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# 45 **Introduction**

46 Emerging infectious diseases, coupled with rising antibiotic resistance, are a threat to global qublic health.<sup>1</sup> The diversity of pathogens that can cause illness necessitates pathogen detection 48 methods that can identify multiple genetic targets. There is a need for low-cost, multi-target, 49 detection methods, especially in regions where the burden of infectious diseases is high, 50 resources are constrained, and there is a high diversity in the pathogens that are present.

A high burden of diarrheal illness exists in low- and middle-income countries (LMICs).2 51 The 52 types of enteric pathogens (bacteria, virus, protozoa, helminths) present in LMICs contributing to disease are geographically diverse and location specific.<sup>3–5</sup> As an example of geographic 54 diversity, previous studies used highly parallelized quantitative polymerase chain reaction (qPCR) to survey a wide range of pathogens around the world.6 55 In Mozambique, *Shigella* spp. 56 and *Giardia* spp. were the most prevalent pathogens whereas *Campylobacter* spp*.* and *Giardia* 57 spp. dominated infections in children across eight other settings in South America, sub-Saharan 58 Africa, and Asia.<sup>3,5</sup>

59 The need for multi-target detection assays is not limited to LMICs. In high-income countries 60 (HICs), respiratory illnesses are common and diarrheal illnesses predominate through foodborne 61 outbreaks.<sup>7,8</sup> Characteristically, urban areas in HICs have sewered sanitation systems, which 62 allow for active monitoring of the infectious disease burden through wastewater-based epidemiology (WBE).<sup>9</sup> As an early example, Poliovirus was isolated from wastewater samples as 64 part of the World Health Organization's Global Polio Eradication Initiative (GPEI) to monitor 65 for emergence/reemergence of the virus.<sup>10–12</sup> Recently, SARS-CoV-2 was monitored in wastewater at ≈14,000 sites in 59 countries in March 2021.<sup>13</sup> These latest efforts rely on methods such as qPCR and digital PCR (dPCR) to determine the level of infections in a population.<sup>14–16</sup>

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68 Looking beyond the COVID-19 pandemic, monitoring programs are eager to expand 69 surveillance to include enteric pathogens, other respiratory viruses, sexually transmitted  $\frac{17}{20}$  infections, arboviruses, and antimicrobial resistance.<sup>17</sup> However, expanding the range of targets 71 for surveillance is both labor-intensive and costly, underscoring the urgent need for new multi-72 target capabilities that can efficiently and affordably address this challenge.

73 Complementing WBE efforts, other environmental surveillance strategies are premised on 74 the environment (e.g., soil, water, air, fomites) serving as an intermediary between infected hosts.<sup>18</sup> 75 Environmental detection can facilitate surveying disease burden. For example, a study in 76 Kenya found that positive detection of helminths (*Ascaris lumbricoides*, *Trichuris trichiura*, and 77 *Necator americanus*) in a household's soil was significantly associated with cases of helminth infections of household members.<sup>19</sup> As a result, qPCR-based surveillance of helminths in soil is a 79 promising alternative to more invasive stool-based surveillance.

80 Environmental detection is also used for determining dominant transmission pathways of 81 pathogens. During the COVID-19 pandemic, studies sampled fomites using qPCR for SARS-82 CoV-2 RNA and concluded that fomites were unlikely to be a dominant transmission 83 bathway.<sup>20,21</sup> Similar methods have been proposed to survey the burden of antimicrobial resistance across the globe by sampling soil and water.<sup>22–24</sup> To expand the scale and scope of 85 environmental surveillance, highly multiplexed detection assays that can capture the diversity of 86 possible microbial threats of interest are needed. Despite this pressing need, methods for multi-87 target detection generally fall short in achieving meaningful reductions in assay cost, 88 necessitating a more selective approach in deciding which targets to prioritize in monitoring, 89 surveillance, and detection efforts.

90 PCR-based multi-target detection strategies are typically limited by the number of targets that 91 can be simultaneously amplified and identified. In conventional multiplexed PCR amplification,

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92 increasing the number of targets increases the likelihood of off-target reactions (e.g., primer 93 dimer formation, non-specific amplification product). These off-target reactions result in reduced sensitivity or assay failure.<sup>25</sup> Further, highly multiplexed PCR assays tend to have a narrow 95 tolerance for changing reaction conditions and sample composition. For example, adding primers 96 for new targets to an established multiplexed assay can result in primer cascading failure. 97 Performing an assay in highly heterogeneous sample matrices, such as environmental DNA 98 extracts, can also reduce PCR efficiency and result in false negatives. Additionally, multiplexed 99 fluorescence-based detection assays, such as qPCR, are typically constrained (up to 5 targets) by  $100$  the limited orthogonality of fluorescent reporter dye spectra.<sup>26</sup>

101 Other detection technologies have approached the 'many-target' problem by scaling down 102 reaction volumes and parallelizing reactions in microfluidic devices.<sup>27</sup> One widely used 103 commercial platform, the TaqMan<sup>TM</sup> Array Card (TAC), parallelizes qPCR reactions into micro-104 scale (≈1.5  $\mu$ L) reactions.<sup>28</sup> Even with this compartmentalization, qPCR and dPCR-based 105 platforms still encounter significant challenges in scaling and accessibility due to the high capital 106 costs of equipment, high variable costs for consumables, and the substantial cost and personnel 107 time required for adding additional targets. To achieve highly multiplexed detection, beyond 108 what is accessible with qPCR and dPCR, alternative solutions are needed.

