61
MRS01_300025	сраС	Pilus assembly protein CpaC	1.93	-2.03
MRS01_300026	сраЕ	Pilus assembly protein CpaE	2.14	-2.21
IMRS01_300027	сраF	Pilus assembly protein CpaF	2.04	-2.10
IMRS01_300028	tadB	Tight adherence protein B	2.50	-1.96
IMRS01_300029	tadC	Tight adherence protein C	2.13	-1.89
IMRS01_460006	pilA	Pilus assembly protein PilA	2.38	ND
JMRS01_460007	сраА	Prepilin peptidase	1.89	-1.99
IMRS01_460008	сраВ	Pilus assembly protein CpaB	1.69	ND
IMRS01_460009	сраС	Pilus assembly protein CpaC	1.38	ND
IMRS01_460010	сраЕ	Pilus assembly protein CpaE	2.20	ND
IMRS01_460011	сраF	Pilus assembly protein CpaF	1.57	ND
MRS01_460012	tadB	Tight adherence protein B	1.87	ND
MRS01_460013	tadC	Tight adherence protein C	1.55	ND
MRS01_700091	pilB	Type IV pilus assembly ATPase PilB	2.11	ND
MRS01_700092	pilC	Type IV pilus assembly protein PilC	1.85	ND
JMRS01 700093	pilD	Prepilin peptidase	2.55	ND

play a role in (non-flagellar) motility and in surface adhesion for biofilm formation⁶². Meanwhile, DGCs catalyze the formation of second messenger cyclic di-GMP (c-di-GMP) molecules, which, in high intracellular concentrations, repress motility and promote biofilm formation^{63–66}. Finally, increased *narK* expression suggests NO₃⁻ respiration, which enhances biofilm stability of *C. testosteroni* and increases DGC expression⁵⁷. In addition, increased biofilm formation was described for the bacteria *Bacillus subtilis*⁶⁷, *E. coli*²⁹, *P. aeruginosa*^{68,69} and *S. maltophilia*²⁷ and the yeast *C. albicans*⁴⁷ during SMG and spaceflight. In concert with the findings in those studies, the gene expression profile of axenic *C. testosteroni* in RSMG also suggests a biofilm lifestyle.

We also found indications of carbon limitation in the transcriptome of axenic C. testosteroni in RSMG. Several DEGs involved in the reversible initial gluconeogenesis or final steps of glycolysis were identified in RSMG. Downregulation of phosphoenolpyruvate (PEP) carboxykinase-coding (PEPCK) gene pckG (JMRS01_360114), responsible for the reversible rate-limiting step in the production of glucose precursors from oxaloacetate, and of acetyl-CoA synthetase gene acsA (JMRS01_330069) was observed. In combination with the decreased transcription of endpoint glycolysis genes, this indicates a reduced capacity for acetyl-CoA formation from carbon sources such as acetate and pyruvate for utilization in the TCA cycle. In this cycle, isocitrate lyase (aceA; JMRS01_10058) gene expression increased more than 4-fold and is an important step in the glyoxylate shunt (GS). Promotion of the GS has been observed in iron limitation⁷⁰ and other stress conditions but also during carbon limitation⁷¹. Most importantly, the GS circumvents the two decarboxylation steps of the TCA and enables the use of 2-carbon compounds like acetate⁷². Moreover, diminished expression of specific TCA cycle genes (sucA; JMRS01_170029, fumA; JMRS01_320102, and sdhCDA; JMRS01_560039 - 41) prevents the production of the proteins responsible for the TCA cycle steps that are skipped by the GS. In the SUSS medium, acetate is the sole organic carbon source. Through the upregulation of the GS in RSMG and the downregulation of enzymes that required for underused TCA steps, C. testosteroni might have allocated more resources to the efficient utilization of acetate by the GS for biosynthesis of carbohydrate precursors. This could serve as a potential rescue pathway during periods of starvation due to limited mass transfer of acetate in RSMG.

Overall, the gene expression profile of axenic *C. testosteroni* in RSMG reflected nutrient- and oxygen-limiting conditions, which was also observed in other bacteria grown in SMG^{10,11,13,44,73}. These observations included increased motility and biofilm formation, a shift in the carbon utilization metabolism, and a transition to an anaerobic lifestyle. It is clear that RSMG elicits a strong transcriptional response to nutrient depletion in *C. testosteroni*.

In contrast, no DEGs could be linked to energy conservation or nutritional deprivation in LSMMG in axenic C. testosteroni. DEGs involved in flagellar machinery were downregulated (Table 3). However, one narK gene (JMRS01_360321) was downregulated along with lowered transcription (FC = -2.90-4.66) of nitrate reductase-coding genes narGHJI to (JMRS01_360323-326). As opposed to RSMG growth, C. testosteroni diminishes its NO3⁻ reduction capacities in LSMMG, thereby seemingly favoring an aerobic lifestyle. The combination of the higher final cell density and these observations counterintuitively seem to indicate a higher O₂ availability and thus better mixing compared to NG. In Crabbe et al. dissolved oxygen (DO) in the medium was measured and no differences were observed between NG and LSMMG. However, a slightly decreased oxygen transfer rate was revealed in LSMMG, hampering *P. aeruginosa's* ability to collect O_2^{10} . Axenic *C.* testosteroni might require less DO than P. aeruginosa to take up O2. Consequently, C. testosteroni could have enough O2 available in LSMMG, eliminating the necessity of resorting to anoxic processes to harvest energy.

