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1 **Perturbations of the gut microbiome in anti-CCP positive individuals at risk of**
2 **developing rheumatoid arthritis.**

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14 **Running title:** Gut microbiome in CCP positive individuals

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22 **Abstract**

23 **Objective:** Individuals with newly diagnosed rheumatoid arthritis (RA) have a distinct
24 microbiome when compared with healthy controls. However, little is known as to when these
25 microbiome perturbations begin. Using a prospective at-risk cohort of individuals positive for
26 anti-citrullinated protein (anti-CCP) antibody with new onset musculoskeletal symptoms, but
27 without clinical arthritis, we investigated for the presence of a gut dysbiosis before the onset
28 of RA.

29 **Methods:** The gut microbiota of 25 anti-CCP positive individuals without clinical synovitis
30 were sequenced targeting the V4 region of the 16S rRNA gene. Using a publicly available
31 database, a control population of 44 individuals, approximately matched in age, gender, diet
32 and ethnicity was selected for comparison, using the same sequencing methodology. Median
33 interval between sample collection and progression to RA was 188 days. Taxonomic analysis
34 was performed using QIIME and MEGAN, and statistical analysis using R software.

35 **Results:** There were significant differences ($p=0.01$) at family level in gut microbiomes of
36 anti-CCP positive individuals versus controls. The anti-CCP positive population had an
37 overabundance of *Lachnospiraceae*, *Helicobacteraceae*, *Ruminococcaceae*,
38 *Erysipelotrichaceae* and *Bifidobacteriaceae*, amongst others. Five individuals progressed to
39 RA between sample collection and analysis. Clustering of the progressor population was
40 observed on a phylogenetic network created using a probabilistic similarity index (Goodall's
41 index).

42 **Conclusions:** Anti-CCP positive at-risk individuals without clinical synovitis appear to have
43 a distinct gut microbiome compared to healthy controls. Phylogenetic clustering was
44 observed in individuals who progressed to RA, suggesting that distinct taxa are associated
45 with the development of RA many months before its onset.

46 **Key messages**

- 47 • Phylogenetic clustering of CCP+progressors suggests microbial dysbiosis predates the
48 onset of RA by many months.
- 49 • Preserved microbial diversity between CCP+progressors and CCP+non-progressors
50 suggests diversity decreases with progression along RA spectrum.

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52 **Key words:** Gut Microbiome, Pre-Rheumatoid Arthritis, 16S rRNA Sequencing, Microbial
53 Dysbiosis

54

55 **1.Introduction**

56 Established rheumatoid arthritis (RA) is now recognised as the end point of a disease
57 continuum, encompassing a preclinical phase where genetic and environmental factors
58 interact, to initiate autoimmunity (1-3). The production of rheumatoid factor (RF) and more
59 specifically anti-citrullinated protein (anti-CCP) antibody mark the presence of systemic
60 autoimmunity (4), which may occur years before the development of clinical synovitis and
61 RA (1). The presence of circulating immunoglobulin A (IgA) anti-CCP prior to joint
62 inflammation in individuals at-risk of RA suggests that the joints are the target rather than the
63 instigator of systemic auto-antibody production (5). Additionally, serum enrichment of IgA
64 points to a mucosal driver in RA-related autoimmunity. As the gut mucosa receives a
65 constant stream of antigenic stimulation from resident microbes, it is conceivable that a
66 delicate innate immune homeostasis has evolved within the gut (6). Aberration of this
67 symbiotic state, triggered by alterations of bacterial communities (dysbiosis), can lead to
68 immune dysregulation (7). Interestingly, patients with established RA have been reported to
69 have dysbiotic microbiomes when compared with those of healthy controls (8-15), although
70 the detailed bacterial changes in such dysbiosis is still under investigation. Furthermore, the

71 question remains as to whether the dysbiotic changes observed are a cause or a consequence
72 of the underlying disease process.

