

# Transcriptional Responses of *Streptococcus gordonii* and *Fusobacterium nucleatum* to Coaggregation

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## 1 **ABSTRACT**

2 Cell-cell interactions between genetically distinct bacteria, known as coaggregation, are  
3 important for the formation of mixed-species biofilms such as dental plaque. Interactions lead to  
4 gene regulation in the partner organisms that may be critical for adaptation and survival in mixed-  
5 species biofilms. Here, gene regulation responses to coaggregation between *Streptococcus*  
6 *gordonii* and *Fusobacterium nucleatum* were studied using dual RNA-Seq. Initially, *S. gordonii*  
7 DL1 was shown to coaggregate strongly with *F. nucleatum* in buffer or human saliva. Using  
8 confocal laser scanning microscopy and transmission electron microscopy, cells of different  
9 species were shown to be evenly distributed throughout the coaggregate and were closely  
10 associated with one another. This distribution was confirmed by serial block face sectioning  
11 scanning electron microscopy, which provided high resolution 3D images of coaggregates. Cell-  
12 cell sensing responses were analysed 30 min after inducing coaggregation in human saliva. By  
13 comparison with monocultures, 16 genes were regulated following coaggregation in *F. nucleatum*  
14 whereas 119 genes were regulated in *S. gordonii*. In both species, genes involved in amino acid  
15 and carbohydrate metabolism were strongly affected by coaggregation. In particular, one 8-gene  
16 operon in *F. nucleatum* encoding sialic acid uptake and catabolism was up-regulated 2- to 5-fold  
17 following coaggregation. In *S. gordonii*, a gene cluster encoding functions for phosphotransferase  
18 system-mediated uptake of lactose and galactose was down-regulated up to 3-fold in response to  
19 coaggregation. The genes identified in this study may play key roles in the development of mixed-  
20 species communities and represent potential targets for approaches to control dental plaque  
21 accumulation.

## 22 INTRODUCTION

23 Oral bacteria live in structurally and functionally organized communities on the surfaces  
24 of hard and soft tissues in the mouth.<sup>1</sup> Biofilms on the tooth surface are particularly important  
25 since they are responsible for dental caries and periodontitis, two of the most prevalent diseases  
26 in humans worldwide.<sup>2</sup> These biofilms, known as dental plaque, form by the sequential  
27 colonization of bacteria present in saliva. Pioneer colonizers, including several species of oral  
28 streptococci such as *S. gordonii*, *S. sanguinis*, and *S. oralis*, along with *Neisseria*, *Haemophilus*,  
29 *Veillonella*, *Actinomyces* and others, adhere to protein and glycoprotein receptors in the acquired  
30 enamel pellicle that coats the tooth surface.<sup>3</sup> These species provide new adhesins and receptors  
31 that support the incorporation of other organisms into the biofilm. Genera such as *Fusobacterium*  
32 and *Corynebacterium* adhere to a large number of different oral bacteria and they can frequently  
33 be identified in the middle layers of dental plaque, potentially providing a bridge for the  
34 subsequent colonization by a diverse array of other oral bacteria.<sup>4,5</sup>

35 Many physical interactions (coaggregation) between taxonomically distinct oral bacteria  
36 have been studied *in vitro* and a number of cell surface protein adhesins and receptor  
37 carbohydrates have been identified.<sup>6</sup> In some cases, strong coaggregation is mediated by  
38 interactions between one type of adhesin and a complementary receptor. For example, *S.*  
39 *gordonii* DL1 SspB is necessary and sufficient for binding to an *Actinomyces oris* MG1 cell  
40 surface carbohydrate and mediating coaggregation.<sup>7,8</sup> Other coaggregation interactions involve  
41 multiple proteins and/or carbohydrates. Recent evidence indicates that coaggregation between  
42 *Fusobacterium nucleatum* and *S. gordonii* involves at least three *F. nucleatum* outer membrane  
43 proteins: two arginine-inhibitable adhesins, RadD and CmpA, and an accessory protein Aid1 that  
44 facilitates RadD-mediated adhesion.<sup>9-12</sup> It is not clear which components of *S. gordonii* are

45 required for this interaction, but it is likely that at least one antigen I/II family adhesin, SspA or  
46 SspB, is involved since the homologous protein of *S. mutans*, SpaP, is required for coaggregation  
47 with *F. nucleatum*.<sup>13</sup>

48 Coaggregation interactions directly influence the spatial positioning of different species  
49 in dental plaque.<sup>14</sup> They may also play an indirect role, through bringing cells into close  
50 proximity where they exchange signals, metabolites or antimicrobial products that can  
51 subsequently lead to co-operative or competitive interactions in the biofilm.<sup>15-17</sup> Many examples  
52 of metabolic cross-talk between oral bacteria have been identified.<sup>18</sup> Oral streptococci such as *S.*  
53 *gordonii* are important producers of lactic acid that can be utilized by other species in the biofilm  
54 such as *Veillonella* spp. and *Aggregatibacter actinomycetemcomitans*.<sup>19-21</sup> Production of 4-  
55 aminobenzoate/para-amino benzoic acid (pABA) by *S. gordonii* supports biofilm formation and  
56 colonization of *Porphyromonas gingivalis* in a murine oral infection model, but reduces  
57 virulence.<sup>22</sup> *S. gordonii* also secretes ornithine during uptake of arginine through the ArcD  
58 arginine/ornithine antiporter. The ornithine can be utilized by *F. nucleatum* and promotes dual-  
59 species biofilm formation.<sup>23</sup>

60 There is now strong evidence that cell-cell interactions are sensed by the partner species  
61 and lead to phenotypic adaptations that affect key functions such as growth, virulence or mixed-  
62 species biofilm formation. For example, *S. gordonii* utilizes a secreted protease, Challisin, to  
63 acquire and sense arginine following coaggregation with *Actinomyces oris*, and coaggregation  
64 enables growth of *S. gordonii* in arginine-depleted media.<sup>24,25</sup> Interactions with *S. gordonii* lead  
65 to up-regulation of the *A. actinomycetemcomitans* complement resistance protein ApiA and  
66 promote survival in human serum.<sup>26</sup> In addition, in response to hydrogen peroxide production by  
67 *S. gordonii*, *A. actinomycetemcomitans* up-regulates *katA*, encoding catalase, and *dspB*, encoding

68 Dispersin B, enabling both fight (using catalase) or flight (using Dispersin B) and overall  
69 promoting biofilm formation by both species.<sup>27</sup> There is evidence that *S. gordonii* and *F.*  
70 *nucleatum* respond to the presence of one another, since the total protein profiles of each species  
71 are distinct when grown in two- or three-species biofilms (also containing *P. gingivalis*)  
72 compared with monoculture biofilms.<sup>28,29</sup> However, the early changes in gene expression in these  
73 two important oral bacteria following cell-cell interactions have not yet been documented.  
74 Therefore, this study aimed to explore the impact of coaggregation between *S. gordonii* and *F.*  
75 *nucleatum* in human saliva on the gene expression in each partner. Understanding responses to  
76 coaggregation will provide important insights into how these species adapt as they interact with  
77 one another during the formation of oral biofilms.

78

## 79 **MATERIALS AND METHODS**

### 80 **Saliva preparation**

81 Ethical approval for the collection of saliva from healthy volunteers was obtained from the  
82 Newcastle University Research Ethics Committee (reference 1083). Parafilm-stimulated saliva  
83 was collected on ice from five healthy individuals who had not eaten for at least 2 h prior to  
84 collection. Immediately after collection, dithiothreitol (DTT) was added to a final concentration of  
85 2.5 mM and stirred gently on ice for 10 min. Large particles were removed by centrifugation at  
86 15,000 g for 30 min at 4°C. The supernatant was collected and 3 volumes of H<sub>2</sub>O were added to 1  
87 volume of saliva. The diluted saliva was sterilized by filtration through a 0.22 µm pore membrane.  
88 Saliva was aliquoted and stored at -20°C until use as a medium for coaggregation. Before use,  
89 saliva was thawed in a 37°C water bath and any precipitate that had formed was removed by  
90 centrifugation at 1,400 g for 10 min at 20°C.

91

92 **Bacterial growth and coaggregation assays**

93 *S. gordonii* DL1 was routinely grown statically at 37°C in THYE broth containing 30 g/L  
94 Bacto™ Todd Hewitt Broth (Becton Dickinson, Plymouth, UK), 5 g/L yeast extract (Melford  
95 Laboratories, Ipswich, UK). *Fusobacterium nucleatum* subsp. *nucleatum* ATCC 25586 was cultured  
96 at 37°C in Fastidious Anaerobe Broth (FAB) consisting of peptone mix 15.0 g/L, yeast extract  
97 10.0 g/L, sodium thioglycollate 0.5 g/L, sodium chloride 2.5 g/L, sodium bicarbonate 0.4 g/L, L-  
98 cysteine HCl 0.5 g/L, haemin 0.005 g/L and vitamin K 0.0004 g/L (Lab M, Lancashire, UK), under  
99 anaerobic conditions (gas mix 90% N<sub>2</sub>, 5% H<sub>2</sub> and 5% CO<sub>2</sub>).

