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1 Capsular typing method for Streptococcus agalactiae using whole

### 2 genome sequence data

- 3 Running title: GBS capsular typing using whole genome sequence data
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#### 23 Abstract

Group B streptococcus (GBS) capsular serotype is a major determinant of virulence, and affects potential vaccine coverage. Here we report a whole genome sequencingbased method for GBS serotype assignment. This shows high agreement (kappa=0.92) with conventional methods, and increased serotype assignment (100%) to all ten capsular types.

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#### 30 Main text

Streptococcus agalactiae, or Group B Streptococcus (GBS), is an important pathogen in neonates (1-3), with early infection acquired from the maternal genitourinary tract (4). In addition, GBS is now recognised as an increasingly important pathogen in high-income regions in immunosuppressed and elderly individuals (5, 6).

GBS expresses a capsular polysaccharide, which is involved in virulence and immune evasion. Ten different variants, or serotypes, have been described (Ia, Ib, II, III, IV, V VI, VII, VIII and IX), which differ in their disease-causing ability. Conjugate vaccines targeting the most common disease-causing serotypes are currently in development (7). Establishing vaccine serotype coverage is important, as is surveillance post-introduction to monitor for potential serotype replacement, as has been seen following the introduction of other conjugate vaccines (8).

42 Current methods for GBS serotype allocation rely on latex agglutination assays or 43 PCR (9). Recent advances in whole genome sequencing (WGS) have enabled the 44 development of approaches that can be used in place of traditional microbiological 45 methods, such as strain typing and antibiotic susceptibility profiling (10-12). A major 46 advantage of this approach is that the cost of sequencing can be mitigated by the ability to use the same data to generate multiple outputs. Given the decreasing cost
of WGS (13), and the ongoing increase in WGS data generation, we sought to
establish and validate a WGS-based method for GBS capsular typing.

We developed an algorithm for serotype assignment on the basis of sequence similarity between a given *de novo* assembly and capsular gene sequences of the ten GBS serotypes. For nine serotypes, published sequences were used as references (Table 1), while for serotype IX, only a partial capsular locus sequence has been published (14). A suitable reference for the full capsular locus region was therefore determined by WGS of a serotype IX isolate obtained from the Statens Serum Institute, Denmark.

To assign serotype for a given isolate, a BLAST database was generated from the 57 58 de novo assembly and queried with the variable region of the capsular locus 59 sequence for each serotype (cpsG-cpsK for serotypes Ia-VII and IX, cpsR-cpsK for 60 serotype VIII) using BLASTn with an evalue threshold of 1e-100 and otherwise 61 default parameters. A serotype was considered as correct if it showed ≥95% sequence identity over ≥90% of the sequence length. These thresholds were chosen 62 on the basis of being stringent enough to provide differentiation between the various 63 64 reference sequences, while maximising serotype allocation on an initial test set of publicly available GBS WGS data, where serotype information was not available (so 65 we had no way of knowing whether the assigned serotypes were in fact correct). 66

This sequence-based method for serotype allocation was validated using WGS on a set of 223 colonising or invasive human isolates from Canada, Latin America, Singapore, UK, USA, and Thailand, for which serotype had previously been determined using conventional latex agglutination assays, with PCR used to confirm 71 weak positives or negatives in a subset (15-17). For two rare serotypes (Serotype VIII and IX), one isolate of each was obtained from the Statens Serum Institute, 72 Denmark. GBS isolates stored at -80°C were sub-cultured on Columbia blood agar 73 for 24-48 hours, followed by DNA extraction from a single colony using a commercial 74 kit (QuickGene, Fujifilm, Tokyo, Japan). High throughput sequencing was 75 76 undertaken at the Wellcome Trust Centre for Human Genetics (Oxford University, UK) using the Illumina HiSeq2500 platform, generating 150 base paired-end reads. 77 De novo assembly was performed using Velvet and VelvetOptimiser (18, 19). 78 79 Agreement between serotype allocations was tested with the Kappa statistic.

High quality sequence data were obtained for all 223 GBS isolates (median read 80 81 number: 2,975,508, range: 1,798,744-13,073,718; median contig number: 46, range 82 16-106; median assembly length: 2.05 Mb, range: 1.94-2.22 Mb). Each isolate was allocated to a single serotype using the WGS data (Table 2). Three isolates that did 83 not have a capsular type assigned by latex agglutination methods had serotypes lb, 84 85 VI and VIII assigned. For all previously serotyped GBS isolates with a known capsule type, the kappa statistic (0.92) indicated very high agreement between WGS-86 predicted and conventional serotype. There were nine discordant isolates. In each 87 case there was strong support for the sequence-allocated serotype, with >98% 88 sequence identity over 100% of the reference length in all nine cases (Figure 1). 89 90 Across all isolates, differences in relatedness between the capsular locus sequences of the different serotypes led to characteristic relationships between the allocated 91 (best match) serotype and the second-best match. For example, all isolates 92 93 assigned as serotype Ia had serotype III as the second-best match. In all cases, the 94 second-best match was substantially poorer than the best match, demonstrating that there was no ambiguity in predicted serotype (Figure 1, Table 3). 95

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96 The nine discordant and three non-typeable isolates were retested by latex agglutination (Table 4) and resequenced using the Illumina MiSeq platform, with 97 sequence processing and WGS-based serotype prediction performed as above. In 98 all cases, resequencing was consistent with the initial WGS classification. For 6/9 99 discordant isolates, the new latex agglutination results matched the WGS-based 100 101 prediction, suggesting that the initial discordance may have resulted from incorrect 102 latex agglutination typing or sample mislabelling. The other three initially discordant isolates, and the three non-typeable isolates, were all classified as non-typeable on 103 104 retesting.