109 Research in synthetic biology has produced various non-standard nucleotides that can be 110 used to circumvent major obstacles associated with scaling multiplexed PCR amplification to 111 larger '*n*'-plex reactions (**Figure 1**). The non-standard nucleic acids from the Self-Avoiding 112 Molecular Recognition Systems (SAMRS: A\*, T\*, G\*, and C\*) are structurally modified 113 versions of the standard DNA nucleobases (A, T, G, and C).<sup>29</sup> Though structurally distinct, 114 SAMRS nucleobases maintain an ability to base pair with standard DNA nucleobases **(Figure**  115 **1c**) but not with their SAMRS complement. For nucleic acid amplification, primers modified

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116 with SAMRS components anneal and amplify natural DNA/RNA. Conversely, formation of 117 SAMRS:SAMRS pairs (T\*:A\* and C\*:G\*, **Figure 1d**) are thermodynamically disfavored. In 118 amplification assays with SAMRS-containing primers, this results in a decrease in off-target 119 primer-primer interactions. Selectively inserting SAMRS bases into primer sequences has been shown to reduce primer dimer formation and increase multiplexed assay sensitivity.<sup>30,31</sup>

121 Additionally, non-standard nucleic acids from the Artificially Expanded Genetic Information 122 System (AEGIS) can be used to improve primer binding specificity.<sup>32</sup> AEGIS nucleotides (Z:P) 123 pair, **Figure 1b**), such as Z (6-amino-5-nitro-3-(1′-β-d-2′-deoxyribofuranosyl)-2(1H)pyridine) 124 and P (2-amino-8-(1′-β-d-2′-deoxyribofuranosyl), can form highly-specific base pairs *orthogonal* to the standard, natural set (T:A and C:G).<sup>33,34</sup> Since AEGIS bases are not found in nature, primers 126 containing AEGIS nucleotides can be used to amplify template targets containing 127 complementary AEGIS sequences while avoiding off-target amplification.<sup>35</sup>



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129 **Figure 1. Structures and hydrogen-bonding interactions for standard DNA, AEGIS, and**  130 **SAMRS nucleobases.** (**a**) Structures of standard DNA hydrogen bonding base pairs. (**b**) 131 Structures of Z and P AEGIS bases that form base pairs orthogonal to the standard DNA bases. 132 (**c**) SAMRS bases (\*) form base pairs with their natural standard DNA complements. (**d**) The 133 strategic removal of hydrogen bonding groups hinders SAMRS bases from base pairing with 134 their SAMRS complement. Dotted lines indicate hydrogen bonding between base pairs, and 135 curved lines indicate a lack of hydrogen bond formation between base pairs.

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136 Various detection assays have been developed that leverage properties of SAMRS and 137 AEGIS bases for viral pathogen detection, including arboviruses (e.g., Zika, Dengue, 138 Chikungyunya), $36,37$  coronaviruses (e.g., RSV, MERS-CoV, Influenza A/B, SARS-CoV- $2$ ,<sup>38,39</sup>human papillomavirus (HPV),<sup>40</sup> and norovirus.<sup>41</sup> Despite proving utility of SAMRS and 140 AEGIS nucleobases in assay design, these assays were either non-multiplexed or multiplexed but 141 required an expensive strategy for target readout (XMAP Luminex array detection).

142 In this work, we develop an '*icosaplex*' (20-plex) PCR-based sequencing assay able to detect 143 20 enteric pathogen and antimicrobial resistance gene targets. This 20-plex assay greatly expands 144 on prior work that targeted viruses to new pathogens (bacteria, protozoa, and helminths) and to 145 environmental sample types. The 20-plex assay amalgamates individual primer sets for 20 146 targets from a previous collection of work and achieves effective multiplexing by incorporating 147 SAMRS-AEGIS nucleotides into primers chosen for biological reasons. To circumvent the target 148 identification limitations of PCR, we leveraged nanopore sequencing (Oxford Nanopore 149 Technologies), a third-generation sequencing method that is inexpensive, portable, and can 150 provide sequencing results in real time. This study is the first to use SAMRS-AEGIS primers for 151 highly multiplexed PCR in combination with nanopore sequencing for microbial surveillance 152 applications. Sequencing information provides additional insight into gene alleles and subspecies 153 that would otherwise be missed through presence/absence methods. The target panel and 154 detection method were chosen for application areas in environmental detection and surveillance 155 efforts in resource constrained settings, such as LMICs. We benchmarked performance of the 20- 156 plex assay in three sample matrices: wastewater, soil, and human feces.

- 157 **Results and Discussion**
- 158 **Pathogen and Antimicrobial Resistance Gene Target Selection**

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159 We developed a multiplexable assay that can detect a broad range of microbial threats 160 relevant to global health. We chose 20 genes of interest that encompass a wide range of 161 enteropathogens (bacteria, protozoa, and one helminth) and two clinically important 162 antimicrobial resistance genes (ARGs) (**Table 1**). QPCR assays for these 20 targets have 163 previously been reported (**Table S1)**.

164 Twelve of our targets are genes specific to pathogenic *E. coli.* These represent five of the 165 major pathogenic *E. coli* subtypes and *Shigella* spp*.* In LMICs, pathogenic *E. coli* is a leading 166 cause of diarrheal illness.<sup>5,42,43</sup> The enterotoxigenic *E. coli* (ETEC) subtype is associated with moderate-to-severe diarrhea which can lead to additional severe clinical outcomes.<sup>43</sup> LMICs also 168 experience a high incidence of soil-transmitted helminth infections.<sup>44</sup> It is estimated that  $738$ 169 million people globally are infected with helminths of the genus *Ascaris*.<sup>45</sup> In HICs like the 170 United States, *Campylobacter* spp., non-typhoidal *Salmonella*, *Shigella* spp., and *Giardia intestinalis*, are leading causes of reported foodborne illnesses.<sup>46</sup> In both LMICs and HICs, 172 pathogenic bacteria pose an even larger threat to human health if they acquire antimicrobial 173 resistance activity. *Bla<sub>NDM</sub>* and *mcr-1* are globally distributed ARGs that confer resistance to the last line of defense antibiotics reserved for difficult-to-treat infections.<sup>47,48</sup> Many of the 20 gene 175 targets chosen in our panel were used by other studies to detect pathogens and ARGs in human 176 feces,  $3.6$  wastewater,  $49$  and environmental samples.  $50-52$ 

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178 **Table 1. Enteric pathogen and antimicrobial resistance gene panel in the 20-plex assay.** The 179 20-plex assay is designed to detect 18 enteropathogen genes and two antimicrobial resistance 180 genes. Amplicon lengths for each PCR product are reported.