100 To assess coaggregation, *S. gordonii* DL1 and *F. nucleatum* ATCC 25586 were cultured  
101 separately for 18 h in THYE and FAB, respectively, and harvested by centrifugation at 3,800 g for  
102 10 min in a swing-out rotor. Cells were washed three times with one volume of phosphate buffered  
103 saline (PBS, pH 7.3) and re-suspended in one volume of either coaggregation buffer (1 mM Tris-  
104 HCl pH 8.0, 0.1 mM CaCl<sub>2</sub>, 0.1 mM MgCl<sub>2</sub>, 150 mM NaCl, and 0.02% NaN<sub>3</sub>) or saliva, prepared  
105 as above, to give an optical density of 1.0 at 600 nm (final concentration of approximately  
106 10<sup>9</sup> CFU/mL). Coaggregation was induced by mixing 150 µL of each culture in a glass tube,  
107 mixing by vortex for 10 sec and gently rocking until coaggregation was visible. The formation of  
108 macroscopic coaggregates was assessed by the visual scoring system.<sup>25</sup> Three biological replicates  
109 were performed for all conditions.

110

111 **Confocal scanning laser microscopy (CSLM) imaging of coaggregation**

112 For CSLM imaging of coaggregation, *S. gordonii* DL1 and *F. nucleatum* 25586 were  
113 cultured in THYE and FAB as above, harvested and washed three times in coaggregation buffer.  
114 Cultures were adjusted to OD<sub>600 nm</sub>=1.0. To visualize *S. gordonii* cells, an aliquot of 500 µl of cells

115 was added to 5  $\mu$ l PicoGreen dye (Life technologies Ltd, Paisley, UK). For visualizing *F.*  
116 *nucleatum*, propidium iodide (Sigma-Aldrich, Inc), was added to a concentration of 1.5 mM in  
117 500  $\mu$ l of bacterial cell suspension. Samples were incubated in darkness at 37°C for 30 min.  
118 Fluorescently stained bacteria were washed twice with coaggregation buffer and resuspended in  
119 500  $\mu$ l coaggregation buffer. To induce coaggregation in dual-species cultures, 500  $\mu$ l of each  
120 species were mixed by vortex for 10 sec and gently rocked until coaggregation was visible.

121 Rubber O rings of 0.2 mm diameter (W&H Ltd, Bürmoos, Austria) were fixed to glass  
122 microscope slides using sticky wax or superglue. In order to keep the coaggregation stable during  
123 imaging, 0.25 volumes of agarose (1.25% wt/vol) were added to the sample. Cells were placed in  
124 the middle of the rubber ring and a coverslip (22 x 22 mm) was added. Coaggregation samples  
125 were visualized using a Leica SP2 CLSM microscope (3D) (Leica, Microsystems, Heidelberg,  
126 Germany) using excitation (Ex) at 530 nm and emission (Em) at 630 nm for propidium iodide and  
127 Ex/Em = 485 nm /530 nm for PicoGreen.

128

### 129 **Electron microscopy**

130 For high resolution imaging of coaggregation by transmission electron microscopy (TEM),  
131 coaggregation was induced as described above. Samples were placed into 2% (v/v) glutaraldehyde  
132 and stored at 4°C for up to 48 h. Samples were dehydrated through a series of ethanol washes,  
133 embedded in epoxy resin and sectioned at Electron Microscopy Research Services, Newcastle  
134 University. Sections were analyzed in a Philips CM100 transmission electron microscope. For  
135 serial block face sectioning-scanning electron microscopy (SBF-SEM), coaggregated cells were  
136 fixed in 2% glutaraldehyde for 24 h at 4°C, rinsed twice in PBS and then dehydrated through a  
137 series of ethanol washes: once each in 25%, 50%, 75%, and two times in 100% ethanol for 30 min.  
138 The structure of coaggregates was visualized using a Zeiss Sigma Field Emission Gun Scanning

139 Electron Microscope (FEGSEM) incorporating Gatan 3view. Approximately 100 serial 70 nm sections  
140 were analysed. *S. gordonii* and *A. oris* cells were manually identified and color-coded, facilitated by  
141 AMIRA 3D software (Thermo Fisher).

142

### 143 **Extraction of RNA from coaggregates and monocultures**

144 To assess gene regulation responses to coaggregation, *S. gordonii* and *F. nucleatum* were  
145 cultured for 18 h at 37°C in BHYG containing (per L): Brain Heart Infusion 37 g, Yeast extract  
146 5 g and sodium glutamate 2.5 g. Cells were subcultured into fresh medium and grown to mid-  
147 exponential phase ( $OD_{600} = 0.4-0.6$ ). Cells were harvested at 3,800 g in a swing out rotor at 20°C  
148 for 10 min and adjusted to  $OD_{600} = 1.0 \pm 0.2$ . Five mL of each culture was harvested at 3,800 g,  
149 20°C for 5 min and resuspended in 0.5 ml human saliva. Samples were divided into two equal  
150 portions and one of each was used for monoculture controls, while the other portion of each cell  
151 type were combined and vortex mixed for 10 sec to induce coaggregation. All samples were made  
152 up to 5 mL by the addition of saliva and incubated at 37°C for 30 min. Five mL of *RNAlater*  
153 (Invitrogen) was added, and the tubes were vortexed for 5 sec and incubated at 20°C for 5 min.  
154 Following incubation, cells were harvested at 3,000 g for 15 min at 20 °C, the supernatant was  
155 discarded, and the pellets were frozen at -80°C for RNA extraction within 7 days. Three biological  
156 replicates were performed for all conditions.

157 To disrupt cells for RNA extraction, samples were thawed at 20°C and resuspended in  
158 100 µl spheroplasting buffer containing 0.1 mg/mL spectinomycin.<sup>30</sup> Mutanolysin was added to  
159 500 U/mL and cells were incubated at 37°C for 5 min. Total RNA was extracted using the Ambion  
160 RiboPure Bacteria RNA Purification kit (Life Technologies) according to the manufacturer's  
161 instructions. RNA concentrations were determined using a NanoDrop ND-1000  
162 Spectrophotometer (Thermo Scientific). To ensure that RNA had not degraded during extraction,



163 an aliquot of each sample was analyzed by gel electrophoresis. Additional quality control using  
164 the Bioanalyzer (Agilent Technologies, Santa Clara, CA, USA) was performed upon receipt of  
165 samples by BGI Tech Solutions (Hong Kong).

166

### 167 **Library construction and whole-transcriptome sequencing.**

168 Following an initial rRNA depletion, first strand cDNA synthesis was performed using  
169 random hexamer primers. The second-strand cDNA was synthesized using buffer,  
170 deoxynucleotides, RNase H and DNA polymerase I. Short fragments were purified, ends repaired  
171 and poly(A) tails added, prior to connecting sequencing adapters. Second strand cDNA was  
172 digested with uracil N-glycosylase and the product was purified before PCR amplification. Finally,  
173 the library was sequenced on the Illumina HiSeq™ 2000 platform to obtain paired end reads (100  
174 bp) through the established and internationally recognized sequencing provider BGI, Hong Kong.

175

### 176 **Preprocessing raw sequence data**

177 Raw reads were quality examined by FastQC (Babraham Bioinformatics, UK). To improve  
178 the quality of reads and remove adapter sequences, reads with quality score less than 20 were  
179 filtered with Trimmomatic-0.36,<sup>31</sup> which left only the high-quality reads for the downstream  
180 assembly. The pre-processed reads were again examined with FastQC. All sequence reads were  
181 deposited at the NCBI Sequence Read Archive (<https://ncbi.nlm.nih.gov/sra/>) under Accession  
182 number SRP148871.

183

### 184 **Mapping reads to the reference genome, abundance estimation, and data normalization**

185 First raw reads for monoculture samples were mapped to the *S. gordonii* (NC\_009785.1)  
186 and *F. nucleatum* (NC\_003454.1, supplementary data1). For coaggregate samples, the

187 preprocessed reads were aligned in two rounds independently to the above two reference genomes  
188 and designated as SgFn\_Fn (reads of mixed culture mapped to *F. nucleatum*) and SgFn\_Sg (reads  
189 of mixed culture mapped to *S. gordonii*). Alignment for all reads was performed using TopHat  
190 v2,<sup>32</sup> a splice junction mapper built upon the short read aligner Bowtie with default parameters.  
191 Mapping statistics were verified using SAMtools<sup>33</sup> flagstat. Read counts were collected with  
192 HTSeq version-0.6.1p1<sup>34</sup> with settings stranded=yes, mode=union and type=gene using  
193 corresponding GFF files obtained from NCBI. Normalization was performed using the Trimmed  
194 Mean of *M*-values.<sup>35</sup> The fold changes after normalization and log<sub>2</sub> transformations for each  
195 comparison produced by in house scripts (Figure 4) were visualized by boxplots.

196         Pairwise differential expression analysis between mixed cultures (SgFn) and monoculture  
197 control (Sg, Fn) conditions were performed using the R package DESeq2 available under  
198 Bioconductor ([www.bioconductor.org](http://www.bioconductor.org)). Differential Expression was determined using the  
199 DESeq2 version 3.6.<sup>36</sup> This was done using the sequence of commands: newCountDataSet,  
200 estimateSizeFactors, estimateDispersions, and nbinomTest. For the estimateDispersions function  
201 the settings used are method = “per-condition”, sharingMode = “maximum”, fitType =  
202 “parametric”. The differentially expressed genes were considered to be significant at P<sub>adj</sub> <0.05.  
203 A volcano plot exploring all differentially expressed genes from mixed and monoculture  
204 comparisons displaying the relation between log<sub>2</sub> (fold change) and statistical significance (P<sub>adj</sub>)  
205 values was generated using in house R scripts. Gene networks corresponding to the screened  
206 differentially expressed genes were retrieved from Search Tool for the Retrieval of Interacting  
207 Genes (STRING) database v10.5.<sup>37</sup> To highlight connected clusters of nodes, kmeans clustering  
208 was applied as described in figure legends.