73 Anti-CCP positivity combined with new arthralgia can be used to delineate those at the
74 highest risk of RA progression (5). Thus, this at-risk cohort provides a unique opportunity to
75 investigate RA disease before its onset. We have investigated using 16S rRNA sequencing
76 whether there are common changes in gut microbiomes of anti-CCP positive patients,
77 particularly in those who progress to RA onset.

78 **2. Methods**

79 **2.1 Patient and public involvement**

80 Prior to commencement of this research patients were involved in the design and feasibility
81 of this study, informing aspects of recruitment, sample return and dissemination of outputs
82 using the patient focused discussion group at Chapel Allerton Hospital, Leeds. During the
83 study period participant feedback was sought regarding the stool collection kit which was
84 subsequently refashioned.

85 **2.2 Patient selection**

86 Twenty-five anti-CCP positive individuals with nonspecific musculoskeletal symptoms and
87 without clinical evidence of synovitis on examination were included in this study.

88 Participants were selected from the Leeds CCP ‘at-risk’ cohort which has been previously
89 described (16, 17). Briefly, this cohort is recruited nationally via primary and secondary care
90 referrals of individuals presenting with new onset non-specific musculoskeletal symptoms.
91 These individuals are then tested for the presence of anti-CCP antibodies (CCP2 assay) using
92 Bioplex 2200 kit (BioRad, positive test ≥ 2.99 IU/ml). If positive for anti-CCP antibodies
93 individuals are invited to attend screening clinics at Chapel Allerton Hospital, Leeds where
94 participants are monitored for progression to RA. Individuals with inflammatory bowel

95 disease, gastrointestinal (GI) malignancy or previous GI surgery resulting in stoma formation
96 were excluded from the study. In addition, those with recent (within 3 months) antibiotic,
97 laxative or pre/probiotic use were also excluded. A comparator population of 44 healthy
98 controls was selected from a publicly available dataset (18), matched for sequencing method,
99 western diet (high consumption of proteins, saturated fats, refined grains, sugar) and
100 approximate age and gender.

101 **2.3 Stool collection**

102 20ml of stool was collected using an in-house collection kit and stored at room temperature.
103 Samples were returned to Chapel Allerton Hospital, Leeds directly by the study participants.
104 DNA was extracted and frozen at -80°C within 24hrs of stool production.

105 **2.4 DNA Extraction, Library preparation, Sequencing**

106 Faecal DNA was extracted from 200-400mg of unprocessed stool using QIAamp DNA stool
107 mini kit and stored at -80°C. PCR amplification of 16S rRNA was performed using specific
108 primer sequences for the V4 region (V4F-5'-AYTGGGYDTAAAGNG, V4R- 5' –
109 TACNVGGGTATCTAATCC) (19). Libraries were prepared using the NEBNext® Ultra™
110 DNA Library Prep Kit for illumina sequencing, as previously described (20). Sequencing was
111 performed at the University of Leeds sequencing centre using the illumina MiSeq 2500 to
112 produce 2x 250bp paired-end output. Average amplicon size was 372bp. The average quality
113 score for each read was 36, The median sequencing depth for anti-CCP positive population
114 was 88320Kb (17240 - 157193Kb) and the comparator population was 67542kb (35159 –
115 83517Kb).

116 **2.5 Diversity, composition and network analysis**

117 Adapter sequences were removed from demultiplexed FASTQ files using cutadapt (21). A
118 python script (multiple_join_paired_ends.py) from QIIME script source was used to merge

119 pair ends and subsequently converted to FASTA format. Further analysis was performed
120 using QIIME 1.8.0. (22) Operational taxonomy units (OTUs) were assigned using Usearch
121 (23), and aligned to the Greengenes reference database using PyNAST (24), Taxonomy was
122 assigned using the RDP 2.2 classifier (25). The resulting OTU 'biom' files from the above
123 analyses were imported in MEGAN (26), for group analyses, annotations and plots. Data was
124 normalised to the third lowest sequencing depth of 63,218Kb. Alpha and Beta diversity was
125 calculated using Principal Coordinate Analysis (PCoA) based on the Shannon diversity index
126 and the non-phylogenetic Bray-Curtis dissimilarity index respectively. The adonis function in
127 vegan library (27), in R (28), was used to perform a permutation MANOVA between groups.
128 Welch T test in R was used to investigate for significance between specific taxa. Network
129 analysis of anti-CCP positive, including CCP+ progressors and CCP+ non-progressors, and
130 the comparator population was created using the unrooted phylogenetic neighbour-net
131 method using Goodall's index as the output metric (29).