RMSG and LSMMG transcriptomic responses are complementary for tripartite Comamonas testosteroni. C. testosteroni in a tripartite culture had 273 DEGs in RSMG conditions and 257 DEGs in LSMMG conditions (Fig. 4) (Supplementary Data 1). No DEGs in common were found across both SMG conditions in axenic and tripartite C. testosteroni. In RSMG, axenic and tripartite C. testosteroni shared 16 upregulated and 48 downregulated genes. In LSMMG, no common genes were found. In both tripartite culture SMG conditions, 37 and 22 common DEGs were respectively overexpressed or inhibited.

In tripartite *C. testosteroni*, upregulation of *narHJI* in RSMG and *narJ* and *narK* in LSMMG indicated increased denitrification capacities. This is in contrast to the downregulation of the genes of axenic *C. testosteroni* in LSMMG. The heightened expression of denitrification genes could be a direct effect of O_2 competition with the nitrifiers in combination with SMG condition and the presence of NO_3^- in the SUSS medium⁴. Expression of the *box*-pathway genes was also decreased in addition to an array of genes with roles in cell division, translation, purine and pyrimidine biosynthesis, and amino acid biosynthesis and degradation. These observations point at anoxic conditions and energy conservation^{10,11,58}. Thereby, O_2 transfer rates could be reduced to a level where *C. testosteroni* is also unable to gather enough O_2 in this condition as opposed to its axenic LSMMG counterpart.

Expression of flagellar assembly master transcriptional regulator system *flhCD* was promoted up to 6.6-fold in LSMMG, as were several chemotaxis and aerotaxis receptor genes. Thus, a large part of the flagellar assembly gene cluster was promoted in LSMMG. On the other hand, only two genes were differentially expressed in RSMG, which highly contrasts with the axenic culture in RSMG. In both cases, DGC-coding genes were generally upregulated. In combination with heightened denitrification gene expression, it is plausible that SMG promotes biofilm formation in tripartite *C. testosteroni*⁵⁷.

The metal ion homeostasis in tripartite *C. testosteroni* in RSMG and LSMMG was not altered to such a degree as in axenic *C. testosteroni* in RSMG. However, in contrast to axenic *C. testosteroni* in LSMMG, metal ion homeostasis of tripartite *C. testosteroni* was affected. Ferric siderophore uptake, Mn^{2+} export and arsenate efflux gene expression were increased in both conditions. As mentioned, increased expression of iron uptake genes implies iron limitation⁵¹, but in the tripartite culture, a lower response was noted in comparison to axenic *C. testosteroni* in RSMG.

The *rpoH* gene and the genes under its control, including several HSP-coding genes, *htpX*, and *htpG* were also down-regulated in a tripartite setting in both scenarios. Gene expression of proteases that degrade damaged, truncated or misfolded proteins such as ClpP, HsIV and MsrP and of proteins that confer oxidative stress resistance was also suppressed, similarly to axenic *C. testosteroni* in RSMG.

Differential gene expression of Nitrosomonas europaea in SMG. For the studied aerobic ammonia oxidizer, we identified a total of 52 and 22 DEGs in the RSMG and LSMMG conditions, respectively, compared to NG (Supplementary Data 2). In the RSMG condition, transcript levels of 30 genes were increased while 22 genes were decreased. The transcriptomic response of *N. europaea* to SMG conditions was limited and only a handful of COGs were influenced (Fig. 5). In both cases, the 'Replication, recombination and repair' cluster was most affected. Respectively, three and 23 DEGs in RSMG and LSMMG were annotated 'Function unknown'. 'General function prediction only' was the annotation of 5 DEGS is RSMG and 3 DEGs in LSMMG.

Most notably, members of the mercury import (*mer*) operon (NE0838–NE0842) were downregulated in both conditions. Transcription of all the operon's genes was decreased in RSMG while in LSMMG, two genes (*merC/merP*; NE0840/41) were differentially downregulated and two more (*merA, merT*; NE0839,



Fig. 4 Overview of the extend of overlap in gene expression changes of axenic *Comamonas testosteroni* and in the tripartite community in simulated microgravity growth conditions. L-Trip and R-Trip refer to *C. testosteroni* in the tripartite community in low-shear modeled microgravity (LSMMG) and in randomized simulated microgravity (RSMG), respectively. R-Ax and L-Ax refer to axenically grown *C. testosteroni* in respectively RSMG and LSMMG. **a** represents all differentially expressed genes (DEGs). **b**, **c** represent the overlap of up- and downregulated genes between axenic and tripartite *C. testosteroni*, respectively.

NE842) were close to the threshold of differential expression (FC < -1.97, p < 0.05). These proteins are responsible for mercury ion uptake and detoxification into the cytoplasm. Moreover, they were previously related to Cd²⁺ transport and are hypothesized to function as broad-range heavy metal transporters^{74–76}. *SmbP* (NE2461), coding for a small metal-binding protein that removes toxic metal ions from the cell⁷⁷, was also inhibited in RSMG. Reduction of heavy metal transport gene expression was observed in previous SMG experiments^{11,44–47}, as mentioned, and in axenic and tripartite *C. testosteroni* in the current study. However, in contrast to RND transport systems, there is no proof of a functional role for the *mer*-operon in multidrug resistance. Its role is hence unclear and should be further explored before drawing any conclusions regarding its differential regulation in SMG.