209

210 **Quantitative reverse transcriptase PCR (RT-qPCR)**

211 Quantitative reverse transcriptase PCR was carried out using two steps for reverse  
212 transcription and PCR. The reverse transcription step was performed using the QuantiTect Reverse  
213 Transcription Kit (Qiagen, Valencia, CA). RNA samples extracted from *S. gordonii* and *F.*  
214 *nucleatum* cells were converted into cDNA according to manufacturer's instructions, with the  
215 modification that random hexamers (Bioline, Taunton, MA, USA) were used in place of the  
216 QuantiTect oligo-dT primers.<sup>30</sup> The cDNA samples were stored at -20°C until analysis by real-  
217 time PCR. Primers for RT-qPCR analysis are described in Table 1.

218 All RT-qPCR was performed using SYBR Green dye from the SensiMix SYBR No-ROX  
219 kit (Bioline). Each reaction contained 25 µL consisting of 0–15 ng template cDNA,  
220 forward/reverse primers each at 2 µM, 12.5 µL Power SyBr Green PCR mix and sterile deionized  
221 water. Standard curves consisting of serial ten-fold dilutions of *S. gordonii* DL1 or *F. nucleatum*  
222 25586 chromosomal DNA, no template control and 'no RT' negative controls were included on  
223 each plate. Reactions were carried out using a DNA Engine Opticon 2 (BioRad, Watford, UK) as  
224 follows: 1. 95°C for 5 min; 2. 95°C for 10 s; 3. 60°C for 30 s; 4. plate read; 5. repeat from step 2  
225 a further 39 times; 6. melting curve from 55-90°C, read every 1°C, hold for 5 sec. As a reference,  
226 the 16S rRNA gene of *S. gordonii* or *F. nucleatum* was measured and used to normalize the data.  
227 To assess the specificity of the reactions, melt curve analysis were performed on all samples and  
228 selected products were also assessed by agarose gel electrophoresis. Three biological replicates  
229 were performed for all RT-qPCR reactions.

230

231 **RESULTS AND DISCUSSION**

232 **Coaggregation between *S. gordonii* and *F. nucleatum***

233 Initially, coaggregation between *S. gordonii* DL1 and *F. nucleatum* 25586 was assessed  
234 using the well-established visual scoring system.<sup>25</sup> Macroscopic aggregates were observed after  
235 mixing equal concentrations of each species in either coaggregation buffer or human saliva. These  
236 were scored '4+' in the visual assay, indicating strong coaggregation with a complete clearance of  
237 the background. Previously, it has been shown that *F. nucleatum* 25586 coaggregates with a variety  
238 of *Streptococcus* spp. in saliva diluted in growth medium.<sup>38</sup> In addition, *F. nucleatum* ATCC 23726  
239 coaggregates strongly with *S. gordonii* DL1 in coaggregation buffer.<sup>11</sup> Therefore, it was not  
240 unexpected that *S. gordonii* DL1 and *F. nucleatum* 25586 would form strong coaggregates in  
241 buffer or saliva. Three-dimensional (3D) CSLM images showed *S. gordonii* and *F. nucleatum* cells  
242 interspersed throughout the coaggregate structure (Figure 1). There was evidence that the DNA-  
243 binding dye PicoGreen had transferred from *S. gordonii* to *F. nucleatum* since a yellow color was  
244 observed within the majority of red-stained *F. nucleatum* cells (Figure 1B). Monoculture cells of  
245 *F. nucleatum* stained with propidium iodide were entirely red (data not shown). Nevertheless, *F.*  
246 *nucleatum* cells were clearly seen to be in close proximity to *S. gordonii* cells. Whilst  
247 coaggregation between many different oral bacteria, and between bacteria from other  
248 environments, has been demonstrated,<sup>6,39</sup> relatively little is known about the spatial positioning of  
249 cells from different species within these coaggregates. Using fluorescence microscopy, it was  
250 shown that *S. gordonii* and *A. oris* cells were distributed quite evenly throughout coaggregates,  
251 and *S. gordonii* appeared to sense and respond to these interactions.<sup>24</sup> Our CSLM images of *S.*  
252 *gordonii* and *F. nucleatum* showed a similar distribution of cells, and also indicated that there was  
253 potential for the different species to sense one another.

254 To observe the interactions between *S. gordonii* and *F. nucleatum* more closely,  
255 coaggregates were sectioned and visualized by TEM (Figure 2). In these images, *S. gordonii* cells

256 were seen to be closely associated with *F. nucleatum*, consistent with an adhesin-receptor-driven  
257 interaction.<sup>10-12</sup> Finally, to observe these interactions at high resolution in three dimensions,  
258 coaggregates were analyzed using serial block face sectioning SEM (SBF-SEM). This method  
259 involves taking serial sections of a fixed depth (~70 nm was used here), through an embedded  
260 sample using an ultramicrotome contained within an SEM. The surface profile of each section is  
261 visualized by SEM, and the serial sections can be reconstructed into a three-dimensional image.  
262 Using image analysis tools, individual cells can be identified and color-coded (Figure 3). This  
263 method confirmed that *S. gordonii* and *F. nucleatum* cells interacted closely with one another  
264 throughout the three-dimensional coaggregate structure. These close interactions provide clear  
265 opportunities for cells of the different species to sense and respond to each other. To the best of  
266 our knowledge, SBF-SEM has not previously been used to visualize coaggregate structures. The  
267 high resolution of this technique and the ability to reconstruct 3D images offers great opportunities  
268 for the detailed characterization of different coaggregation interactions in future. This method may  
269 also be used to obtain structural information about biofilms.<sup>40</sup>

270

### 271 **RNA extraction and RNA-Seq**

272 To assess the gene regulation responses of *S. gordonii* and *F. nucleatum* to coaggregation,  
273 cells of each species were mixed in human saliva to induce coaggregation, incubated for 30 min,  
274 and RNA was extracted from coaggregates or monoculture controls. The RNA from each sample  
275 was shown to be free from excessive degradation by NanoDrop spectrophotometry, agarose gel  
276 electrophoresis and Agilent Bioanalyzer analysis (data not shown). In total, Illumina sequencing  
277 from the three mixed *S. gordonii* and *F. nucleatum* (SgFn) biological replicates yielded  
278 107,348,188 raw reads and for monoculture samples *S. gordonii* and *F. nucleatum* yielded

279 109,436,214 and 108,200,956 reads, respectively (Supplementary Table 1). After removal of bases  
280 with quality score less than 20 in Trimmomatic-0.36 software, we retained  $\geq 92\%$  reads for all the  
281 samples. Subsequently, for monoculture 95% of aligned reads mapped to the *S. gordonii* reference  
282 genome and 98% of aligned reads mapped to the *F. nucleatum* reference genome. For mixed  
283 transcriptome samples, 30% of reads mapped to the *S. gordonii* genome and 60% of reads mapped  
284 to the *F. nucleatum* genome (Supplementary Table S1). Samples from mixed and monoculture  
285 samples showed a similar distribution of per-gene read counts per sample, as visualized by box  
286 plots (Figure 4), indicating that the distributions of data were quantitatively comparable between  
287 mixed coaggregate and monoculture samples and no batch effects.<sup>41</sup>

288 DESeq2 was used to compare coaggregate sample reads with two monoculture sample  
289 reads separately. A total of 119 *S. gordonii* genes (51 down-regulated and 68 up-regulated genes)  
290 and 16 *F. nucleatum* genes (2 down-regulated and 14 up-regulated) were found to be differentially  
291 expressed at a false discovery rate ( $P_{\text{adj}}$ ) of 0.05. Volcano plots of genes that were differentially  
292 expressed in the two different comparisons illustrate distinct transcriptional profiles (Figure 5).

293

#### 294 **RT-qPCR validation of RNASeq data**

295 To validate the gene regulation observed by RNASeq, a selection of genes was also  
296 monitored by RT-qPCR. Two up-regulated, two down-regulated and two non-regulated genes that  
297 were reasonably strongly expressed were selected from each species. The patterns of expression  
298 were very similar by RNA-Seq and RT-qPCR (Figure 6). In each case, there was a strong  
299 correlation between the two data sets (Pearson's correlation coefficients between 0.96-0.97,  
300  $P < 0.01$ ). Therefore, overall the RT-qPCR analysis of gene expression closely matched that by  
301 RNA-Seq.