132 **3. Results**

133 **3.1 Population characteristics**

134 A total number of 69 individuals were included in our study, 25 anti-CCP positive at-risk
135 individuals and 44 healthy controls. Ethical approval was granted by Leeds (West) Research
136 Ethics Committee (06/Q1205/169) and samples collected after informed written consent.
137 Baseline characteristics of the both populations are outlined in table 1. In the anti-CCP
138 positive group the median antibody titre was 58.5 IU/ml (seroprevalence of anti-CCP
139 positivity in the general population is \approx 1%, (30)) with no clinical synovitis demonstrated at
140 the time of gut microbiome sampling, no anti-CCP positive individuals received DMARD
141 therapy. During the study period 5 anti-CCP positive individuals progressed to RA (CCP+
142 progressors), median time from stool collection to progression was 188 days (range 100- 457

143 days). Baseline characteristics of anti-CCP positive individuals that progressed to RA are
144 described in table 2.

145 **3.2 Diversity**

146 No change was observed in the alpha diversity using the Shannon diversity index between the
147 anti-CCP positive population and the control population, see figure 1A. Beta diversity was
148 different between anti-CCP positive patients compared to healthy controls, evidenced by the
149 distribution of the coordinates into two clusters, see figure 1B, as calculated using the Bray-
150 Curtis dissimilarity index. A permutation MANOVA between anti-CCP positive individuals
151 and controls showed significance, $p=0.01$.

152 **3.3 Gut bacterial composition**

153 Differences in bacterial taxa were noted between the anti-CCP positive population and the
154 controls, see table 3 and figure 2. The anti-CCP positive population has an overabundance of
155 *Helicobacteraceae*, *Erysipelotrichaceae*, *Ruminococcaceae* (table 3), and a lower abundance
156 of *Bacteroidaceae*, *Barnesiellaceae*, *Methanobacteriaceae* (figure 2) amongst others.

157 **3.4 Gut bacterial composition between anti-CCP positive and RA**

158 Five anti-CCP positive individuals progressed to RA (table 2). The median interval between
159 sample collection and progression was 188 days (range 100-457 days). There were no
160 significant differences between alpha (Shannon diversity) diversity Figure 1C, and beta
161 (Bray-Curtis dissimilarity index) diversity Figure 1D, between CCP+ progressors and CCP+
162 non-progressors.

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166 **3.5 Network analysis**

167 A network analysis constructed using Goodall's index demonstrated clustering of the anti-
168 CCP positive population and the healthy comparators, see figure 3. Furthermore, 4 out of 5 of
169 the progressors clustered within the same arm of the network (figure 3).

170 **4. Discussion**

171 Our results demonstrate the gut microbiome of individuals at risk of RA is significantly
172 different to that of a healthy control population. This supports the mucosal origins hypothesis
173 theory (31), where inflammation and autoimmunity begins at mucosal sites, including the gut,
174 and later transitions to involve the joints . Whilst the concept of a pre-RA dysbiosis has been
175 reported, we have shown a compositional difference in gut microbiome structure compared to
176 previous authors (32). This suggests that the mucosal origins hypothesis of RA maybe linked
177 to multiple bacterial taxa rather than a single bacterial perpetrator, a hypothesis that has been
178 suggested elsewhere (33). It is worth noting, the at-risk population investigated by Alpizar-
179 Rodriguez et al. included individuals with undifferentiated arthritis (32) (likely including
180 those with spondyloarthritis), hence representing progression of the disease phenotype
181 beyond the Leeds at-risk cohort investigated in this paper.