In both SMG conditions, RuBisCO activase-coding genes *cbbO* and *cbbQ* (NE1918/19) were significantly downregulated. One

subunit of the RuBisCO protein, CbbS (cbbS; NE1920) was also inhibited in LSMMG. Moreover, in RSMG, NH₄⁺ oxidation seemed to be slightly affected, as reflected in the downregulation of amoB2 (NE0943) and amoA2 (NE2063). In LSMMG, no differential regulation of NH₄⁺ oxidation genes was observed. *N. europaea* inhibits expression of all of the above genes in conditions of NH_4^+ and HCO₃⁻ deprivation⁷⁸, but increases expression of RuBisCO during carbon limitation only⁷⁹. In the absence of NH_4^+ , energy limitations are imposed on RuBisCO activity due to lack of NH4 oxidation activity⁷⁹. Moreover, RuBisCO expression has also been shown to decrease in O2-limiting conditions⁸⁰. Hence, the inhibition of RuBisCO and ammonium monooxygenase gene expression could reflect a general nutrient deprivation profile for N. europaea in RSMG. In LSMMG, the effect is less pronounced but nonetheless present. Both SMG conditions could hence generate nutrient-depleted zones in axenic N. europaea cultures.



Fig. 5 Differentially expressed genes per cluster of orthologues genes (COG) category of axenic *Nitrosomonas europaea* in simulated microgravity. Number of genes that are differentially regulated in each COG category in axenic *N. europaea* grown in low-shear modeled microgravity (LSMMG) and in randomized simulated microgravity (RSMG) conditions. COG categories 'Function unknown' and 'General function prediction only' were excluded.

SMG has a small effect on the nitrification machinery of tripartite Nitrosomonas europaea. In the tripartite community, respectively, 13 and 14 DEGs were identified in RSMG and LSMMG in the transcriptome of *N. europaea* (Supplementary Data 2). An overview of DEGs in common in the different SMG conditions of *N. europaea* grown axenically and in the tripartite community is provided in Fig. 6. No common DEG was identified across all four conditions.

Four genes were downregulated in both SMG conditions in the tripartite culture, while no common upregulated genes were found. Three of those DEGs are part of a significantly inhibited operon NE1538–NE1543 (p < 0.05). They code for two hypothetical proteins (NE1538, NE01539) and a TonB-dependent receptor protein (NE1540). Two of the remaining genes in the operon also code for hypothetical proteins (NE1541, NE1542) while NE1543 codes for a type I multicopper oxidase. Given that TonBdependent receptor proteins and multicopper oxidases both have been implicated in iron acquisition, it is possible that this operon is involved in the tightly regulated iron homeostasis of N. europaea⁸¹. Additionally, in RSMG, expression of two putative fecl iron uptake σ-factors (NE1101, NE1207) was also inhibited. While not all iron-uptake related DEGs are identical in both conditions, together they indicate a reduced need for iron in SMG. This was also observed in E. coli in LSMMG and was suggested to prevent sulfur and cysteine consumption for Fe-S cluster assembly in starvation conditions⁴⁴

NcgABC (NE0925-7) expression was significantly decreased in RSMG (p < 0.05), but only *ncgA* displayed a FC lower than -2.00. These genes are clustered with nitrite reductase *nirK* (NE0924), required for efficient NH₄⁺ oxidation and NO₂⁻ resistance^{82,83}. The genes are putatively involved in conferring NO₂⁻ resistance by scavenging toxic NO molecules generated by NirK activity⁸³. Significant inhibition of *ncgABC* expression suggests a decreased capacity to process NO₂⁻ during NH₄⁺ oxidation. In contrast to NO₂⁻ accumulation in axenic *N. europaea* cultures, a part of the NO₂⁻ might have been consumed by *N. winogradskyi* in the tripartite community. Consequently, NO₂⁻ toxicity may have been decreased and *N. europaea* can dedicate less resources to NO₂⁻ tolerance. In RSMG, this effect might be enhanced

compared to NG, leading to a greater reduction of *ncgABC* expression. In turn, this suggests more efficient NO_2^- consumption by *N. winogradskyi* in the tripartite community in RSMG as opposed to NG.

The *ncqABC-nirK* cluster was not differentially regulated in LSMMG compared to NG, indicating similar NO₂⁻ consumption in these configurations. Also, amoB2 (NE0943) expression was slightly increased (FC = 1.26). As opposed to axenically grown *N. europaea* in SMG, NH_4^+ availability seemed to be higher in LSMMG because of higher amoB2 expression, increasing oxidation capacities compared to NG. However, the transcriptional differences to NG are very limited. A previous study already determined that N-species consumption and production were similar in LSMMG and NG in a tripartite community⁴, implicating that the gene expression profile observed here might not translate to a phenotypical level. However, to validate this, an N-species balance with the experimental setup used here should be conducted. In general, tripartite N. europaea was fairly unaffected by SMG conditions. This might be possible due to the vicinity and movement of C. *testosteroni*, thereby providing NH_4^+ for growth more efficiently than through diffusion only as would be the case in axenic N. europaea.

Nitrobacter winogradskyi's altered gene expression in SMG. For the studied aerobic nitrite oxidizer, we identified 605 DEGs in RSMG and 40 DEGs in LSMMG compared to the NG control. In RSMG, 309 DEGs were upregulated and 296 were downregulated while in LSMMG, two DEGs were upregulated and 38 were downregulated (Supplementary Data 3). A COG analysis (Fig. 7) showed no upregulated genes annotated to a COG in LSMMG. In both cases, the 'Translation, ribosomal structure and biogenesis' COG was most represented. In RSMG, several other COGs stood out, including 'Amino acid transport and metabolism', 'Cell wall/ membrane/envelope biogenesis', 'Energy production and conversion' and 'Posttranslational modification, protein, turnover, chaperones'. Respectively 28 and 235 DEGs in RSMG and 16 and one DEGs in LSMMG were annotated to 'Function unknown' or 'General function prediction only'.