302

303 **Gene regulation in *F. nucleatum***

304 Genes that were regulated in *F. nucleatum* in response to coaggregation with *S. gordonii*  
305 are listed in Table 2. Broadly, functions related to amino acid transport, calcium transport, catalytic  
306 activity/phosphorous metabolic process, lipid transport/metabolism and sialic acid catabolism  
307 were affected. The network of interacting genes was visualized using the STRING database  
308 (Figure 7). The most striking impact of coaggregation was on the expression of an eight-gene  
309 operon involved in sialic acid catabolism (FN1470-FN1477). All genes in this operon were  
310 significantly up-regulated between 2- and 5-fold in response to coaggregation. The genes in this  
311 operon encode the machinery for sialic acid uptake via a tripartite ATP-independent periplasmic  
312 transporter (SiaPQM) and catabolism by NanA/NanK/NanE to produce N-acetylglucosamine-6-  
313 phosphate.<sup>42</sup> In addition, there is a regulator (NanR) and two proteins of unknown function  
314 (FN1470 and FN1477). The N-acetylglucosamine-6-phosphate is a substrate for the enzymes  
315 NagA and NagB, which produce fructose-6-phosphate that can then enter glycolysis.<sup>43</sup> Genes  
316 encoding NagA/NagB were not differentially regulated in our RNA-Seq analysis.

317 It is not clear why sialic acid catabolism was affected by coaggregation. Free sialic acid is  
318 found in saliva within the healthy mouth at concentrations >40 mg/dl.<sup>44</sup> In addition, sialic acid is  
319 commonly present in host glycoproteins as a terminal residue on carbohydrate side chains.<sup>45</sup> Some  
320 strains of *S. gordonii*, including *S. gordonii* DL1, bind to host sialic acids on glycoproteins and  
321 catabolise free sialic acids in saliva.<sup>46,47</sup> However, these activities would likely lead to reductions  
322 in the available sialic acid, which would then repress sialic acid catabolism in *F. nucleatum*. It is  
323 possible that the regulation of sialic acid operon in coaggregates may have resulted from changes  
324 in the localised levels of free sugars such as glucose following coaggregation. Sugars are known

325 to modulate sialic acid catabolism genes in some bacteria. For example, in *Corynebacterium*  
326 *glutamicum*, sialic acid catabolism genes are down-regulated during growth in glucose or fructose  
327 due to regulation by NanR and possibly also by a global carbon catabolite repressor.<sup>48</sup> It is  
328 noteworthy that high sialic acid concentrations in saliva have been associated with periodontal  
329 disease.<sup>44</sup> *S. gordonii* is generally associated with periodontal health.<sup>49</sup> It is possible that *S.*  
330 *gordonii* indirectly reduces sialic acid in saliva by stimulating sialidase activity of neighbouring  
331 *F. nucleatum* cells.

332 In addition to the sialic acid utilisation operon, there were clear changes in gene expression  
333 of FN0796 and FN0798, which were upregulated 1.5- to 1.7-fold. These genes encode two key  
334 enzymes in gluconeogenesis: pyruvate phosphate dikinase (FN0796) that converts pyruvate to  
335 phosphoenol pyruvate, and fructose 1,6-bis-phosphatase (FN0798) that hydrolyzes fructose 1,6-  
336 bisphosphate to fructose 6-phosphate. Two genes were downregulated between 1.5- and 1.7-fold:  
337 one gene each in amino acid transport (FN0328) and calcium transport (FN1022). Genes FN1078,  
338 FN0938, and FN0940 were up-regulated between 1.5- and 1.8-fold, but their functions are  
339 unknown. It is possible that FN0938 and FN0940 are part of the same operon as FN0941, encoding  
340 gamma-glutamyltranspeptidase. This enzyme plays a role in synthesis and degradation of  
341 glutathione, a key protective agent against oxidative stress. In summary, a significant proportion  
342 of the gene regulation response of *F. nucleatum* to coaggregation appears to involve metabolic  
343 pathways that converge on fructose 6-phosphate.

344

### 345 **Gene regulation in *S. gordonii***

346 Many more genes were regulated in *S. gordonii* following coaggregation than in *F.*  
347 *nucleatum*. In total, 119 genes were regulated in *S. gordonii* (Supplementary Table S2). Key



348 functions that were affected included carbohydrate metabolism (19 genes), amino acid metabolism  
349 (14 genes) and regulation of DNA metabolic process (4 genes; Table 3). By STRING database  
350 analysis, the major clusters of up-regulated genes were those related to DNA metabolic processes  
351 and three genes in tryptophan biosynthesis (Figure 8). The genes involved in DNA metabolism are  
352 predicted to encode a regulatory protein (RecX), an endonuclease (MutS2), a cell division protein  
353 (DivIB) and a DNA repair protein (RecN). In *Bacillus subtilis* MutS2 promotes homologous  
354 recombination and protects cells from DNA damage.<sup>50</sup> It is possible that the changes in DNA  
355 metabolism prime the *S. gordonii* cells for uptake and incorporation of foreign DNA following  
356 sensing of a different species.

357         The up-regulation of tryptophan biosynthesis genes, along with the cysteine biosynthesis  
358 gene *cysK*, was part of a larger global response involving regulation of amino acid metabolism.  
359 Genes in several amino acid metabolism pathways were down-regulated following coaggregation  
360 (Figure 9) including both histidine catabolism (*hut* genes) and histidine biosynthesis (*his* genes).  
361 It has recently been shown that coaggregation can be sensed through the action of the *S. gordonii*  
362 extracellular protein Challisin, which appears to release amino acids from neighbouring bacteria  
363 such as *Actinomyces oris*.<sup>25</sup> It is possible that Challisin also acts on *F. nucleatum*. Alternatively,  
364 there may be direct cross-feeding of amino acids between *S. gordonii* and *F. nucleatum*. It has  
365 already been shown that *F. nucleatum* can utilize ornithine that is released from *S. gordonii* in  
366 exchange for arginine,<sup>23</sup> and there may be other nutrient exchanges that have yet to be identified.

367         The largest set of co-ordinated changes in gene expression was related to carbohydrate  
368 uptake and metabolism. In particular, genes involved in lactose and galactose uptake and  
369 catabolism were down-regulated following coaggregation. The regulation of these operons has  
370 previously been studied in detail.<sup>51</sup> The expression of *lacG* or *lacA1* was strongly repressed by

371 glucose compared with lactose or galactose. Regulation of the operon is complex and appears to  
372 be mediated by a combination of LacR, the global catabolite repressor CcpA, and a transcriptional  
373 antitermination mechanism directed by LacT.<sup>51</sup> Here, there was a small decrease in *lacG*  
374 expression in coaggregates compared with monocultures. This may indicate an increase in the local  
375 availability of glucose in coaggregates, or possibly a decrease in lactose and/or galactose.  
376 Metabolic cross-feeding from carbohydrate metabolism is well-known to occur in mixed cultures  
377 of bacteria. For example, lactic acid released as a product of carbohydrate catabolism by *S.*  
378 *gordonii* is a key nutrient for *Veillonella parvula* or *Aggregatibacter actinomycetemcomitans*.<sup>19,20</sup>  
379 Alternatively, changes in carbohydrates may be driven by competition. In mixed-species cultures,  
380 *S. gordonii* uses galactose more efficiently than *S. mutans*, except in very low pH.<sup>51</sup> It is not clear  
381 whether *F. nucleatum* can utilise lactose or galactose more efficiently than *S. gordonii* and this  
382 will be the subject of future studies. The major changes in regulation of genes involved in  
383 carbohydrate metabolism are consistent with a previously published proteomic analysis. In this  
384 case, increased levels of enzymes for glycolysis and the pentose phosphate pathway were detected  
385 in dual-species *S. gordonii/F. nucleatum* cultures compared with *S. gordonii* monocultures,  
386 consistent with higher energy availability in mixed cultures.<sup>28</sup>

387

## 388 **CONCLUSIONS**

389 Coaggregation followed by dual RNA-Seq provides a simple model to analyse early  
390 responses to interactions between taxonomically distinct bacterial cells. We predict that the gene  
391 regulation will be similar to that following incorporation into biofilms, since the structure of  
392 aggregates is similar in many ways to a biofilm. The advantage of using aggregated cultures rather  
393 than biofilms is that there is no need for scraping cells from a surface to recover RNA, which could

394 potentially lead to changes in RNA levels as a result of sample processing. In future, it will be  
395 important to extend these studies by monitoring gene expression over a prolonged time course, as  
396 has been reported for *S. gordonii* interacting with *Porphyromonas gingivalis*.<sup>52</sup> In addition, it will  
397 be important to determine whether there are similarities in gene regulation following interactions  
398 with a range of different bacteria. Conserved regulatory responses may elucidate key functions  
399 involved generically for adaptation to mixed-species environments. Such functions would be  
400 excellent candidate targets for new methods to control the formation of mixed-species biofilms  
401 such as dental plaque. Finally, it will be important to determine the mechanism of cell-cell sensing,  
402 and in particular whether it is mediated by an actively secreted factor or by the physical process of  
403 cell-cell contact. This could be tested by killing one partner species prior to coaggregation and  
404 monitoring gene regulation in the other. Interestingly, it has been shown that aggregation of  
405 bacteria by synthetic polymers designed to sequester quorum sensing signals activates quorum  
406 sensing-regulated genes, indicating that aggregation and quorum sensing may have similar impacts  
407 on gene regulation.<sup>53</sup> Elucidation of cell-cell sensing mechanisms between oral bacteria is critical  
408 for the development of novel strategies designed to control dental plaque by interfering with  
409 intermicrobial interactions.