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#### 182 **Design and validation of 20-plex primers**

183 Primer sequences from previously reported PCR and qPCR assays for the 20 gene targets 184 were used as a starting point for 20-plex PCR primer design (**Table S1**). Initial 40 primer 185 sequences (1 forward, 1 reverse for each gene target) were chosen to accommodate a single 186 annealing temperature (60 °C) during PCR cycling. At these temperatures and at a high relative 187 abundance of primer to target, various cross-primer interactions can occur to form primer dimers 188 and off-target amplicons, each reducing assay sensitivity (**Figure 2a**). To combat primer dimer 189 formation (**Figure 2b**), we modified all 40 standard DNA primers with SAMRS nucleobases 190 using the PrimerCompare software developed at the Foundation for Applied Molecular 191 Evolution (FfAME). PrimerCompare took standard DNA primer sequences that have proven 192 targets, primer concentrations, salt concentrations, and thermodynamic parameters (maximum <sup>193</sup>ΔG for hairpins and dimers) as inputs to simulate potential primer-primer interactions. These 194 interactions include self-dimerization, cross-primer dimerization, and hairpin structures.

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207 attachment of sequencing adapters (**Table S2**). To avoid off-target amplification, 5′-overhang tag 208 sequences should be distinct from sequences that could be present in samples of interest. The 209 generalized design of a 5′ -overhang tag, however, is challenging due to the unknown 210 metagenetic composition of many sample matrices (e.g., wastewater, soil, surface water, fomites, 211 feces). We overcame this obstacle by introducing non-standard AEGIS **P** nucleobases into the 5′ 212 -overhang tag. Since AEGIS bases form a highly specific orthogonal base pair to the standard 213 DNA bases (**Z:P**, **Figure 1b, Figure 2d**), AEGIS containing primers should solely bind to 214 complementary AEGIS-tagged regions.

215 Various design choices were made to minimize design complexity and reagents that 216 would be required for performing multiplexed assays that use AEGIS components. First, the 217 AEGIS tag sequences used a 5-letter alphabet composed of the standard DNA bases (A, T, G, C) 218 and one of the AEGIS bases (P). In amplification reactions, end-users would therefore only need

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219 access to complementary nucleotide triphosphate, dZTP, rather than both dZTP and dPTP. 220 Second, we chose to use a single AEGIS tag sequence for both forward and reverse primers. We 221 previously observed that using a single tag sequence in multiplexed PCR reactions reduced 222 overall primer dimer formation and increased detection sensitivity (data not shown). The final 223 AEGIS tag sequence (AGC**P**CTCG**P**TTC) was selected due to low propensity for hairpin 224 formation, as determined computationally. This AEGIS tag sequence is appended to the 5′-end of 225 the 40 SAMRS-containing primers used in this work (**Table S2**).

226 To multiplex samples, we then created 10 unique barcoding primers that contained a 24- 227 nt barcode region using sequences from an Oxford Nanopore Technologies barcoding kit. These 228 barcoding primers contained the barcode sequence and a downstream region homologous to the 229 common 5′-tag of the 20-plex SAMRS-AEGIS primers (**Table S3**). The universal 5′ AEGIS tag<br>230 thus serves as the priming region for the barcoding primers either in the same PCR reaction (one-230 thus serves as the priming region for the barcoding primers either in the same PCR reaction (one-231 pot amplification) or a subsequent PCR reaction (sequential amplification, **Figure 2e**). Though 232 barcoding primers discussed in this work were designed to be compatible with Oxford Nanopore 233 demultiplexing workflows, a similar design strategy can be used for barcoding applications on 234 other sequencing platforms (**Table S3**).

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236 **Figure 2. Role of SAMRS and AEGIS nucleotides in multiplex PCR design.** (**a**) Standard 237 DNA primers in a PCR reaction can dimerize and cross prime, consuming available primers and 238 dNTPs. (**b**) SAMRS bases can be inserted in primer sequences to avoid primer dimer formation. 239 (**c**) PCR amplification of all 20 targets using synthetic templates in nuclease-free water using 240 standard DNA or SAMRS primers shows standard DNA primer dimerization, particularly 241 prominent when no template is present (**Figure S3, Table S2-S6)**. SAMRS primers show no 242 visible dimerization. (**d**) The first round of amplification in our SAMRS-AEGIS 20-plex reaction 243 uses primers containing SAMRS bases in the target-binding region, and the AEGIS P base in an 244 overhang tag region. The corresponding Z triphosphate (dZTP) is included during amplification. 245 (**e**) The second amplification reaction uses primers containing the AEGIS P base to bind to the 246 tag region added during the first round. These primers also contain 24-nt barcode overhangs. 247 Here, the AEGIS bases prevent non-specific amplification due to their lack of pairing with 248 standard DNA bases. After this second PCR amplification, samples are purified, pooled, and 249 prepared for next-generation sequencing.

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#### 251 **Optimization of a sequential 'two-step' 20-plex PCR reaction**

252 A unique challenge of multiplexing in complex samples of unknown metagenomic 253 composition is that gene targets are not present in equimolar amounts. For certain sample types, 254 targets in the same sample could be present at gene copy numbers that vary by orders of 255 magnitude. If barcoding and target amplification occur in one reaction, rather than sequentially, 256 higher abundance targets will bias amplification and consume barcoding primers, reducing assay 257 sensitivity for lower abundance targets. We tested this hypothesis by performing both one-pot

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258 and sequential amplification of two targets using synthetic templates, stx2 (present at 10 or  $10^2$ ) copies/ $\mu$ L) and aaiC (10<sup>4</sup> or 10<sup>5</sup> copies/ $\mu$ L). When compared to one-pot PCR, performing 260 barcoding in a separate PCR reaction (sequential PCR) decreased differences in abundances of 261 stx2 and aaiC amplicons (**Figure S4**).

262 Subsequently, PCR optimization was used to identify optimal reaction and cycling 263 conditions. For the optimal number of cycles in each step, we found 40 cycles (as is used for 264 qPCR) during the first round of amplification followed by 15 cycles in the second round for 265 barcoding minimized amplification bias and maximized barcoded targets over other 266 combinations tested (**Figure S4, S5**). In the first round of PCR, we found a uniform 267 concentration of each primer  $(0.2 \mu M)$  of each primer, 8  $\mu$ M total primer) minimized observed 268 amplification bias (**Figure S6**). Under these optimized 20-plex PCR reaction and cycling 269 conditions, primer dimers were still observed with standard DNA primers, but not with SAMRS-270 AEGIS primers (**Figure S7**).