Fig. 6 Overview of the extend of overlap in gene expression changes of axenic *N. europaea* and in the tripartite community in simulated microgravity growth conditions. L-Trip and R-Trip refer to *N. europaea* in the tripartite community in low-shear modeled microgravity (LSMMG) and randomized simulated microgravity (RSMG), respectively. R-Ax and L-Ax refer to axenically grown *N. europaea* in respectively RSMG and LSMMG. **a** represents all differentially expressed genes (DEGs). **b**, **c** represent the overlap of up- and downregulated genes between axenic and tripartite *N. europaea*, respectively.

Cell growth & proliferation of axenic Nitrobacter winogradskyi is hampered in SMG. In axenic *N. winogradskyi*, we observed a significant reduction in the transcript levels of various genes involved in DNA replication, transcriptional machinery, translation, and the cell cycle in RSMG (Table 4). The overall downregulation of transcription of these genes suggests a strong repression of proliferation-related processes in RSMG. In LSMMG, only genes involved in translation were downregulated. The decreased expression of cell growth and proliferation, and protein synthesis genes could indicate a preservation of energy. *N. winogradskyi* did display increased viability compared to the NG. In a previous study on *S. mutans*, translation-related gene expression was also downregulation without any observable changes in viability³⁹. Therefore, reduced expression of proliferation-related genes does not necessarily impact viability. However, in the case of *N.*

winogradskyi, increased viability could potentially be linked to a decelerated metabolism to limit their resource usage, resulting in reduced cellular turnover. In addition, RuBisCO- and а carboxysome-related genes (Nwi_1975/76, Nwi_1980-1987) were strongly downregulated with FCs ranging from -4.99 to -34.78 in RSMG and from -2.15 to -4.47 in LSMMG. Gene expression of master regulator cbbR1 (Nwi_1988) was also decreased in both conditions. Meanwhile, in RSMG only, master regulator cbbR2 (Nwi 2930) was upregulated. Overexpression of cbbR2 in RSMG could favor transcription of the second, standalone RuBisCO copy (cbbS2/L2; Nwi_2928/29) in the N. winogradskyi genome. This RuBisCO copy is not associated with a carboxysome structure⁸⁴ and was not differentially expressed in both conditions. However, to maintain carbon fixation in the energy conserving condition to which N. winogradskyi seems to transition in SMG, this RuBisCO



Fig. 7 Differentially expressed genes per cluster of orthologues genes (COG) category of axenic Nitrobacter winogradskyi in simulated microgravity. Number of genes that are differentially regulated in each COG category in *N. winogradskyi* grown in low-shear modeled microgravity (LSMMG) and randomized simulated microgravity (RSMG) conditions. COG categories 'Function unknown' and 'General function prediction only' were excluded.

copy could be adequate to capture the necessary amount of CO_2 without association with a carboxysome for cell maintenance and survival. This could be a consequence of low O_2 availability in SMG, reducing competition for RuBisCO binding and allowing more efficient CO_2 fixation⁸⁰.

Several genes in the central carbon metabolism were also upregulated in RSMG. PEPCK (*pckA*; Nwi_0350), acetyl-CoA synthetase (*acsA*, Nwi_0467), and succinate dehydrogenase (*sdhCD*; Nwi_2789/9) expression was increased. Acetate stemming from fatty acid (FA) β -oxidation is activated by AcsA, increasing carbon availability to enter the TCA cycle. Meanwhile, FA catabolism produces additional energy during energy-limiting conditions. The upregulation of PEPCK may be needed to enhance oxaloacetate production from PEP, additionally increasing flux towards oxaloacetate. This transcriptomic profile of axenic *N. winogradskyi* in RMSG is indicative of anaplerosis to reinforce acetate-CoA consumption. Hence, *N. winogradskyi* may be using carbon from FA degradation to maintain its central metabolism in the TCA cycle during starvation conditions.

Expression of a nitrite oxidoreductase (NXR) subunit β gene (nxrB; Nwi_0965) was increased 7.11-fold in RSMG, which is implicated in NO₂⁻ oxidation but also NO₃⁻ reduction. Given that the transcriptomic profile of axenic N. winogradskyi in RSMG is indicative of nutrient limitation, there are two possibilities for the upregulation of NXR. For one, NO_2^- might be present in limiting quantities, resulting in increased transcription of NXR for energy production. On the other hand, O₂ could be a limiting factor, as suggested by the expression pattern of RuBisCO. In this case, NXR upregulation would indicate an anoxic environment⁸⁵ and is necessary to increase denitrification activities of N. winogradskyi. Furthermore, the presence of NO_3^- in the SUSS medium could also be an additional trigger for nxr upregulation in this case. In future work, it is thus highly recommended to assess the evolution of N-species in the medium, which could bolster the validity of one of the hypotheses.