This WGS-based method for GBS serotyping, validated using 223 isolates typed using conventional methods, was therefore highly accurate. Although WGS may not currently be cost-effective for directly replacing traditional serotyping, costs are likely to further decrease. Furthermore, WGS may already be the cheapest option for combined studies, with possibilities to utilise the resulting data for additional analyses such as multi-locus sequence typing, relatedness to other sequenced isolates, and detailed phylogenetic analysis.

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Serotype	Accession	Region	Reference
la	AB028896.2	6982-11695	Yamamoto et al.(20)
Ib	AB050723.1	2264-6880	Watanabe et al.(21)
II	EF990365.1	1915-8221	Martins et al.(22)
111	AF163833.1	6592-11193	Chaffin et al.(23)
IV	AF355776.1	6417-11656	Cieslewicz et al.(24)
V	AF349539.1	6400-12547	Cieslewicz et al.(24)
VI	AF337958.1	6437-10913	Cieslewicz et al.(24)
VII	AY376403.1	3403-8666	Cieslewicz et al.(24)
VIII	AY375363.1	2971-7340	Cieslewicz et al.(24)
IX	NA	NA	This study

## 206 **Table 1.** Reference sequences used for sequence-based serotype allocation

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	Serotype allocated by WGS											
		la	lb	II	III	IV	v	VI	VII	VIII	IX	Total
	la	34	0	0	1	0	0	0	0	0	0	35
	lb	0	9	1	0	0	0	0	0	0	0	10
	II	0	0	25	0	0	0	0	0	0	0	25
	111	3	0	0	111	0	0	0	0	0	1	115
Serotype by	IV	0	0	0	0	1	0	1	0	0	0	2
atex	V	0	0	0	0	0	16	0	0	0	0	16
agglutination	VI	0	0	0	0	0	1	8	0	0	0	9
	VII	0	0	0	0	0	0	0	5	0	0	5
	VIII	0	0	0	0	0	0	0	0	1*	0	1
	IX	0	1	0	0	0	0	0	0	0	1*	2
	Non- typeable	0	1	0	0	0	0	1	1	0	0	3
	Total	37	11	26	112	1	17	10	6	1	2	223

## 208 Table 2. Serotype allocation by WGS to serotype allocation by latex agglutination

209 \*Reference GBS isolates from Statens Serum Institute serotypes VIII and IX

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Allocated serotype	% match	Second-best serotype	% match
la	93.91-100	III	64.56
111	100	la	62.98
V	100	IX	36.26
IX	100	V	31.05
VI	100	111	26.68
IV	100	la	20.3
Ib	99.61-100	VI	15.55
II	99.86-100	IV	9.45
VII	100	lb	6.95
VIII	100	none	0

## 211 **Table 3.** Relationship between allocated serotype and second-best match (see also Figure 1)



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		Latex agg	lutination	WGS		
Isolate	Reason for	Initial	Repeat	Initial	Repeat	
	retyping					
CB466	Discordant	111	la	la	la	
IW8194	Discordant	111	IX	IX	IX	
IW8466	Discordant	la	Ш	Ш		
IW8471	Discordant	111	la	la	la	
IW7157	Discordant	Ib	II	Ш	II	
SMRU1	Discordant	VI	V	V	V	
SMRU25	Discordant	IV	NT	VI	VI	
SMRU4	Discordant	IX	NT	Ib	Ib	
SMRU59	Discordant	Ш	NT	la	la	
Z41	Non-typeable	NT	NT	Ib	Ib	
UK22	Non-typeable	NT	NT	VII	VII	
IW2723	Non-typeable	NT	NT	VI	VI	
CB454	Control	Ш	III	111		
IW4445	Control	la	la	la	la	
IW4077	Control	II	II	II	II	

# 214 **Table 4.** Retyping of discordant and non-typable isolates

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217	Figure 1 Discordant isolates show high support for sequence-based serotype allocation.
218	For each isolate, the percentage of the capsular locus region present (≥95% sequence
219	identity) for the assigned serotype is shown on the X axis, and that for the serotype showing
220	the next best match on the Y axis. Isolates showing agreement between sequence-based
221	and conventional serotyping are shown in grey, those classified as non-typeable by
222	conventional methods in blue, and discordant isolates in red. Small circles represent single
223	isolates, the large circle represents 100 isolates. For each serotype, the second-best match is
224	identical in all cases, leading to the observed horizontal banding (details in Table 3).

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