271 Finally, we incorporated nanopore sequencing, a low capital cost, portable sequencing 272 platform, as a read-out for detection of the SAMRS-AEGIS 20-plex reaction. Amplification was 273 performed on the 20 synthetic template mixtures at two initial concentrations for each target: 10 274 and  $10^4$  copies/ $\mu$ L. Samples were sequenced on a MinION flow cell, basecalled, and 275 demultiplexed. All 20 targets were detectable by nanopore sequencing at initial template concentrations of 10 and  $10^4$  copies/ $\mu$ L (**Figure S8, S9, Table S6**). In both reaction conditions, 277 less reads were observed for three assay targets: stx1, STh, aatA. Though additional optimization 278 (e.g., adjusting primer concentrations) could be performed to improve relative amplification of 279 these three targets, many factors in environmental samples that cannot be controlled likely play a 280 larger role in determining differential amplification. For example, the absolute and relative

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281 abundance of each target in real samples cannot be optimized. For design simplicity, we opted to 282 continue with equimolar SAMRS-AEGIS primer concentrations.

283 As designed, this SAMRS-AEGIS 20-plex PCR reaction overcomes challenges that must 284 be addressed for sensitive detection of multiple targets in environmental samples. Pathogen and 285 antimicrobial resistance genes can be in low abundance,<sup>52–54</sup> necessitating modifications that 286 avoid primer dimerization. Inclusion of 1-3 SAMRS nucleotides in the seed region of the 20-plex 287 PCR was effective at eliminating detectable primer dimer formation as seen by both gel 288 electrophoresis and qPCR-based melting curve analysis. Target species in environmental  $289$  samples are often differentially abundant and many times orders of magnitude different.<sup>54</sup> We 290 performed two PCR reactions sequentially - Reaction 1 uses 40 cycles to detect low abundance 291 species or amplicons with low amplification efficiency, while Reaction 2 uses AEGIS 292 nucleotides to introduce 24-nt sample barcodes for nanopore sequencing in order to minimize 293 background, non-specific amplification. With equimolar amounts of all SAMRS-AEGIS primers, 294 this workflow was sensitive enough to detect all 20 targets using synthetic templates at 10 295 copies/ $\mu$ L for each target by nanopore sequencing.

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#### 297 **20-plex assay performance in environmental samples**

298 Previously, we hypothesized that AEGIS nucleotides in the primers could help avoid 299 non-specific 'background' amplification in environmental samples. To test this hypothesis, we 300 compared the sequencing outputs of the 20-plex assay using SAMRS-AEGIS primers to standard 301 DNA primers, in three sample types: wastewater, soil, and human feces (**Figure S10-S14, Table**  302 **S7-9**). Nanopore sequencing reads were demultiplexed and binned into one of four categories: 303 (1) fully map to target; (2) partially map to target; (3) map to primer regions, but not target; (4) 304 unmapped. For all sample types, the SAMRS-AEGIS 20-plex assay had significantly more reads

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305 align to targets and fewer reads mapping to only primer regions compared to standard DNA 20- 306 plex assay (**Figure 3**). Though variations between sample matrices were readily observable, the 307 SAMRS-AEGIS 20-plex assay had between 1.8 – 7.5 times more read alignments to the full-308 length targets compared to reads derived from the standard DNA 20-plex assay. Conversely, the 309 standard DNA 20-plex assay resulted in an average of 2.4 – 4 times more reads aligning only to 310 primers, but not target, compared to reads from the SAMRS-AEGIS 20-plex assay.

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312



313 **Figure 3. Outcome of nanopore reads in SAMRS-AEGIS and standard DNA 20-plex assays**  314 **in wastewater, soil, and fecal matrices.** Read mapping fractions for each sample, separated by 315 sample matrix type: (a) wastewater ( $n = 10$  SAMRS-AEGIS;  $n = 9$  standard DNA), (b) soil ( $n =$ 316 10 SAMRS-AEGIS;  $n = 8$  standard DNA), and (**c**) fecal ( $n = 10$  SAMRS-AEGIS,  $n = 3$  standard 317 DNA). For each sample, reads are binned into one of four categories: "Target (full)" = aligns to 318 full target sequence with at least 95% coverage; "Target (partial)" partially aligns to target 319 sequence with < 95% coverage; "Primer" maps to primer regions (priming site, barcode) but not 320 full target; "None" none of the prior bins. Fractions of reads within each sample that fall into 321 each bin are plotted (points) with boxplot overlayed to show the distribution of fractions 322 observed across each sample type-assay combination. Reads mapping to G18S, LT, and ipaH 323 were excluded from this analysis as they were detected in the NTC of the standard DNA 20-plex assay. Box shows interquartile range  $(25<sup>th</sup>$  to  $75<sup>th</sup>$  percentiles) with the median and whiskers 325 extending to 1.5 times the interquartile range.

326

327 The observed increase in on-target alignment of the SAMRS-AEGIS 20-plex assay

- 328 highlights the importance of non-standard nucleotides as an indispensable component of this 20-
- 329 plex assay. Reads aligning to only primers constituted the majority of reads from the standard
- 330 DNA 20-plex assay. Reads in this category constitute a mixture of off-target products, including

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331 non-specific amplicons of environmental DNA and primer dimers. Two purification steps 332 involved in preparing the nanopore sequencing library involve steps that partially remove primer 333 dimers that would have been present. As such, a lower fraction of read in the 'map to primer 334 only' category could be traced to primer dimers. For sequencing-based detection, the sensitivity 335 of this assay is dependent on sequencing depth. Minimizing wasted sequencing effort on off-336 target amplicons is critical for minimizing assay costs since it allows users to multiplex more 337 samples per sequencing flow cell.

338

## **Comparison between 20-plex assay and parallelized detection with TaqMan<sup>TM</sup> Array Cards**

340 To evaluate the performance of the SAMRS-AEGIS 20-plex assay against an established 341 method (**Figure 4a**), we compared assay results obtained from the 20-plex assay to those from  $T^{\text{max}}$  TaqMan<sup>TM</sup> Array Cards (TAC). TAC assays are qPCR-based and use a highly parallelized 343 architecture to detect multiple targets. Due to their convenience, sensitivity, and potential for 344 semi-quantitative detection, TAC assays are widely used in diagnostic and environmental surveillance settings.<sup>6,51</sup> Unlike the SAMRS-AEGIS 20-plex, TAC assays also require a 346 fluorescent probe for target identification. Both assays allow for sample multiplexing, with TAC 347 assays limited to eight samples per card. For these comparisons, 10 samples from the SAMRS-348 AEGIS 20-plex reactions were multiplexed in a single MinION nanopore sequencing flow cell.