182 It is worth noting, while the term at risk of RA has been used, it is currently unclear whether
183 RA can be prevented or reversed at this stage. Early clinical RA may represent the endpoint
184 of a disease continuum, where individuals with genetic risk and/or environmental risk factors,
185 develop autoantibodies, and subsequently progress to develop RA. In such a situation, the use
186 of the term 'at-risk' may be more accurately replaced with 'pre-RA' but this is only possible
187 on retrospective analysis (when a diagnosis of RA has already been made, which does not
188 occur in all). Evidence from prospective anti-CCP positive observational cohorts has
189 demonstrated certain factors (smoking, obesity, early morning stiffness, raised inflammatory

190 markers, HLA, imaging) to be associated with a higher risk of progression to RA (16, 34-36).
191 Some at-risk individuals have subclinical joint inflammation on imaging (ultrasound and/or
192 MRI) without clinically-apparent arthritis. These individuals are at particularly high risk of
193 progression to clinical arthritis. These individuals may be considered a distinct group of at-
194 risk individuals with early subclinical RA, although the significance of this in terms of
195 prevention is not clear.

196 Our findings of increased *Lachnospiraceae* and *Ruminococcaceae* are in keeping with the
197 preclinical phase of arthritis observed in collagen induced arthritis rodent models (37, 38).
198 Furthermore, both *Erysipelotrichaceae* and *Helicobacteraceae*, which were also identified to
199 be enriched in our anti-CCP positive population, exhibit highly immunogenic properties
200 capable of stimulating the production of mucosal associated IgA, a key player in preclinical
201 RA (39). Previous studies have demonstrated an overabundance of *Prevotella copri* in new
202 onset RA (8), and indeed in the preclinical RA phases (32). We investigated for the presence
203 of increased *Prevotellaceae* in our anti-CCP positive cohort, but no significant difference was
204 found. These findings point towards underlying complex microbial and host interactions,
205 which in turn may create a variety of ecological niches allowing the preferential expansion of
206 certain bacterial taxa, possibly at various disease time points. Sequentially sampled
207 individuals/cohorts will be needed to explore this hypothesis.

208 Construction of the phylogenetic network using the neighbour-net method allows for the
209 combination of ordination without the restraint of hierarchical clustering imposed by
210 traditional network analysis (29). This allows for the visualisation of clusters linked by an
211 appropriate ecological index, without the need to fit the metagenomic data into a rooted
212 dendrogram. We have chosen to use Goodall's index as the input for our network analysis, as
213 it attributes increased weight to the rarer taxa present within a microbiome (40, 41), hence
214 allowing for visual differentiation between taxa that are unique to clustering samples. As our

215 study was performed prospectively, we identified 5 individuals that progressed to RA
216 following sampling. Intriguingly, 4 of these 5 individuals cluster along the same arm of the
217 Goodall's network, suggesting a role for rarer taxa in RA development. Additionally, given a
218 phylogenetic linkage was identified in those individuals that progressed, with a median
219 duration of 188 days, a potential timeline as to when a microbial impetus may begin to act
220 upon the immune system could be hypothesised. Again, a longitudinal dataset is needed to
221 determine when microbiome changes occur along the RA continuum.

222 It has been demonstrated that the gut microbiome of individuals with early RA possess
223 decreased alpha diversity when compared with healthy controls (42). This is true of many
224 autoimmune conditions, in which associations have been drawn to the gut microbiome (43,
225 44). Our study demonstrates the presence of a dysbiosis with preserved alpha diversity in the
226 preclinical phase of RA when compared with a healthy control population, and indeed
227 between progressors and non-progressors. An attractive explanation would be to assume the
228 inflammatory nature of the underlying autoimmune disease leads to an inhospitable microbial
229 environment, and thus to decreased diversity at the time of sampling, which coincides with
230 systemic inflammation related to clinically established disease. However, interval
231 microbiome sampling up to and including the point of RA onset is key to understanding the
232 changes in the gut microbiome's diversity in preclinical RA.