410

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416

417 **FIGURE LEGENDS**

418 **Figure 1.** CSLM analysis of coaggregation between *S. gordonii* and *F. nucleatum*. *S. gordonii*  
419 cells were pre-labelled with PicoGreen and appeared green, whereas *F. nucleatum* cells were  
420 labelled with propidium iodide (red). A. Three-dimensional overview of coaggregates. B. An  
421 enlarged single slice through the coaggregate, showing close association between *S. gordonii* and  
422 *F. nucleatum*. Note that *F. nucleatum* cells appeared to have uptaken some of the DNA-binding  
423 PicoGreen dye since they appeared yellow in the centre of the cells.

424

425 **Figure 2.** High resolution analysis of interactions between *S. gordonii* and *F. nucleatum* cells  
426 using TEM. The right panel shows an enlargement of approximately the area highlighted by a  
427 box in the left panel. *S. gordonii* cells (*Sg*) could be distinguished from *F. nucleatum* (*Fn*) by  
428 their shape and thick cell walls. Individual *F. nucleatum* cells were often intimately associated  
429 with multiple *S. gordonii* cells (left panel).

430

431 **Figure 3.** High resolution 3D imaging of coaggregation between *S. gordonii* and *F. nucleatum*  
432 by SBF-SEM. Serial sections separated by 70 nm were taken through a coaggregate and each  
433 section was visualized by SEM. A. A single slice shown at low magnification and overlaid with  
434 false color of *S. gordonii* (green) and *F. nucleatum* (red), applied manually and assisted by edge-  
435 finding tools of AMIRA software. B. Enlargement of panel A and shown as a reconstruction  
436 from multiple slices to give a 3D image of coaggregation. C. Overview of the entire block shown  
437 in 3D. D. An alternative 3D view of the coaggregation, showing the interactions between false-  
438 colored *S. gordonii* (green) and *F. nucleatum* (red).

439

440 **Figure 4.** Distribution of normalized read counts. Counts were normalized by the Trimmed  
441 Mean of *M*-values approach. Median counts from each sample are shown as thick black lines  
442 surrounded by a box representing the interquartile range, with whiskers that extend to two  
443 standard deviations from the median. Outlying observations are shown as open circles. Data  
444 from three biological repeats of each sample (labelled 1-3) are shown.

445

446 **Figure 5.** Differentially expressed genes in coaggregates versus monocultures for *F. nucleatum*  
447 (A) and *S. gordonii* (B). The y-axis corresponds to the mean expression value of  $\log_{10}(P_{adj})$ , and  
448 the x-axis displays the  $\log_2$  (fold change) value. The green and red dots correspond to  
449 significantly up and down regulated genes, respectively ( $P_{adj} < 0.05$ ). The black dots represent  
450 the genes whose expression levels did not reach statistical significance ( $P_{adj} > 0.05$ ).

451

452 **Figure 6.** Validation of RNA-Seq data for selected genes using RT-qPCR. The expression of six  
453 *S. gordonii* genes and six *F. nucleatum* genes in coaggregate cultures compared with  
454 monocultures was monitored by RT-qPCR, normalized against the 16S rRNA gene. Means and  
455 SDs from three independent samples from RNASeq (dark bars) and RT-qPCR (light bars) are  
456 shown. In all cases, similar levels of expression of each gene were identified by RNA-Seq and  
457 RT-qPCR.

458

459 **Figure 7.** Network of genes upregulated in response to coaggregation, visualized using the  
460 STRING database. Nodes were clustered by kmeans clustering into 7 groups, represented by  
461 circles of different colours. Interactions between nodes are depicted by coloured lines. Different  
462 colours represent evidence from different sources such as gene neighbourhood (green), gene co-

463 occurrence (dark blue), text mining (yellow), curated databases (cyan), experimentally  
464 determined (magenta), coexpression (black), protein homology (light blue) and gene fusions  
465 (red). Genes involved in sialic acid catabolism form the strongest cluster (red circles).

466

467 **Figure 8.** Genes that were up-regulated in *S. gordonii* in response to coaggregation, visualised  
468 by STRING database analysis. Genes were coloured based on kmeans clustering into 3 distinct  
469 groups. Genes involved in DNA maintenance form one cluster (green nodes), while three genes  
470 for tryptophan biosynthesis form a separate cluster (blue nodes). Edges were drawn based on  
471 different lines of evidence (see legend to Figure 7).

472

473 **Figure 9.** STRING database analysis of genes down-regulated in *S. gordonii* following  
474 coaggregation. Five different clusters from kmeans clustering are indicated by different colours  
475 of nodes. See legend to Figure 7 for an explanation of the edges. The major cluster (light  
476 brown/green nodes) is formed from lactose/galactose uptake and catabolism genes that are co-  
477 located on the chromosome.

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- 608

**Table 1.** Primers used for RT-qPCR

Target gene <sup>a</sup>	Gene description	Product length (bp)	Primer Sequence (5'-3')	
SGO_RS07445	galactose-6-phosphate isomerase	105	F	GTATGGTTGCAGCGGAAGTT
			R	GGCCTTCACCAACGATTTCA
SGO_RS07440	galactose-6-phosphate isomerase subunit LacB	116	F	CTAGCGGTCAGGCTGATCTT
			R	AGCTGAAGTCATATCACGTACCA
SGO_RS06265	30S ribosomal protein S21	133	F	ACTTCGCGGTAACGTGATTG
			R	CAAGTTTGCCGCATCCAGAA
SGO_RS09425	DUF1033 domain-containing protein	143	F	CGCAGTGATTTGATGACTGTCT
			R	TAACCCGGACGGTATTTGCT
SGO_RS00525	4-alpha-glucanotransferase	109	F	CTGTTCCATGCAATGCTC
			R	GGCAAGTTCATTCTTGCTGA
SGO_RS05765	Thioredoxin	96	F	AACTGCTTGCTCTGACGAGA
			R	GCTTCCTGACCGACAGCTA
SGO 16S rRNA	<i>S. gordonii</i> 16S rRNA	138	F	AGACACGGCCAGACTCCTAC
			R	TCACACCCGTTCTTCTTTACAA
FN1472	N-acetylneuraminate-binding protein	108	F	GCAGCTGCAAACCTTAGCGTA
			R	TTCTTGACCATCAACTGCAT
FN1473	N-acetylneuraminate transporter small subunit	119	F	TCTGGAATGTCTGGTTCAGC
			R	CAAGAGGCAGCTGTAAGTCC
FN0328	Na(+)-linked D-alanine glycine permease	115	F	AGGTGTTTACAATTGACAGGA

			R	TCCAGTTCCAACTTGTGCTG
FN1022	calcium-transporting ATPase	114	F	TTCTTGACCATCAACTGCAT
			R	GCTTTCTTTAGTGCAGGAGCA
FN0084	acetaldehyde dehydrogenase	92	F	AATGTAGGAGGGTCACTTGA
			R	GTTGAACTTCCTCCGACTGC
FN0369	ribosomal-protein-alanine acetyltransferase	92	F	TTGTTTCTAGTGCTTCTGAACAAA
			R	TGCTAAGGCAGGAACAACACTG
FN 16S rRNA	<i>F. nucleatum</i> 16S rRNA	130	F	CGGGACTTAACCCAACATCT
			R	AGGAACCTTACCAGCGTTTG

<sup>a</sup> ‘SGO’ numbers indicate *S. gordonii* genes, whereas ‘FN’ numbers refer to *F. nucleatum* genes.

**Table 2.** Genes regulated in *F. nucleatum* following coaggregation with *S. gordonii*.

Locus ID	Predicted function (gene)	Fold change <sup>a</sup>	P <sub>adj</sub>
<i>Amino acid transport</i>			
FN0328	Na <sup>+</sup> -linked D-alanine glycine permease	-1.49	0.04
<i>Ca<sup>2+</sup> transport</i>			
FN1022	Ca <sup>2+</sup> -transporting ATPase	-1.45	0.01
<i>Catalytic activity or phosphorous metabolic process</i>			
FN0796	Pyruvate phosphate dikinase	1.50	0.04
FN0798	Fructose-1,6-bisphosphatase ( <i>fbp</i> )	1.65	<0.01
FN0938	Hypothetical protein	1.64	<0.01
<i>Lipid transport/metabolism</i>			
FN0940	Hypothetical protein	1.75	<0.01
FN0941	γ-glutamyltranspeptidase	1.67	<0.01
<i>Sialic acid catabolism</i>			
FN1470	Hypothetical protein	3.10	<0.01
FN1471	Lacl family transcriptional regulator ( <i>nanR</i> )	3.34	<0.01
FN1472	N-acetylneuraminate binding protein ( <i>siaP</i> )	5.05	<0.01
FN1473	Sialic acid TRAP transporter permease protein ( <i>siaQM</i> )	3.53	<0.01
FN1474	N-acetylmannosamine kinase ( <i>nanK</i> )	2.97	<0.01
FN1475	N-acetylneuraminate lyase ( <i>nanA</i> )	2.27	<0.01
FN1476	N-acetylmannosamine-6-phosphate 2-epimerase ( <i>nanE</i> )	1.80	<0.01
FN1477	Hypothetical protein	2.01	<0.01
<i>Function unknown</i>			
FN1078	Hypothetical protein	1.67	<0.01

<sup>a</sup>Fold change in coaggregates versus monocultures. Negative numbers indicate down-regulation.