349 Comparing target detection between TAC and the SAMRS-AEGIS 20-plex assay, we 350 observed a 74% PPA (positive percent agreement) and a 97% NPA (negative percent agreement) 351 between these two methods (**Figure 4b**). Among the discrepancies, 13 out of 63 cases involved 352 targets detected by TAC but not by the SAMRS-AEGIS 20-plex assay, while 50 out of 63 cases 353 involved targets detected by the SAMRS-AEGIS 20-plex assay but not by TAC (**Figure 4b-e**). 354 To confirm the read-to-target assignments in the SAMRS-AEGIS 20-plex assay was not due to

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355 mapping error or improper demultiplexing, reads were aligned against reference sequences and 356 manually inspected for processing errors. All 50 targets identified in the SAMRS-AEGIS 20- - 357 plex assay, but not in the TAC assay, could be fully mapped to properly barcoded reads. . 358 Additionally, no reads in the no-template controls (NTCs) for the SAMRS-AEGIS 20-plex assay 359 could be mapped to assay targets.

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Figure 4. Comparison between SAMRS-AEGIS 20-plex assay and TaqMan<sup>TM</sup> array cards 363 **(TAC) in wastewater, soil, and fecal matrices.** (**a**) The SAMRS-AEGIS 20-plex assay uses a 363 (TAC) in wastewater, soil, and fecal matrices. (a) The SAMRS-AEGIS 20-plex assay uses a highly multiplexed architecture for multi-target detection, while TAC uses a highly parallelized 365 architecture. TAC and SAMRS-AEGIS 20-plex assays were run on 30 environmental samples 366 (10 wastewater, 10 soil, 10 fecal). (**b**) Total assays positive (+) and negative (-) for TAC and 367 SAMRS-AEGIS 20-plex. Percent positive agreement (PPA) and percent negative agreement 368 (NPA) shown. Individual assays positive and negative for TAC and SAMRS-AEGIS 20-plex in in 369 (**c**) wastewater, (**d**) soil, and (**e**) fecal samples. Square color indicates assay result, following the he 370 color coding used in the total assay result matrix. The TAC *mcr-1* assay was not available for 371 fecal samples.



373 These results provide evidence that the SAMRS-AEGIS 20-plex has sensitivity in the he 374 tested environmental sample matrices similar to TAC; for certain targets, the SAMRS-AEGIS tested environmental sample matrices similar to TAC; for certain targets, the SAMRS-AEGIS<br>
20-plex may be more sensitive. One possible reason for the observed differences by method is 376 the assayed template input: TAC uses a maximum of 21 ng template per singleplexed well, while

the assayed template input: TAC uses a maximum of 21 ng template per singleplexed well, while<br>377 the 20-plex assay uses a maximum of 100 ng template in the first round of PCR. Another

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383 We next asked whether additional information is provided by the sequencing data 384 obtained from the SAMRS-AEGIS 20-plex assay. For each sample and each positive gene target 385 with at least 10 mapped reads, consensus sequences were generated and dereplicated to explore 386 diversity across samples.



391 For antimicrobial resistance genes,  $mc-1$  and  $bla_{NDM}$ , we sought to identify different 392 alleles that could be amplified using the SAMRS-AEGIS 20-plex primer set by mapping reads 393 from positive samples to all alleles in the Comprehensive Antibiotic Resistance Database 394 (CARD).<sup>56</sup> While reads mapped to more than one allele sequence, the putative alleles are highly 395 similar (e.g., *mcr-1.20* and *mcr-1.14* have 1 bp different in the amplicon region) and could not be 396 distinguished from nanopore sequencing error. One strategy to distinguish highly similar alleles 397 within the same sample with nanopore sequencing is incorporating unique molecular identifiers  $198$  (UMIs) in the primers.<sup>57</sup> Alternatively, higher accuracy sequencing platforms such as Illumina or 399 PacBio could be used.

400 Beyond toxins and ARGs, the SAMRS-AEGIS 20-plex also targeted the 18S rRNA gene 401 to identify protozoan pathogens. The CR18S assay targets the 18S rRNA gene in

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402 *Cryptosporidium* spp.<sup>58</sup> 12 of the 14 CR18S SAMRS-AEGIS 20-plex assays that were positive 403 for CR18S were also positive by TAC. Consensus sequences revealed six unique 18S alleles 404 from these samples. Three of these alleles mapped at 100% identity to previously observed 405 variants found in sequence databases, including an unnamed *Cryptosporidium sp.* isolate, a 406 *Cryptosporidium meleagridis* isolate, and a *Cryptosporidium hominis* isolate (**Figure 5b)**. The 407 remaining variants were found to map with lower homology (approximately 90% ID) to 408 uncultured alveolates.

409 Finally, we were able to observe gene variants belonging to two subspecies of 410 *Campylobacter jejuni.* The *hipO* gene encodes for hippurate hydrolase in *C. jejuni.*<sup>59</sup> From 411 sequencing we were able to observe eight unique variants (**Figure 5c**). Four of these variants, 412 with nucleotides T33/T37 in the amplicon, closely map to *C. jejuni* subspecies *jejuni* while the 413 other four, with nucleotides C33/C37, closely map to *C. jejuni* subsp. *doylei*. Two of the *C. jejuni*  414 subsp. *jejuni hipO* variants and two of the *C. jejuni* subsp. *doylei hipO* variant matched with 415 100% ID to previously observed *hipO* genes. Two of the conserved polymorphisms in the *hipO* 416 *doylei* variant overlap with the probe binding region for the TAC assay (probe: T48/G47; *doylei*  417 C38/A47). Only one of eight samples positive for *hipO* with the SAMRS-AEGIS 20-plex was 418 positive using TAC.

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421 **Figure 5. Unique consensus sequences of assay targets identified with the SAMRS-AEGIS**  422 **20-plex assay.** Unique consensus sequences for targets are aligned against their respective 423 reference sequence. Alignments are shown for (**a**) STh, an enterotoxin gene in *E. coli*; (b) 424 CR18S, 18S rRNA gene of *Cryptosporidium*; and (c) *hipO*, a pathogen gene in *C. jejuni*. 425 Primers and probe locations of the corresponding qPCR assay are marked above each target. 426 Regions of interest are expanded to show single-base resolution. The top-alignment bar shows 427 positions with high variation from consensus alignments in color, color coded by base, and gray 428 otherwise.  $\blacktriangledown$  - indicates the presence of an insertion.