233 While an attempt has been made to minimise discrepancies between populations investigated,
234 we acknowledge that the use of a publicly available dataset must be interpreted with some
235 caveats, additionally, the anti-CCP, RF, HLA and smoking status of our comparator
236 population is unknown and is a limitation of this study. Also it is worth highlighting the
237 sample size of the anti-CCP positive progressor population (n=5), where phylogenetic
238 clustering may not be evident in a larger cohort. The ideal comparator dataset would include
239 longitudinal sampling of the at risk population with comparison of phenotyped progressors

240 and non-progressors, including those with genetic risk factors such as first degree relatives
241 and healthy household contacts.

242 **5. Conclusion**

243 Anti-CCP positive at-risk individuals without clinical synovitis have a different microbiome
244 when compared with healthy controls. Those at-risk individuals that progressed to RA
245 displayed clustering in a phylogenetic network suggesting a commonality of microbial taxa
246 that predates disease onset by many months. Our data underscore the need for careful
247 longitudinal sampling and analysis to understand the role of the host microbiome in RA
248 development and its potential as a target for preventative intervention.

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257 groups.

258 **Author contribution**

259 MHW, PE, KM, CMR designed the study. KM and CMR were involved in sample and data
260 collection. IBM and CMR were involved in sample processing. SM and CMR were involved
261 in data analysis. All authors were involved in writing the manuscript and approved the article
262 for publication.

263 **Data availability**

264 Raw data files will be uploaded to a repository if accepted.

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Variable	Anti-CCP positive (n=25)	Control (n=44)
Age, mean (SD)	50.5 (13.4)	42.2 (9.61)
Age, range	21 - 78	
Female (%)	19 (76)	37 (84%)
Anti-CCP, median	58.5 IU/ml	-
Rheumatoid factor positive	11 (44)	-
Shared epitope (%)	12 (48)	-
Early morning stiffness >30mins	6 (24)	NA
Clinical evidence of synovitis	0	NA
Joint tenderness (%)	10(40)	NA
Smoking status (%)	15(60)	-
History of vegetarian diet (%)	3 (12)	9 (20)

387 **Table 1. Participants characteristics.** Shared epitope was considered positive with presence
388 of one or two copies of HLA-DRB1*01, DRB1*04 or DRB1*10 in the HLA-DRB1 locus.
389 Evidence of early morning stiffness was patient reported. Clinical synovitis and joint
390 tenderness (small joints) was determined on examination by clinically qualified personnel.
391 Smoking status included current or ex-smokers.

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Variable	CCP+P1	CCP+P2	CCP+P3	CCP+P4	CPP+P5
Age	46	52	71	46	56
Gender	Female	Female	Female	Male	Female
CCP titre, IU/ml	147	300	167	300	7.8
Shared epitope	Positive	Negative	Negative	Negative	Positive
Early morning stiffness >30mins	Yes	No	No	No	No
Joint tenderness	Yes	No	Yes	No	Yes
Smoking status	Positive	Positive	Positive	Negative	Negative
History of vegetarian diet	No	No	No	No	No

395 **Table 2. Anti-CCP positive progressor population characteristics.** Baseline characteristics
396 for the five anti-CCP positive individuals that progressed (P) to RA; CCP+P1-P5. Shared
397 epitope was considered positive with presence of one or two copies of HLA-DRB1*01,
398 DRB1*04 or DRB1*10 in the HLA-DRB1 locus. Evidence of early morning stiffness
399 (minutes) was patient reported. Joint tenderness (small joints of the hands and feet) was
400 determined on examination by clinically qualified personnel. Smoking status included current
401 or ex-smokers. Dietary status was patient reported.