For both SMG conditions, the transcriptomic profile is indicative of a conservation of energy and a limitation of translation- and transcription-related processes. In RSMG, this behavior is more accentuated than in LSMMG. Axenic Nitrobacter winogradskyi increases oxidative stress resistance in RSMG. As opposed to C. testosteroni in SMG, expression of rpoH (Nwi_2430) was increased 2.20 fold. As a possible result, RpoH increased gene expression of stress response chaperone systems DnaK, DnaJ, GroEL/GroES, proteases Lon, and FtsH (Nwi 2710). Gene transcripts of several HSPs were also present in elevated quantities. Furthermore, ROS detoxification enzymes catalase KatG (Nwi_0030), thioredoxin TrxA (Nwi_0051), alkylhydroperoxidase AhpD (Nwi_1458) and glutathione S-transferase (Nwi_2981) gene expression was increased in RSMG, while other oxidative stress response protein-coding genes were downregulated. Genes with a role in DNA repair, stabilization and protection were upregulated. All of the aforementioned genes are related to stress responses, mainly in response to increased ROS levels. Hence, we hypothesize that N. winogradskyi is increasing its resistance to oxidative stress during growth in RSMG. No stress response genes were differentially regulated in LSMMG.

The transcriptomic profile of tripartite Nitrobacter winogradskyi is indicative of an anoxic environment. Respectively 150 and 54 DEGs were identified in tripartite *N. winogradskyi* in RSMG and LSMMG (Fig. 8) (Supplementary Data 3). The bacteria in the synthetic community had 17 distinct DEGs in common with the axenic *N. winogradskyi* in RSMG and none in common in LSMMG. No DEG was exclusively up- or -downregulated across all conditions.

Expression of four HSP-20 coding genes and *groL1*, *groES* in RSMG, and one HSP-20 coding gene and *groL2* LSMMG were repressed, indicating a reduced capacity for protein folding, assembly, transport and degradation in both SMG conditions compared to NG. In RSMG, upregulation of a Trx-like protein (Nwi_0716), DegP-like endoprotease (Nwi_1195) and Fe-S repair gene cluster (*sufBCDS*; Nwi_1661-64) indicated a requirement to repair or degrade damaged proteins. Meanwhile, two genes (Nwi_2605, Nwi_1513) involved in DNA base excision repair were downregulated.

The transcriptomic profile of tripartite *N. winogradskyi* in RSMG also shows several signs of nutritional stress. For one, expression of ATP synthase subunit α (*atpA*; Nwi_0430), *cbbL1*, and *cbbR1* was

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Table 4.	Proliferation-related differentially expressed	genes in	axenic
Nitrobact	er winogradskyi in simulated microgravity.		

Gene ID	Gene name	Description	Fold change in RSMG	Fold change in
				LSMMG
Replication	۱			
Nwi_0001	dnaA	Chromosomal replication initiation protein	-2.96	ND
Nwi_0002	dnaN	Polymerase III subunit β	-2.08	ND
Nwi_0105	dnaQ	Polymerase III subunit ϵ	-2.27	ND
Nwi_1062	ligA	DNA ligase	-2.09	ND
Nwi_2603	ccrM	Cell cycle-regulated DNA methyltransferase	-3.15	ND
Transcripti	on			
Nwi_1351	rpoC	DNA-directed RNA- polymerase subunit β'	-2.64	ND
Translatior	า			
Nwi_0065	pheT	Phenylalanine-tRNA ligase subunit β	-2.91	ND
Nwi_0066	pheS	Phenylalanine-tRNA ligase subunit α	-2.69	ND
Nwi_0446	rsfS	Ribosomal silencing factor	2.20	ND
Nwi_1346	rplK	50 S ribosomal protein L11	-2.33	ND
Nwi_1348	rpIJ	50 S ribosomal protein L1	-2.27	ND
Nwi_1359	rpsL	30 S ribosomal protein S12	-3.16	ND
Nwi_1360	rpsG	30 S ribosomal protein S7	-5.39	ND
Nwi_1361	fusA	Elongation factor G	-5.11	ND
Nwi_1362	tuf	Elongation factor Tu	-5.34	ND
Nwi_1363	rpsJ	30 S ribosomal protein S10	-8.71	-1.99
Nwi_1364	rpIC	50 S ribosomal protein L3	-4.85	ND
Nwi_1365	rpID	50 S ribosomal protein L4	-5.55	-2.13
Nwi_1366	rpIW	50 S ribosomal protein L23	-8.96	-2.23
Nwi_1367	rplB	50 S ribosomal protein L2	-5.08	ND
Nwi_1368	rpsS	30 S ribosomal protein S19	-6.71	-3.09
Nwi_1369	rplV	50 S ribosomal protein L22	-9.41	-2.23
Nwi_1370	rpsC	30 S ribosomal protein S3	-6.20	ND
Nwi_1371	rpIP	50 S ribosomal protein L16	-7.22	ND
Nwi_1372	rpmC	50 S ribosomal protein L29	-6.55	-3.01
Nwi_1373	rpsQ	30 S ribosomal protein S17	-5.80	-3.45
Nwi_1374	rplN	50 S ribosomal protein L14	-8.13	-3.27
Nwi_1375	rplX	50 S ribosomal protein L24	-10.18	-3.53
Nwi_1376	rplE	50 S ribosomal protein L5	-6.87	-2.87
Nwi_1377	rpsN	30 S ribosomal protein S14	-5.02	ND
Nwi_1378	rpsH	30 S ribosomal protein S8	-6.43	-2.67
Nwi_1379	rplF	50 S ribosomal protein L6	-4.65	ND
Nwi_1380	rplR	50 S ribosomal protein L18	-4.05	-2.48
Nwi_1381	rpsE	30 S ribosomal protein S5	-6.29	-2.30
Nwi_1382	rpmD	50 S ribosomal protein L30	-5.23	-3.09
Nwi_1383	rplO	50 S ribosomal protein L15	-4.78	-2.20
Nwi_1384	secY	preprotein translocase subunit SecY	-3.79	-2.05
Nwi_1588	aspS	Aspartate-tRNA ligase	-2.17	ND
Nwi_1776	serS	Seryl-tRNA synthetase	-2.07	ND
Nwi_1858	tsf	Elongation factor Ts	-2.93	ND
Nwi_1859	rpsB	30 S ribosomal protein S2	-2.72	ND
Nwi_1918	rnc	Ribonuclease 3	-2.35	ND