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444 Two assays in this work target eukaryotic 18S rRNA genes: CR18S (*Cryptosporidium*  445 *spp.*) and G18S (*Giardia spp.*). Of positive G18S samples from the 20-plex assay, all consensus 446 sequences mapped with 100% identity to *Giardia intestinalis*, the causative species of disease in humans.<sup>63</sup> 447 We observed six variants in *Cryptosporidium* 18S rRNA amplicons, (**Supplementary**  448 **File 1**), three of which mapped to uncultured alveolates at a lower identity (approx. 90% ID). 449 While the alveolate genus and species is unknown, the positive detection in both SAMRS-450 AEGIS 20-plex and TAC is possibly the result of off-target amplification of related, but non-451 pathogenic organisms in the alveolate genera. Given the high variation in the observed amplicons for the CR18S genes, more specific assays that target *C. hominis* and *C. parvum*,<sup>64</sup> the causative species of illness in humans, may be warranted.<sup>65</sup> Nonetheless, the sequencing used in the 454 SAMRS-AEGIS 20-plex assay provides a general means to interrogate variants within a sample 455 and distinguish between false positives and true positives.

456 Though the SAMRS-AEGIS 20-plex assay proved to be sensitive and more information-457 rich than probe-based amplification strategies, there are some notable limitations. Probe-based

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458 strategies that are qPCR-based, such as the TAC assay and dPCR are quantitative. As developed, 459 the 20-plex assay is not capable of relative quantification due to the use of sequential rounds of 460 PCR, nor can the assay be used for absolute quantification since it relies on sequencing. 461 Additionally, sensitivity of assay targets when multiplexing is highly dependent on the 462 differential abundance of target species. Optimization of concentrations for specific targets, 463 combined with *a priori* knowledge of expected environmental abundances, may be required for 464 improving sensitivity in certain sample types. Though the use of nanopore sequencing is well-465 suited for resource limited settings, the low nominal basecalling accuracy (95%) limits our 466 ability to resolve multiple alleles within the same sample. To distinguish between multiple alleles 467 in a single sample, much higher sequencing coverage with nanopore or other higher accuracy 468 NGS (e.g., Illumina) would be required. Finally, as the 20-plex assay is built around detection of 469 extracted genetic material from samples, it is not suited for detection of viable organisms.

470 Despite these limitations, the SAMRS-AEGIS 20-plex assay strategy presented is a 471 promising alternative to conventional multi-target PCR detection methods. We estimate that 472 multiplexing 10 samples and 20 targets (20-plex) on a single nanopore MinION flow cell would 473 cost approximately \$4.00 per target and \$80.00 per sample (**Table S10, Supplementary File 2**), 474 which is similar to the per-target and per-sample costs of 20 parallelized assays on the TAC 475 platform. Where the SAMRS-AEGIS 20-plex assay design excels is at *scale*. Assuming a fixed 476 read coverage, sequencing the 20-plex reactions on an Illumina NovaSeq S4 would drop assay 477 costs to approximately \$0.55 per target or \$11.00 per sample. Setting aside variable costs, using 478 nanopore sequencing as a readout still offers a lower entry barrier in capital costs compared to 479 qPCR, dPCR, and other NGS platforms, making it well-suited for work in resource constrained 480 settings, such as LMICs.

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487

### 488 **Methods**

489 **Sample collection and nucleic acid extraction.** 10 wastewater samples were obtained from 490 treatment plants from Washington (WA) State. 25-50 mL of wastewater was centrifuged at 5000 491 x g for 20 minutes at 4  $^{\circ}$ C. The resulting pellet was resuspended in 200 µL of supernatant. 492 Nucleic acids from 200 µL of resuspended wastewater solids were extracted using AllPrep 493 PowerViral DNA/RNA Kit (Qiagen, Hilden, Germany), omitting the use of β-mercaptoethanol. 494 Purified wastewater DNA was eluted in RNase-free water to a final volume of 100 µL.

495 10 soil samples were collected from three dog parks located in Seattle, WA. Nucleic 496 acids from 0.25 g of each sample were extracted using DNeasy PowerSoil Pro Kit (Qiagen) 497 following standard protocol. Purified soil DNA was eluted in Solution C6 (10 mM Tris-HCl 498 buffer) to a final volume of  $50 \mu L$ .

499 10 fecal samples from children were obtained from the ECoMiD cohort study in 500 northwest Ecuador.<sup>66</sup> The child stool samples were collected at 18 months of age. Nucleic acids 501 were extracted from 0.22 grams of stool samples using a modified QIAamp Fast DNA Stool 502 Mini Kit (Qiagen). Purified fecal DNA was eluted in Buffer ATE (10 mM Tris-HCl, 0.1 mM 503 EDTA,  $0.04\%$  NaN<sub>3</sub>) to a final volume of 200  $\mu$ L. The ECoMiD study protocol was approved by

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504 the institutional review boards of the University of Washington (UW; IRB STUDY00014270), 505 Emory University (IRB00101202), and the Universidad San Francisco de Quito (2018–022M). 506 The study protocol was also reviewed and approved by the Ministry of Health of Ecuador 507 (MSPCURI000253-4).

508

509 **SAMRS-AEGIS Primer Design.** We selected 40 standard DNA primers from 20 qPCR assays 510 reported in previous literature (**Table S1**). These primers were modified with SAMRS 511 nucleobases to prevent primer dimer in a 20-plex PCR assay. SAMRS modifications were 512 designed using an iterative approach. Software developed at FfAME (PrimerCompare) took all 513 40 standard DNA primers along with primer, salt, and Mg++ concentrations (200 nM, 60 mM, 514 and 2 mM, respectively) and output potential primer-primer interactions including self-515 dimerization and hairpin structures. Using filters in the software, we concentrate on only the 516 most detrimental structures with sufficiently low ΔG values for hairpins and dimers, as well as 517 dimers with 3′ to 3′ overlaps within a short footprint (4-8 nt). These become our primary SAMRS<br>518 substitution regions. We then identified between 1-3 bases for SAMRS substitutions in the 3′-518 substitution regions. We then identified between 1-3 bases for SAMRS substitutions in the 3′- 519 overlap region that can destabilize the largest proportion of predicted structures. PrimerCompare 520 incorporates SAMRS nearest neighbor thermodynamic data and allows us to run the SAMRS 521 modified set as input to evaluate if further substitutions are required, along with checking the 522 Tms and ΔGs of modified primers. This process continues until an optimal set of primers is 523 designed.