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Rank	Taxa: Family	P value	Taxa: Genus	P value
1	Helicobacteraceae	5.00E-06	Coproccoccus	1.61E-05
2	Erysipelotrichaceae	3.98E-05	Oscillospira	2.49E-05
3	Ruminococcaceae	0.001676261	Lachnospira	0.000716319
4	Peptostreptococcaceae	0.002489999	Absiella	0.00096231
5	Bifidobacteriaceae	0.008222693	Roseburia	0.003524867
6	Gracilibacteraceae	0.009301412	Allobaculum	0.004513859
7	Planococcaceae	0.011158723	Faecalibacterium	0.00484119
8	Deferribacteraceae	0.012880422	Bifidobacterium	0.008167057
9	Victivallaceae	0.014814023	Mucispirillum	0.012880422
10	Lachnospiraceae	0.022368412	Helicobacter	0.021448002
11	Peptococcaceae	0.046105165	Flexispira	0.036367237
12			Oxobacter	0.04149263
13			Gracilibacter	0.044984211
14			Peptococcus	0.048977148

408 **Table 3. Welch T Test at family level between CCP positive individuals and control**
409 **population.** Table showing taxa that were significantly enriched in the anti-CCP positive
410 population (including the RA progressors) when compared to control population.

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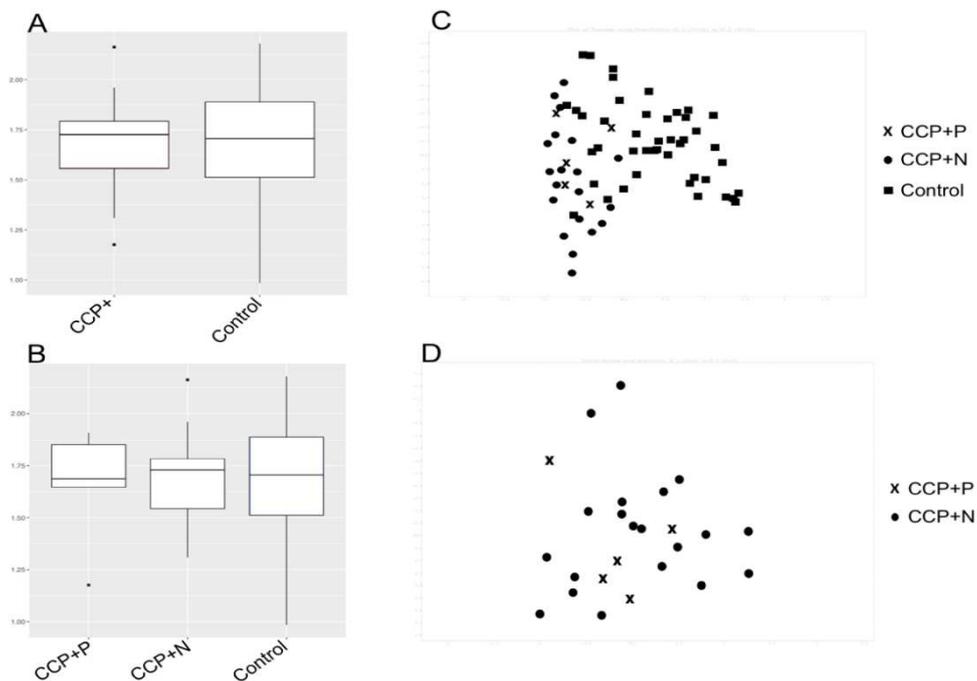