Gene ID	Gene name	Description	Fold change in RSMG	Fold change in LSMMG
Nwi_2586 Cell cycle	glyS	Glycyl-tRNA synthetase	-4.40	ND
Nwi_1047	murF	UDP-N-acetylmuramoyl- tripeptideD-alanyl-D- alanine ligase	-2.37	ND
Nwi_1051	murG	UDP-N-acetylglucosamine N-acetylmuramyl- (pentapeptide) pyrophosphoryl- undecaprenol N- acetylglucosamine transferase	-2.87	ND
Nwi_1056	ftsQ	Cell division protein FtsQ	-2.79	ND
Nwi_1057	ftsA	Cell division protein FtsA	-2.42	ND
Nwi_1803	scpB	Condensin subunit ScpB	-2.17	ND
Nwi_1804	scpA	Condensin subunit ScpA	-2.36	ND
Nwi_2717	tolB	Tol-Pal system protein TolB	-2.39	ND

inhibited, possibly due to energy conservation and carbon shortages. The differential expression of some other genes also suggests anoxic conditions. Peptidase T-coding gene (pepT; Nwi_1893) was overexpressed and is usually induced in an anaerobic growth setting with the goal of catabolizing amino acids to meet the energy demands of the cell⁸⁶. Also, NO_3^{-} import was increased in both SMG conditions through the upregulation of nark (Nwi 0779) to putatively increase denitrification capabilities. Expression of sdhCD was also increased, which, like in axenic N. winogradskyi, could be an indicator of a metabolic flux towards oxaloacetate and anaplerosis during starvation. No differentially expressed NXR genes were discovered. Finally, DEGs involved in amino acid biosynthesis were predominantly downregulated and glycine degradation was inhibited. Interestingly, integration host factor (IHF) subunit β (*ihfB*; Nwi_0058) was upregulated in both conditions. IHF regulates the expression of genes required for the physiological transition from the exponential to the stationary growth phase⁸⁷, which usually occurs when nutrients are depleted. Like its axenic counterpart, tripartite N. winogradskyi also shows signs of survival in a nutrient-depleted environment in SMG.

Implications and outlook. Across all bacterial strains and culture configurations, only the axenic C. testosteroni strain in LSMMG did not express a starvation-related response in its gene expression profile. On the contrary, it seemed to experience a more aerobic lifestyle compared to NG. However, the gene expression differences were very limited compared to NG with only 71 DEGs identified. In all other bacteria, the gene expression profiles suggest that O₂, carbon, nutrients and electron donors such as acetate, NH_4^+ and NO_2^- , depending on the bacterial strain, were constraining factors. Especially O₂ availability is limiting, as suggested by the upregulation of the denitrification machinery across the strains (possibly also linked to the presence of NO_3^- in the SUSS medium). The variations in the number of DEGs suggest differences in responses depending on the SMG condition and the presence of other bacterial strains in the culture. These aspects affect how the N-cycle bacteria adapt their gene expression. Nonetheless, the similar functionalities in the gene expression patterns imply that the fluid dynamics in SMG negatively



Fig. 8 Overview of the extend of overlap in gene expression changes of axenic Nitrobacter winogradskyi and in the tripartite community in simulated microgravity growth conditions. L-Trip and R-Trip refer to *N. winogradskyi* in the tripartite community in low-shear modeled microgravity (LSMMG) and in randomized simulated microgravity (RSMG), respectively. R-Ax and L-Ax refer to axenically grown *N. winogradskyi* in respectively RSMG and LSMMG. **a** represents all differentially expressed genes (DEGs). **b**, **c** represent the overlap of up- and downregulated genes between axenic and tripartite *N. winogradskyi*, respectively.

influences the mass transfer of nutrients and diffusion of ${\rm O}_2$ in liquid medium.

In the scope of nitrogen recovery in space, one could infer that nitrification efficiency will be affected in a microgravity environment. Increased denitrification-related gene expression, as was observed on multiple occasions, could have an impact on the nitrification efficiency and the recovery percentages. This hypothesis may be confirmed in future work by assessing phenotypical characteristics of the bacteria and an N-species balance. In the context of RLSS design, denitrification should be avoided in a system like MELiSSA to prevent nitrogen losses. In alternative LSS scenarios, biological nitrogen fixation could be envisaged for food production, or nitrogen gas can be valorized as inert gas compensating for leaks in the artificial cabin or habitat atmosphere. Nonetheless, in the conventional route with nitrate-based fertilizer production, the space microgravity environment could pose a major challenge for efficient nitrogen recovery from waste streams.

A spaceflight experiment called 'Urine Nitrification in Space' (URINIS) will be performed to assess the effects of the real spaceflight environment on nitrification and will prove valuable in assessing the complete impact of spaceflight (microgravity, ionizing radiation, etc.) on N-cycle bacteria. However, if the nutritional-deprivation-induced transcriptomic responses observed in this work are also observed during the spaceflight, optimization of mixing within the nitrifying bioreactor should be carefully considered. By providing a homogenously mixed environment, the impact of minimized fluid dynamics and associated diffusional limitations in microgravity may be mitigated.