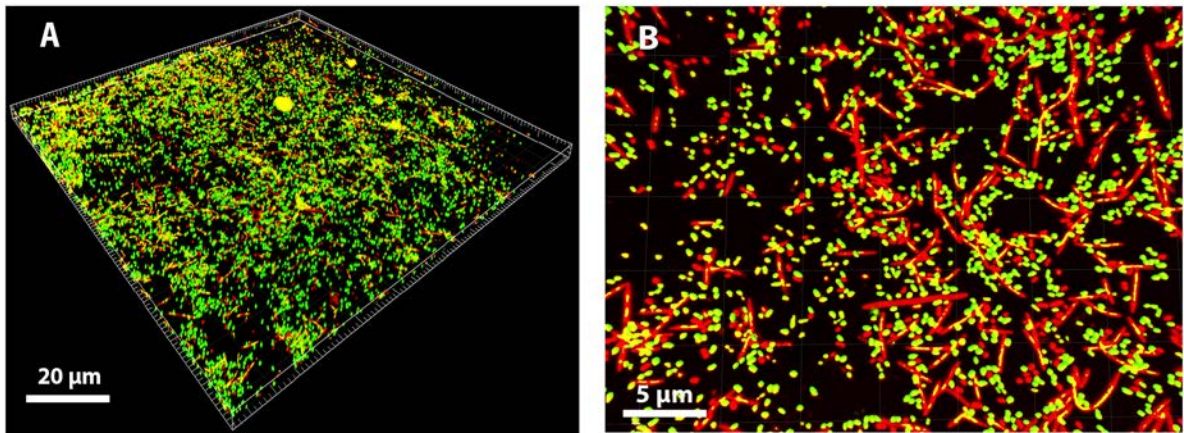
**Table 3.** Key groups of genes regulated in *S. gordonii* following coaggregation with *F. nucleatum*.

Locus ID	Predicted function (gene)	Fold change <sup>a</sup>	P <sub>adj</sub>
<i>Carbohydrate metabolism</i>			
SGO_RS00510 (SGO_0102)	sugar ABC transporter permease	-1.55	0.02
SGO_RS00630 (SGO_0127)	RpiR family transcriptional regulator	1.66	0.03
SGO_RS01385 (SGO_0281)	PTS diacetylchitobiose transporter subunit IIC	1.50	<0.01
SGO_RS04560 (SGO_0932)	Galactokinase ( <i>galK</i> )	-1.40	0.01
SGO_RS05460 (SGO_1112)	Phosphofructokinase ( <i>fruB</i> )	-1.65	0.01
SGO_RS05465 (SGO_1113)	PTS fructose transporter subunit IIC ( <i>fruA</i> )	-1.54	0.02
SGO_RS07410 (SGO_1512)	6-phospho-beta-galactosidase ( <i>lacG</i> )	-1.30	0.03
SGO_RS07415 (SGO_1513)	PTS lactose transporter subunit IIBC ( <i>lacE</i> )	-1.42	0.03
SGO_RS07420 (SGO_1514)	PTS lactose transporter subunit IIA ( <i>lacF</i> )	-1.60	0.02
SGO_RS07430 (SGO_1516)	tagatose-bisphosphate aldolase ( <i>lacD-2</i> )	-1.65	<0.01
SGO_RS07435 (SGO_1517)	tagatose-6-phosphate kinase ( <i>lacC-1</i> )	-2.25	<0.01
SGO_RS07440 (SGO_1518)	galactose-6-phosphate isomerase ( <i>lacB-2</i> )	-2.44	<0.01
SGO_RS07445 (SGO_1519)	galactose-6-phosphate isomerase ( <i>lacA-1</i> )	-2.94	<0.01
SGO_RS07470 (SGO_1524)	tagatose-6-phosphate kinase ( <i>lacC-2</i> )	-1.59	<0.01
SGO_RS07475 (SGO_1525)	galactose-6-phosphate isomerase ( <i>lacB-1</i> )	-1.59	<0.01
SGO_RS07480 (SGO_1526)	galactose-6-phosphate isomerase subunit ( <i>lacA-2</i> )	-1.85	<0.01
SGO_RS07720 (SGO_1576)	PTS cellobiose transporter subunit IIC ( <i>ptcC</i> )	-1.53	0.01
SGO_RS08235 (SGO_1679)	PTS mannose transporter subunit IIAB	-1.54	<0.01
SGO_RS08625 (SGO_1759)	6-phospho-beta-glucosidase	-1.58	0.02
<i>Amino acid metabolism</i>			
SGO_RS02985 (SGO_0606)	Cysteine synthase ( <i>cysK</i> )	-1.71	<0.01
SGO_RS03230 (SGO_0656)	Tryptophan synthetase beta subunit ( <i>trpB-2</i> )	-1.35	0.04
SGO_RS03245 (SGO_0659)	anthranilate phosphor-ribosyl transferase ( <i>trpD</i> )	1.55	0.02
SGO_RS03255 (SGO_0661)	N-(5'-phosphoribosyl anthranilate isomerase ( <i>trpF</i> )	1.59	0.05
SGO_RS04445 (SGO_0906)	2-isopropylmalate synthase ( <i>leuA</i> )	-1.57	<0.01
SGO_RS05865 (SGO_1194)	Phosphoribosylanthranilate isomerase	1.46	0.04

SGO_RS06080 (SGO_1238)	Branched chain amino acid aminotransferase ( <i>ilvE</i> )	-1.59	<0.01
SGO_RS06880 (SGO_1403)	phosphoribosyl-AMP cyclohydrolase ( <i>hisI</i> )	-1.55	<0.01
SGO_RS06900 (SGO_1407)	Imidazoleglycerol-phosphate dehydratase ( <i>hisB</i> )	-1.63	0.05
SGO_RS06915 (SGO_1410)	ATP phosphoribosyl transferase regulatory subunit ( <i>hisZ</i> )	-1.55	0.02
SGO_RS07685 (SGO_1569)	N-acetyl-glutamate semialdehyde dehydrogenase ( <i>argC</i> )	1.63	0.05
SGO_RS08850 (SGO_1804)	Imidazolonepropionase ( <i>hutI</i> )	-1.52	0.01
SGO_RS08855 (SGO_1805)	Urocanate hydratase ( <i>hutU</i> )	-1.50	<0.01
SGO_RS08860 (SGO_1806)	Glutamate formiminotransferase ( <i>ftcD</i> )	-1.59	<0.01
<i>Regulation of DNA metabolic process</i>			
SGO_RS03085 (SGO_0626)	Regulatory protein ( <i>recX</i> )	3.61	<0.01
SGO_RS01280 (SGO_0260)	DNA mismatch binding protein ( <i>mutS2</i> )	2.43	0.05
SGO_RS03440 (SGO_0698)	DNA repair protein ( <i>recN</i> )	1.52	0.01
SGO_RS05995 (SGO_1221)	Inorganic polyphosphate/ATP-NAD kinase ( <i>nadK</i> )	1.51	0.03

<sup>a</sup>Fold change in coaggregates versus monocultures. Negative numbers indicate down-regulation.