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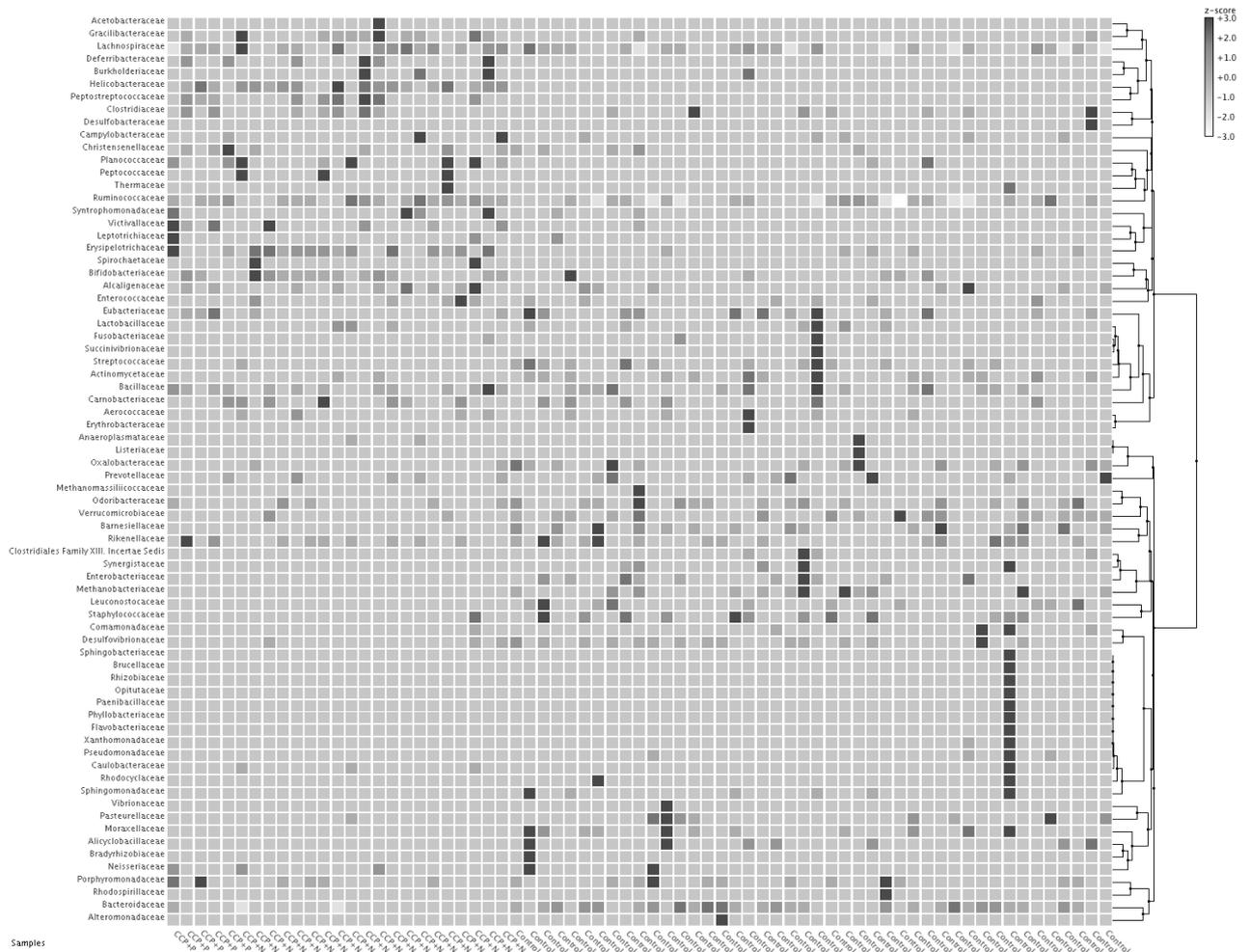
417 **Figure 1**



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419 **Figure 1. Microbiome diversity analysis.** CCP+: Anti-CCP positive population, including
420 CCP+ progressors and CCP+ non-progressors. CCP+P: CCP+ progressor, CCP+N: CCP+
421 non-progressor. **Figure 1A: Box plot of alpha diversity using Shannon diversity index.**
422 Solid dots represent gut microbiomes outlying the interquartile range. **Figure 1B: Box plot of**
423 **alpha diversity using Shannon diversity index.** No significant change in diversity between
424 **Figure 1C: Principal Coordinate Analysis (PCoA) of beta diversity using Bray-Curtis**
425 **dissimilarity index.** Two distinct populations are noted; the anti-CCP positive population
426 (including CCP+ progressors and CCP+ non-progressors) and the control population. **Figure**
427 **1D: PCoA of beta diversity using Bray-Curtis dissimilarity index.** No clustering of the
428 CCP+ progressor population is noted within the PCoA plot.