524 Once all 40 standard DNA primers were modified with SAMRS, we added a common 525 AEGIS tag to the 5′-end. The 5′ overhang sequence facilitates the attachment of barcode and<br>526 sequencing adapters in PCR. The AEGIS tag (AGCPCTCGPTTC) was designed to allow 2 526 sequencing adapters in PCR. The AEGIS tag (AGC**P**CTCG**P**TTC) was designed to allow 2

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 $527$  AEGIS bases separated by 3 or more standard DNA bases and to have a Tm of at least 60 °C. 528 The designed 40 SAMRS-AEGIS primers are listed in **Table S2**. Further, AEGIS barcode 529 sequences used for sample multiplexing were designed by concatenating a barcode from Oxford 530 Nanopore Technologies Native Barcoding Kit (SQK-NBD112.24) with the AEGIS tag sequence, 531 which are listed in **Table S3**.

532

533 **SAMRS-AEGIS Primer Synthesis.** SAMRS or AEGIS containing oligonucleotides were 534 synthesized on Mermade 12 instruments, using standard phosphoramidite methods with minor 535 changes to the coupling time of AEGIS phosphoramidites (2 min for AEGIS, 1 min for standard 536 DNA bases and SAMRS). Solid support was a Mermade style column packed with controlled 537 pore glass (CPG) at 1000 Å pore size. Oligonucleotides were synthesized as either DMT-on or 538 DMT-off, followed by diethylamine wash (10% in ACN) at the end of the synthesis. DMT-off 539 oligonucleotides were deprotected in aqueous ammonium hydroxide  $(28-33\%)$  NH<sub>3</sub> in water) at 540 either 65 °C for 3 hours or 55 °C overnight, purified by ion-exchange HPLC (Dionex DNAPac 541 PA-100, 22x250 column), and desalted over SepPak C18 cartridges (Waters Corp., Milford, 542 MA). Oligonucleotides synthesized as DMT-on were deprotected using the same method, 543 followed by purification on Glen-Pak cartridges (GlenResearch, Sterling, VA). The purity of 544 each oligonucleotide was analyzed by analytical ion-exchange HPLC (Dionex DNAPac PA-100, 545 2x250 column). The oligonucleotides were sent out for ESI mass spectrometry (Novatia LLC, 546 Newtown, PA) to confirm their molecular weights.

547 **Sequential Multiplex PCR reaction and cycling conditions.** Unless otherwise specified, first 548 round PCR was performed at 20 µL scale and contained 1X Quantitect Multiplex PCR NoROX 549 master mix (Qiagen), 0.2 µM final concentration of each primer **(**40 primers listed in **Table S2,** 



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- 574 analyzed by gel electrophoresis on a 3% (w/v) agarose gel stained with GelGreen, and visualized 575 using a blue light transilluminator.
- 576

577 **Nanopore library preparation and data acquisition.** Prior to library preparation, all barcoded 578 samples were purified using magnetic DNA-binding beads (Sergi Lab Supplies, Seattle, WA) 579 with a 2:1 bead-to-sample ratio (v/v). Samples were washed twice with 70% ethanol, and eluted 580 in nuclease-free water to a final volume of 12 µL. Purified DNA was quantified on a DeNovix 581 Fluorometer, and barcoded samples were pooled equally by weight. A subset of SAMRS-AEGIS 582 and standard DNA NTCs were also sequenced. Nanopore sample preparation followed standard 583 MinION Genomic DNA by Ligation protocol using the SQK-LSK114 kit with the two following 584 modifications: 1) During the DNA repair and end prep step, the NEBNext FFPE Repair Mix was 585 omitted to avoid potential SAMRS-AEGIS removal by repair enzymes. The volume of the repair 586 mix was replaced by nuclease-free water. 2) To preserve short fragments, the magnetic DNA-587 binding bead-to-sample ratio was increased to 2:1. Up to 1.3 pmol of pooled samples were 588 loaded into the flowcell. MinION flow cells used in this work were from the R10.4.1 series. 589 Nanopore flow cells were used once per sample without washing, and data collection proceeded 590 for 72 h. A summary of nanopore sequencing runs is shown in **Table S8**.

591

592 **Nanopore data collection, basecalling, and processing.** Nanopore data acquisition was 593 performed using MinKNOW version 23.07.12. Data was collected in FAST5 format for 594 experiments with synthetic templates, and POD5 format for environmental/fecal samples. FAST5 files were converted to POD5 format using the pod5 package (ONT, version  $0.3.2$ ).<sup>67</sup> 596 Raw POD5 data files were basecalled using Dorado (ONT, version 0.6.2+14a7067) using the 597 super accurate model (dna\_r10.4.1\_e8.2\_400bps\_sup@v4.2.0) and a minimum q-score threshold

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598 of  $7.68$  Sample barcodes were demultiplexed using the Dorado demux command with the  $-.$ no-599 trim" flag and a custom barcode configuration file that contained the 24-nt barcodes used in this 600 work.

601 Demultiplexed reads were aligned to a database containing barcoded reference sequences 602 using BLAST Command Line Tool (blastn, NCBI, version 2.9.0+) with the following flags: -- 603 outfmt 10, --max-target-seqs  $1.^{69}$  After alignment, top hits for each read with at least 95% 604 coverage were stored as an initial match. The resulting reads were then passed through a more 605 stringent alignment using bowtie2 (version 2.3.5.1) with the following flags: --very-sensitive, --  $\delta$  606  $\rm{local}$ <sup>70</sup> Bowtie2 alignment reference sequences contained target sequences without the barcode 607 region for the G18S, eae, CR18S, LT, and ipaH assays, and without the barcode or priming 608 region for the remaining assays. For sub-analysis of *hipO* alleles, both *hipO* variants from *C.*  609 *jejuni* subsp. *jejuni* and *C. jejuni* subsp *doylei* were included in the reference sequences.