Figure 1



**Figure 2**

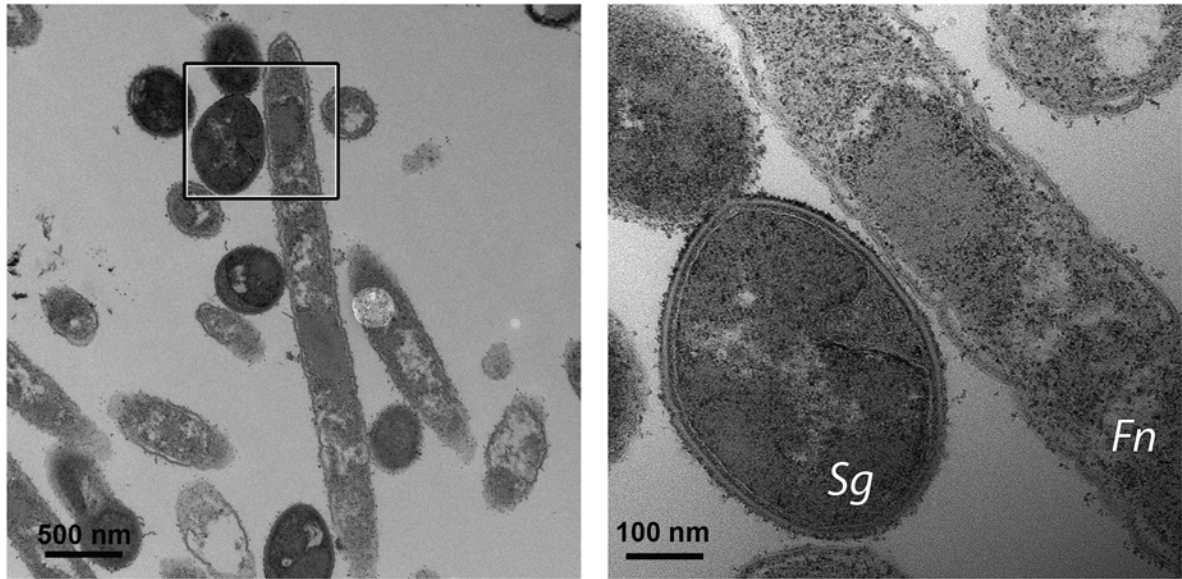
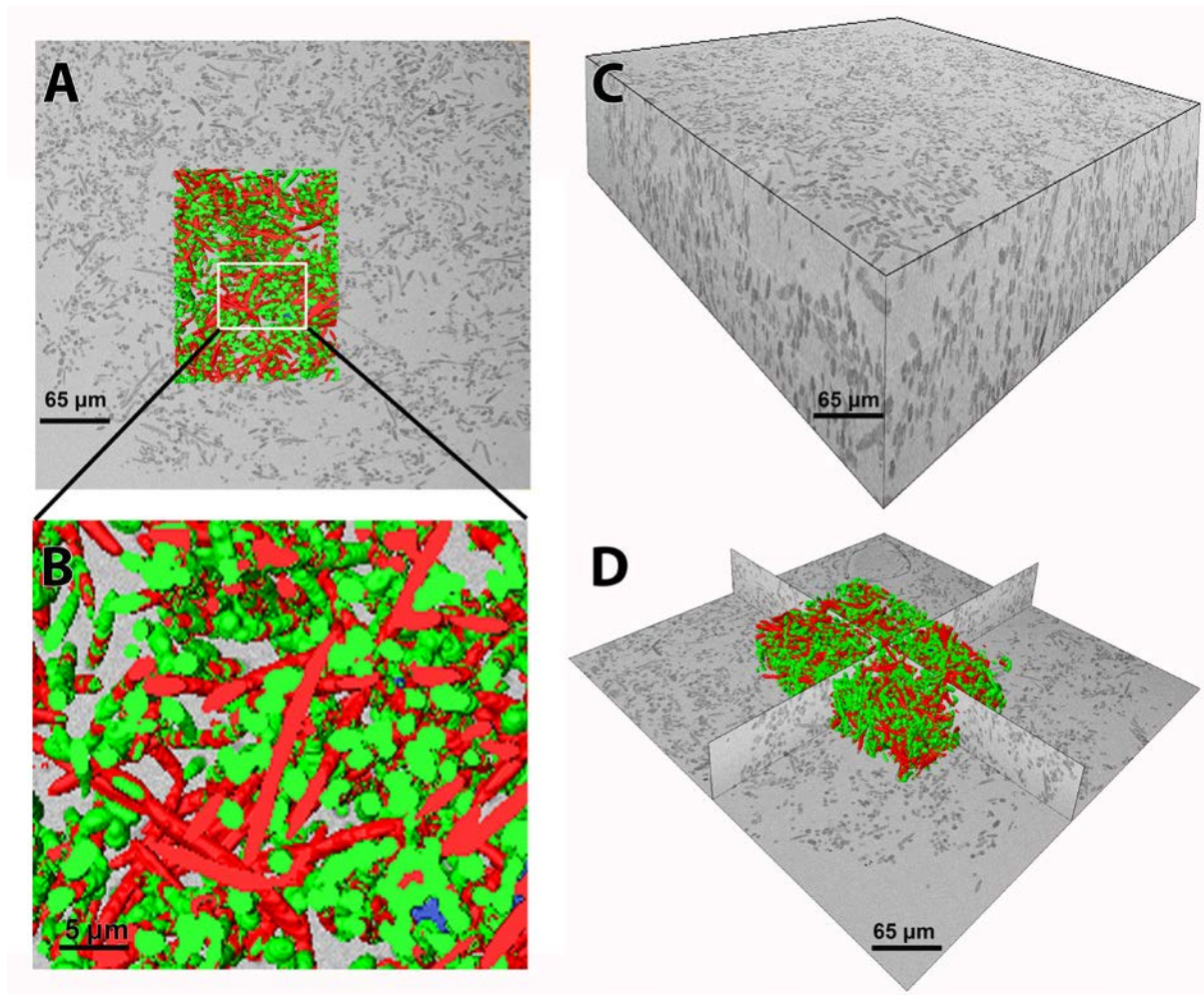
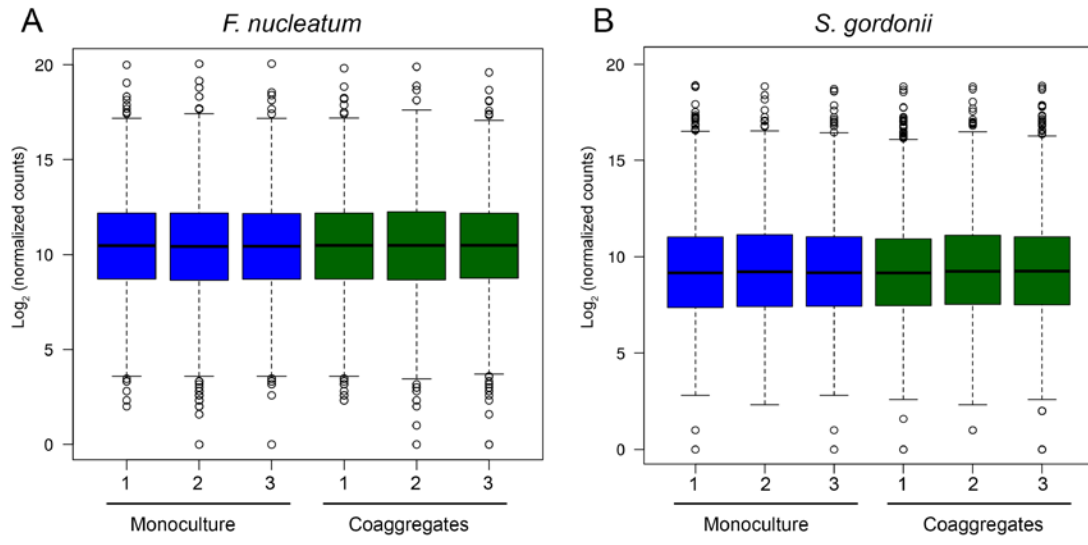