429 **Figure 2**



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431 **Figure 2. Heat Map.** Heat Map clustered by sample and by taxonomy at family level.

432 CCP+P: CCP+ progressor, CCP+N: CCP+ non-progressor. Colour intensity of cells represent

433 accompanying Z score.

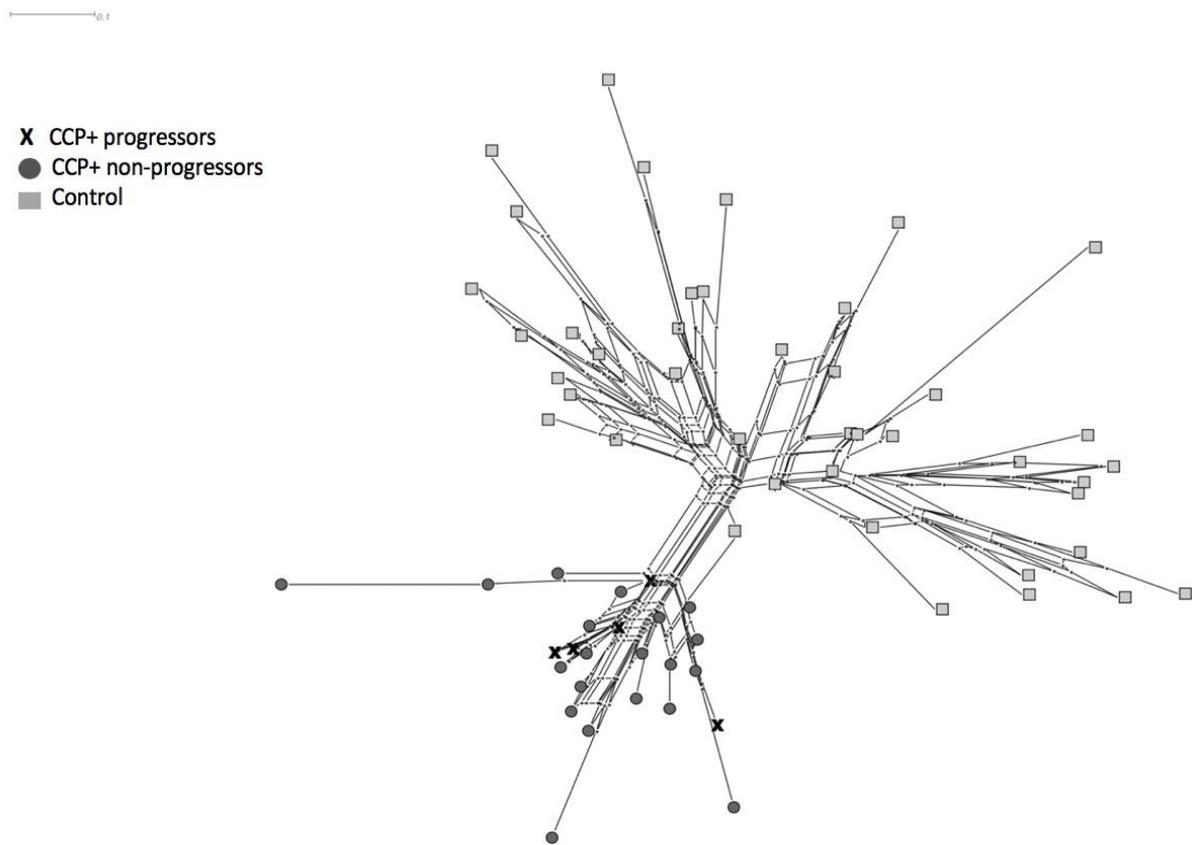
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438 **Figure 3**



439 **Figure 3. Phylogenetic network.** Non-hierarchical phylogenetic network created using
440 Goodall's index via the neighbour-net method. Each terminal node, represented by a different
441 shape, indicates an individual's gut microbiome. Note 4 out of 5 progressors are united on a
442 single arm of the network.

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