610 Reads that passed bowtie2 alignment were further aligned to the fully barcoded target 611 sequences. Consensus sequences for each target within each sample were generated from these 612 aligned reads using medaka (ONT, version 1.12.1) commands: 'consensus' and 'stitch'.<sup>71</sup> For the 613 'consensus' command, no lower limit on the number of sequences required to generate a 614 consensus was placed at consensus generation stage. However, only alignments generated from 615 at least 10 sequences were used for downstream analysis. The 'stitch' command used the 616 following flag: –no-fillgaps. Consensus alignment % ID was calculated using the BLAST 617 Command Line (blastn) with the following flags: --outfmt 10, --max-target-seqs 1.

618

**TaqMan<sup>TM</sup> Array Card assays.** 1X TaqMan<sup>TM</sup> Fast Advanced PCR master mix (Thermo Fisher 620 Scientific) was used for all assays. A maximum amount of either 1400 ng or 20  $\mu$ L of DNA was loaded into a TaqManTM 621 Custom Plated Assay Microarray Card **(Table S7**)**.** Six samples were

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622 run on each card with a positive and negative control. For the positive control,  $1\times10^3$  copies/ $\mu$ L 623 of synthetic templates from IDT containing all 20 targets were used (sequences provided in 624 **Table S6**). For the negative control, volume of template DNA was replaced by nuclease-free 625 water. Before running, the loaded card was spun down twice at 300 x g for 1 min. The  $526$  TaqMan<sup>TM</sup> Array Card Sealer was then used to seal the card. The QuantStudio 7 Flex System 627 (Thermo Fisher Scientific) was used, with qPCR cycling conditions set at 92  $\degree$ C for 10 min, 628 followed by 40 cycles of 95 °C for 1 s and 60 °C for 20 s. Data analysis was performed using 629 Design & Analysis Software (version 2.8.0). The fecal samples were run as part of the ECoMiD 630 study using TAC cards with AgPath-ID One-Step RT-PCR master mix and did not have the *mcr-*631 *1* assay.

632

633 **Comparison of read distributions between the SAMRS-AEGIS 20-plex and standard DNA**  634 **20-plex assays.** Of the 30 environmental samples collected in this work, 10 wastewater, 10 soil, 635 and 10 fecal samples were processed by the SAMRS-AEGIS 20-plex assay while 9 wastewater, 636 8 soil, and 3 fecal samples were processed by the standard DNA 20-plex assay. For both assay 637 results, nanopore reads were demultiplexed then binned into one of four categories. Reads were 638 classified as "Target (full)" if they successfully mapped to the intended target following the 639 pipeline outlined in the "Nanopore data collection, basecalling, and processing" section. This 640 pipeline used an initial 95% query mapping filter to remove partial alignments. Reads that 641 mapped to barcodes, primer region, and target amplicon region, but with <95% coverage, were 642 binned as "Target (partial)". Reads that did not align to the target amplicon region, but did align 643 to barcode and primer regions were binned as "primer". Reads in this category could include 644 primer dimers and other non-specific amplification products. The remaining reads, which did not 645 fall under the previous categories, were binned as "None". Reads mapping to G18S, LT, and

646 ipaH were excluded from this analysis since they were detected in the NTC of the standard DNA A 647 20-plex assay. Visuals for read bins were generated using R (version 4.3.2).

648

649 **Comparison of target detection between the SAMRS-AEGIS 20-plex assay and the he**   $550$  **TaqMan<sup>TM</sup>** array cards in environmental samples. 10 wastewater, 10 soil, and 10 fecal 651 samples were analyzed for the presence of gene targets by both the SAMRS-AEGIS 20-plex 652 assay and TaqMan<sup>TM</sup> array cards (TAC). For the SAMRS-AEGIS 20-plex assay, an assay was 653 considered positive if at least one read successfully mapped to its target according to the pipeline ne 654 described in the "Nanopore data collection, basecalling, and processing" section; otherwise, it 655 was considered negative. For TAC, an assay was considered positive if at least one of the two o 656 replicates in a card reported a Ct value <40; otherwise, it was considered negative. For TAC C 657 assays in fecal samples, the *mcr-1* assay was not available and was excluded from analysis. . 658 Agreement and disagreement between SAMRS-AEGIS and TAC for each assay and across all 659 samples were visualized on a plotted matrix. Plots were generated using Python (version 3.8.0). 660 Percent positive agreement (PPA) and percent negative agreement (NPA) was calculated It is made available under a [CC-BY-NC-ND 4.0 International license](http://creativecommons.org/licenses/by-nc-nd/4.0/) .<br>
Sim this analysis since they were detected in the NTC of the standard DNA<br>
for read bins were generated using R (version 4.3.2).<br>
Let detection between

661 using the following formula:

662

$$
PPA = \frac{P_{SA\_TAC}}{P_{SA\_TAC} + P_{SA}}
$$

663

$$
NPA = \frac{N_{SA\_TAC}}{N_{SA\_TAC} + N_{SA}}
$$

664 665

666 PPA = positive percent agreement

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673

674 **Identification and visualization of pathogen and antimicrobial resistance gene alleles.** Reads 675 were processed as described previously with the inclusion of *hipO* variant sub-analysis 676 specifications. Consensus sequences generated in each sample with a coverage >10 reads were 677 aligned to reference sequences of target gene, then dereplicated. Alignments were visualized 678 using Integrative Genomics Viewer (version 2.16.2).<sup>72</sup> Regions of interest were manually 679 extracted and expanded for visualization. To identify if putative allele sequences had previously 680 been observed, BLASTN webserver was used to map consensus sequences against NCBI core 681 non-redundant nucleic acid database (core\_nt).

682

683 **Data availability.** The demultiplexed nanopore sequencing basecalls (FASTQ) for each sample 684 analyzed in this work have been deposited in the sequence reads archive (SRA) under Bioproject 685 PRJNA1150247 (**Table S9**).

686 **Acknowledgments:** We thank the wastewater treatment plants for collecting samples for this 687 work.

688 **Author Contribution:** Project conceptualization was performed by ERF, JAM, and ZY. 689 Methodology for this work was developed by HK, SMP, LM, and ZY. SAMRS-AEGIS



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