Figure 3



**Figure 4**



**Figure 5**

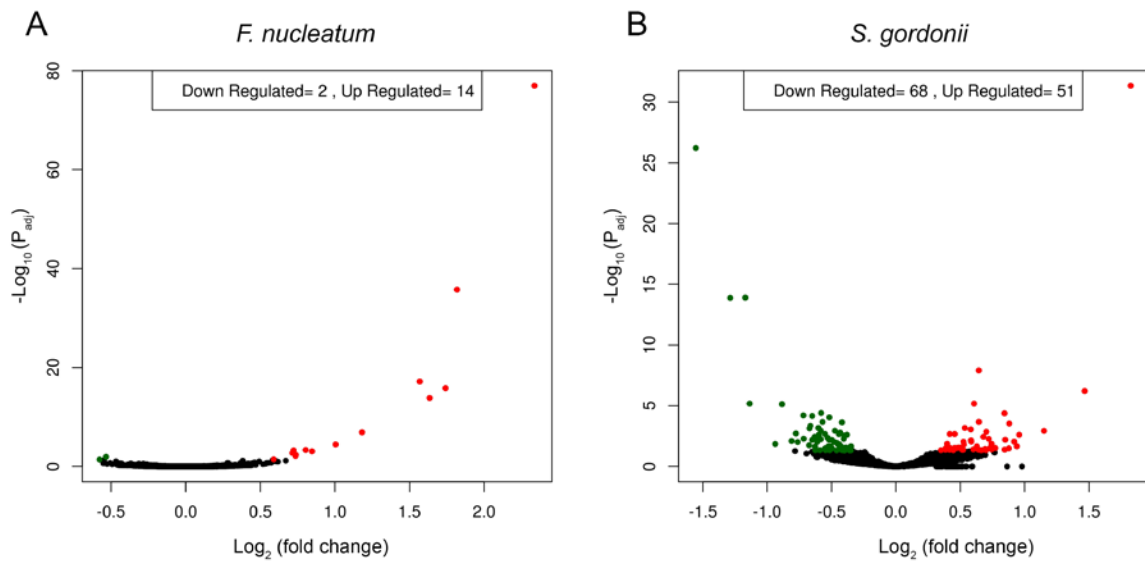


Figure 6

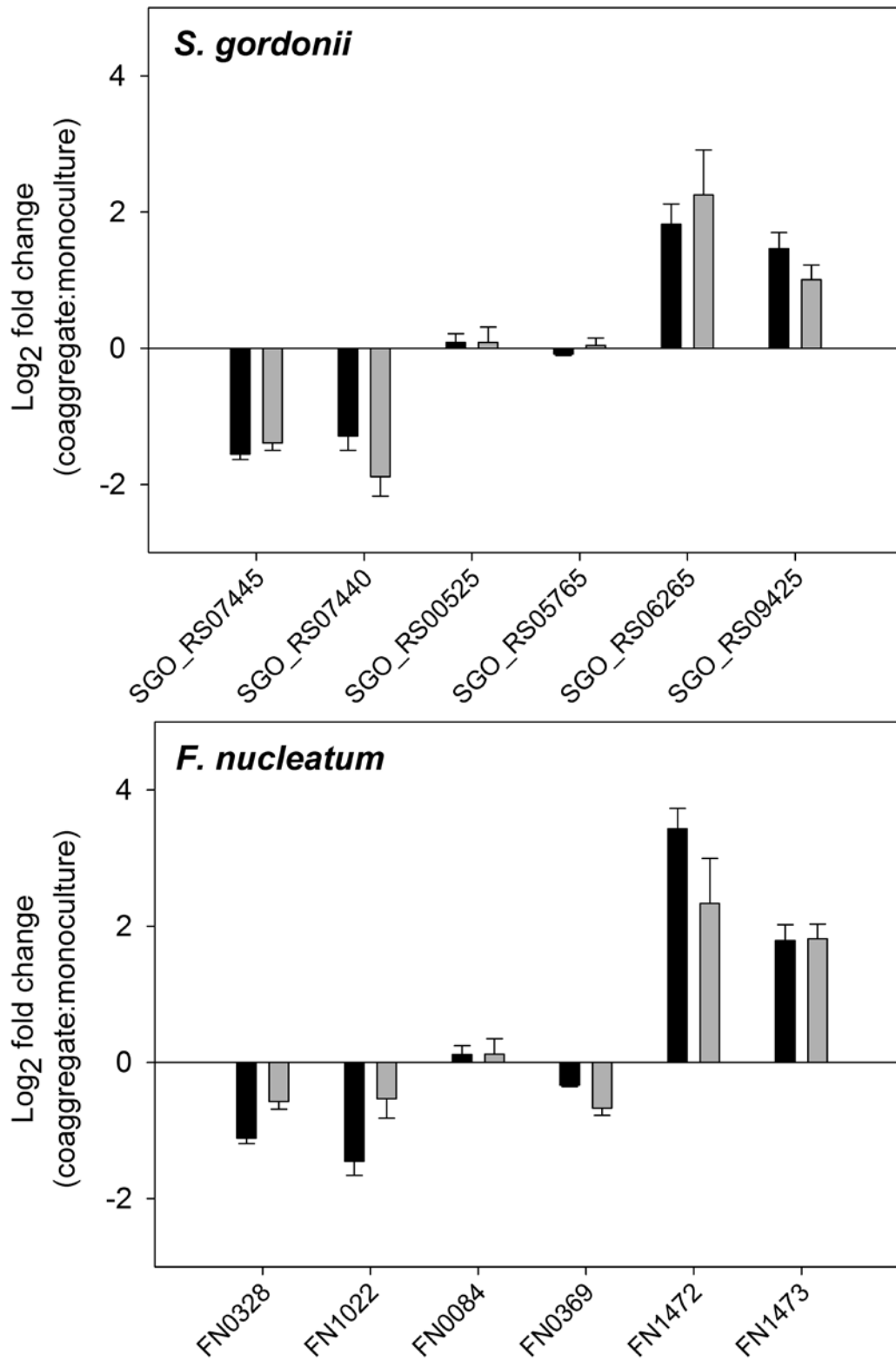


Figure 7

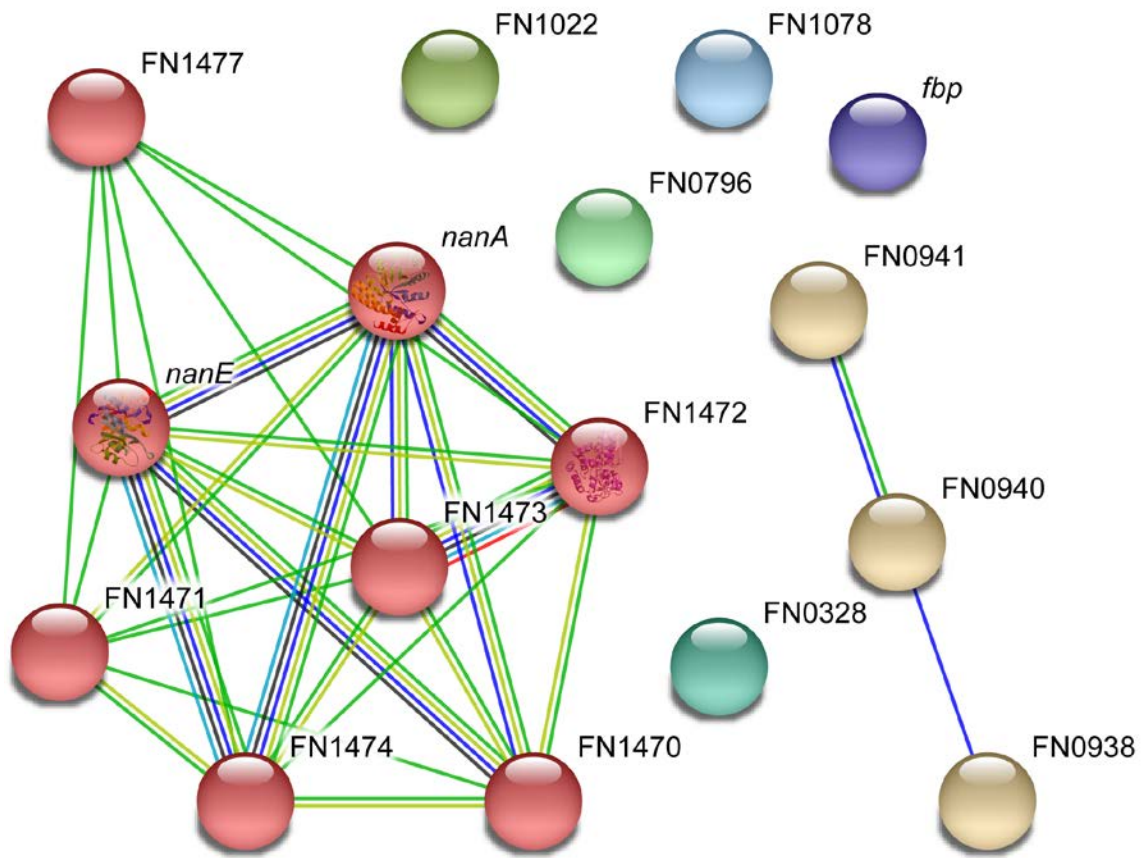


Figure 8

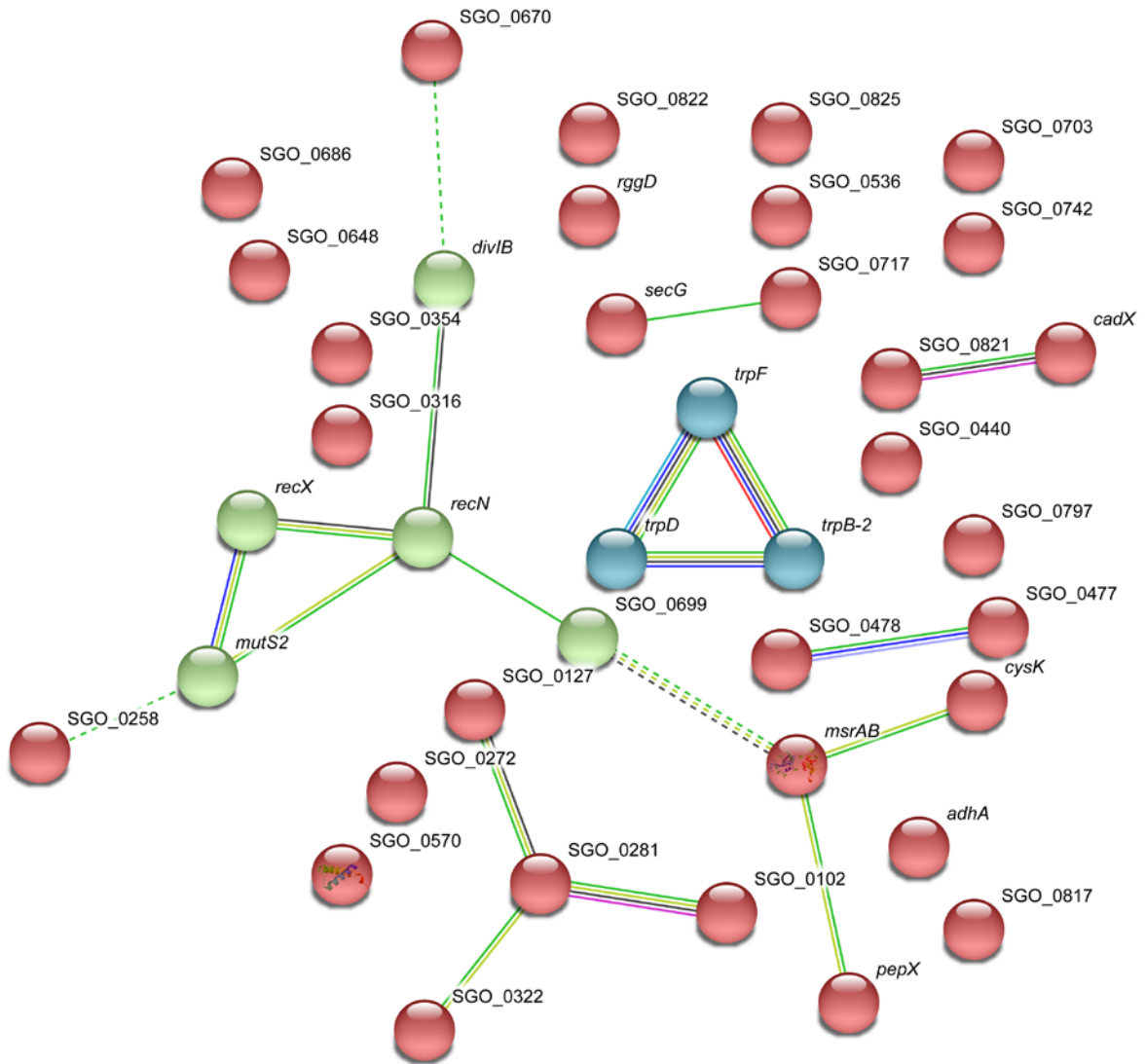


Figure 9