Transcriptomic responses of N-cycle bacteria highlighted that the strains are subjected to limited mass transfer due to strongly 16

reduced fluid dynamics in SMG. Almost all strains experienced some form of nutrient and O_2 depletion. In this context, RSMG almost exclusively elicited a stronger response than LSMMG compared to NG. Despite apparent nutritional deprivation in the gene expression profile in response to SMG, urea hydrolysis and nitrification genes were almost never affected. Only in *N. europaea* in the tripartite culture and axenic *N. winogradskyi*, a limited effect was noticed on these genes. Conversely, denitrification gene expression was upregulated in *C. testosteroni* and *N. winogradskyi*. In the former, biofilm formation was also promoted. From these results, it is possible that the impact on nitrification efficiency could be substantial in microgravity. Conclusive insights into the impact of spaceflights on nitrification in MELISSA require spaceflight experiments conducted in batch and bioreactor configurations.

METHODS

Bacterial cultivation

Bacterial strains were grown in synthetic urine salt solution (SUSS) medium based on the medium described in Ilgrande et al.⁴ which was composed of 0.15 g L^{-1} NaNO₃, 1.564 g L^{-1} KH₂PO₄, 0.49 g L^{-1} MgSO₄ • 7H₂O, 0.04 g L^{-1} CaCl₂ • 2H₂O, 0.0014 g L^{-1} FeSO₄ • 7H₂O, 5.2 g L^{-1} NaCl, 2 g L^{-1} K₂HPO₄, 2.5 g L^{-1} KHCO₃, 3.2 g L^{-1} Na₂SO₄ • 10H₂O, 37.85 g L⁻¹ EPPS. 0.5 g L^{-1} Na-acetate and 1.07 g L^{-1} urea were added to SUSS medium for *C. testosteroni* I2 and brought to a pH of 7. The same is true for the tripartite culture, but pH was brought to 7.8. For *N. europaea* ATCC 19718, 2.36 g L^{-1} (NH₄)₂SO₄ was added to the SUSS medium and pH was adjusted to 7.8, whereas 2.46 g L^{-1} NaNO₂ was added for *N. winogradskyi* Nb-255 and pH was adjusted to 7.5.

C. testosteroni was grown in Lennox L Broth Base (LB) (ThermoFisher Scientific) at 30 °C in the dark on an orbital shaker at 120 rpm in ventilated cell culture flasks. After 2 days of growth, the culture was transferred 5% (v/v) to fresh SUSS medium and grown for 3 days in ventilated cell culture flasks. The culture was transferred 5% (v/v) to 95 mL of fresh SUSS medium in a PL-70 cell culture bag and grown in SMG conditions for 3 days. Axenic strains of *N. europaea* and *N. winogradskyi* were grown in SUSS medium in ventilated cell culture flasks at 30°C in the dark on an orbital shaker set at 120 rpm for 5 days.

Simulation of microgravity

The RPM and RCCS were used to grow the bacterial strains in SMG conditions. *C. testosteroni* and the tripartite culture were cultured in PermaLifeTM PL-70 cell culture bags (Origen Biomedical). *N. europaea* and *N. winogradskyi* were grown in Synthecon RCCS bioreactors (Synthecon, Inc.). The bacterial cultures in their respective containers were mounted to the RPM (RSMG), to the RCCS rotator with its axis perpendicular to the gravity vector (LSMMG) or to the RCCS rotator with the axis parallel to the gravity vector (NG). For the PL-70 cell culture bags, custom in-house designed 3D holders were used to mount to bags to the respective microgravity simulators. The RCCS rotator was rotated at 25 rpm. The RPM was operated as a random walk three-dimensional clinostat as described in Mastroleo et al.¹⁶.

C. testosteroni was transferred 5% (v/v) to 90 mL of fresh SUSS medium in a PL-70 cell culture bag. *N. europaea* and *N. winogradskyi* were inoculated 10% (v/v) in 50 mL RCCS bioreactors. The tripartite culture was assembled with the separate axenic cultures of *C. testosteroni*, *N. europaea* and *N. winogradskyi*. 1/3rd of every strain was combined in a 10% (v/v) transfer to 90 mL fresh SUSS medium and added to a PL-70 cell culture bag. All cultures were grown in SMG conditions for respectively 3, 5, 5 and 20 days in the dark at 30 °C.

Assessment of fluid-mixing in PL-70 cell culture bags in RSMG, LSMMG and NG

PL-70 cell culture bags were filled with 100 mL of distilled water and air bubbles were meticulously removed. The bags were mounted to the RCCS and RPM devices and rotated for 5 min before injection with 600 μ L of a 0.03% crystal violet solution with a 1 mL syringe. The dispersion of the dye was monitored with pictures using a smartphone camera.

OD₆₀₀ measurements

The optical density, to measure bacterial growth, was determined on 500 µL aliquots with a NanoColor UV/Vis II spectrophotometer (Machery-Nagel) at wavelength $\lambda = 600$ nm (OD₆₀₀).

LIVE/DEAD analysis

LIVE/DEAD analysis was performed using flow cytometry. The samples were diluted and stained with nucleic acid stains. A combination of SYBR Green I (SG) combined with propidium iodide (PI) (SGPI, 100x concentrate SG, Invitrogen, and 50×20 mM PI, Invitrogen, in 0.22 µm-filtered dimethyl sulfoxide) was used for the analysis. The samples were stained by adding $10 \,\mu L \,m L^{-1}$ of SGPI solution followed by incubation for 20 min in the dark at 37 °C. Three technical replicates were prepared per biological replicate. A BD Accuri C6 flow cytometer (BD Biosciences) was used for flow cytometric analysis using the 488 and 640 nm laser for excitation of the fluorescent dyes.

Relative abundance of strains in the tripartite community

DNA from 10 mL of tripartite culture was extracted using the OIAMP DNA Mini kit (Oiagen) according to the manufacturer's instructions. The relative abundance of C. testosteroni, N. europaea and N. winogradskyi in the tripartite culture was assessed with realtime quantitative PCR (qPCR) using the $\Delta\Delta C_T$ method⁸⁸. Universal 16 S rRNA primers 910 FW and 1141 RV (AGCGGTGGATGATGTG-GATTAA, TTGTCACCGGCAGTCTCTCTAG) and species-specific primers ureA (AGCGCCTTTGTGATGGAA, GATCTGGATGTCGGGAA TCATC), amoA (ACACCCGAGTATGTTCGTCA, TGCGATGTACGATAC-GACCT), and nxrA (GAGATGCAGCAGACCGACTA, GGCTGTAGACG-TACCACGAA) for C. testosteroni, N. europaea and N. winogradskvi, respectively, were used. Primers for ureA were designed for this experiment, while amoA and nxrA primers were used according to Perez et al., 2015⁴⁰. The qPCR cycling parameters were 5 min at 95 °C followed by 35 cycles of 15 sec at 95 °C and 1 min at 65 °C. The program was executed on the real-time PCR cycler RotorGene Q (Qiagen). 25 µL of gPCR mixture was used with QuantiNova SYBR Green RT PCR (Qiagen), 300 nM of FW and RV primers and 5 ng of DNA. qPCR of the genomic DNA standards, non-template controls and samples were performed in technical triplicate. Since N. europaea and N. winogradskyi contain 2 copies of amoA and *nxrA* respectively, the calculated fold change $(2^{-\Delta\Delta CT})$ for these species was divided by 2.

RNA extraction

10 mL of bacterial culture samples for *C. testosteroni* and the nitrifiers were pelleted by centrifugation at 14,000 g for 5 min. RNA was isolated according to an optimized protocol for low-biomass bacterial samples⁸⁹ as described in Verbeelen et al.⁹⁰. RNA samples with a RIN-value above or equal to 8 were accepted for sequencing. RNA-Seq was performed on biological triplicates.

RNA sequencing

RNA sequencing procedure was outsourced to BaseClear B.V. (Leiden, The Netherlands). Here, rRNA was first depleted using the Illumina Ribo-Zero Plus kit (Illumina). Paired-end sequence reads were generated using the Illumina NovaSeq 6000 system

(Illumina). The Illumina TruSeq Stranded Total RNA kit was used to construct the library. FASTQ read sequence files were generated using bcl2fastq version 2.20 (Illumina). Initial quality assessment was based on data passing the Illumina Chastity filtering. Subsequently, reads containing PhiX control signal were removed using an in-house filtering protocol. In addition, reads containing (partial) adapters were clipped (up to a minimum read length of 50 bp). The second quality assessment was based on the remaining reads using the FASTQC quality control tool version 0.11.8 (Brabraham Bioinformatics).

RNA-Seq data analysis

Paired-end mRNA reads were mapped with subread for R (version 2.0.1)⁹¹ to the reference genome of the strain (C. testosteroni I2; NCBI accession number CP067086.1, N. europaea ATCC19718; NCBI accession number AL954747.1, N. winogradskyi Nb-255; NCBI accession number CP000115.1). For the tripartite community, the 3 genomes were combined to perform the mapping process. Gene expression quantification was performed with the feature-Counts function⁹² from the subread package with the latest genome annotations available for C. testosteroni 12, N. europaea ATCC19718 and N. winogradskyi Nb-255 obtained from the MaGe platform. Differential gene expression was calculated using the edgeR (version 3.34.1)⁹³ and limma (version 3.48.3)⁹⁴ packages. Lowly expressed genes were filtered out using the filterbyExpr function of the edgeR package. Thresholds for differential gene expression (DGE) were a *p*-value < 0.05 and $-1 \ge \log_2 FC \ge 1$ $(|FC| \ge 2).$

Statistical analysis

All experiments were performed in biological triplicate or quadruplicate, where stated. One-way Analysis of Variance (ANOVA) and post-hoc Tukey tests were performed to identify significant differences in endpoint OD₆₀₀ measurements and LIVE/DEAD ratios of the bacterial cultures, p < 0.05 was considered statistically significant.

Data visualization

Endpoint OD₆₀₀-values, LIVE/DEAD ratios and relative abundancies of the tripartite culture were visualized using Graphpad Prism version 9.0.0 for Windows (GraphPad Software). COG barplots were constructed with the ggplot2 package for R (version 3.4.2). The UpSetR package for R (version 1.4.0)⁹⁵ was used to build gene overlap plots for DEGs across different growth conditions.

DATA AVAILABILITY

The datasets generated and analyzed during the current study are available within the NCBI Sequence Read Archive (SRA) using the accession PRJNA881961.

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COMPETING INTERESTS

The authors declare no competing interests.

ADDITIONAL INFORMATION

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