# Evolution of *Streptococcus pneumoniae* during carriage

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August 2014



This dissertation is submitted for the degree of Doctor of Philosophy

## Declaration

I hereby declare that this dissertation is my own work and contains nothing that is the outcome of work done in collaboration with others, except where specifically indicated at the beginning of each chapter.

All sampling, population survey and microbiology work, which contributed to the metadata of this study were performed by Shoklo Malaria Research Unit, Mahidol-Oxford Tropical Medicine Research Unit, Faculty of Tropical Medicine, Mahidol University in Thailand through a collaboration with Dr Paul and Claudia Turner. The sequence data used in this thesis was generated at the Wellcome Trust Sanger Institute by Research Development and Sequencing production teams.

None of the work presented here has previously submitted for the purpose of obtaining another degree. This dissertation does not exceed 60,000 words in length, as required by the School of Biological Sciences.

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August 2014

## Acknowledgements

I am very grateful for Julian Parkhill and Stephen Bentley for trusting and giving me an opportunity to perform this work. I would like to thank both Julian and Ste for their strong support throughout my PhD, offering insightful and invaluable advice, and keeping me going when times were tough. Also, I sincerely thank Sharon Peacock and Matthew Holden, who also help guide me from day one.

I would like to extend my gratitude to my collaborators Paul and Claudia Turner, physicians who spent their PhD setting up a clinic in a remote Maela refugee camp to provide medical services to local people. I am in debt of their hard works and the resources they collected, which constitute almost this entire thesis.

Much of my bioinformatics work would not be possible without guidance and patience of Simon Harris and Nicholas Croucher. I also thank Jukka Corrander, Pekka Martinen, and their team for welcoming the computational challenges and helping develop analysing tools implemented on this study; David Aanensen for his help with graphical visualisation; Alison Mather for her statistical advice; and Susannah Salters for her microbiological expertise. This work could not have been completed without the informatics, systems, sequencing and library making teams of the Sanger institute. Also, I am thankful for all members of team 81, especially E212 residents for their general supports, understanding, and continuous cake supplies.

I thank Joy, all my friends and tutors for being with me through good and bad times during these nine years at Cambridge and yet making it so memorable. A thank to P'Yod whom the burden of mentoring me during difficult times has fallen most heavily. A final thanks to my family mum, dad, grandad, and late grandma for being so supportive and understanding throughout my time studying abroad, and always welcoming me back home with Thai food and warm hugs.

My PhD was funded by a Royal Thai Government Scholarship and a Wellcome Trust PhD Studentship.

#### Abstract

*Streptococcus pneumoniae* is a commensal bacterium asymptomatically carried in the nasopharynx of healthy individuals. However, if the bacterium escapes from its natural habitat to other anatomical loci, it can cause a range of invasive pneumococcal diseases, which make it a killer of over one million children annually. Despite high casualties, both treatment and prevention through vaccines have become more difficult as the bacteria rapidly develop antibiotic resistance and vaccine escape serotypes. To understand how this happens, one needs to look at evolution during carriage, a phase where exchange of genetic determinants for antibiotic resistance, virulence, and vaccine escape occurs *via* the process called "recombination".

This thesis summarises findings from a collection of 3,085 genome sequences of pneumococcal isolates from a rural community in Thailand called "Maela". This highly dense sampling gave an opportunity to investigate patterns of recombination and gene flows within the population, as well as changes in evolutionary patterns according to changes in selection pressure, especially the use of antibiotics over time. The non-encapsulated isolates, which are less invasive and unaffected by currently licensed vaccines, have a higher rate of both acceptance and donation of DNA *via* homologous recombination than encapsulated pneumococci. Highly exchanged genes include those associated with antibiotic resistance, implying that the non-encapsulates may act as a reservoir of resistance that can be passed to pathogenic strains and thus enhance the threat posed by antibiotic resistance.

However, the view from the Maela community may not be directly applicable to the population elsewhere, as different population structures may result in a different capacity for adaption. I therefore compared pneumococcal lineages detected in Maela with other contemporaneous carriage collections from the USA, UK, Gambia and Kenya based on multilocus sequence typing. The results showed that while the USA and UK share a lot of common lineages, large proportions of pneumococci detected in Gambia, Kenya and Thailand are unique to each location. Therefore, the propensity for genetic exchange may vary geographically and temporally.

The next part of the thesis identifies genetic determinants of resistance to beta-

lactams, a group of antibiotics frequently prescribed for upper respiratory infections. Here I performed a genome-wide association study - a technique commonly used in human genetics but difficult in bacteria due to their clonal population structure. Nevertheless, the large sample size and highly recombinogenic nature of *S*. *pneumoniae* allowed me to identify potential sources of resistance with improved resolution from "mosaic" genes described in the literature to several discrete causative sites, some of which are novel. The non-uniform distribution of these alleles in both vaccine-targeted and non-vaccine targeted lineages also highlights the limitations of vaccine in the control of spread of antibiotic resistance.

Together, this snapshot of the evolution of pneumococci and their interactions during carriage highlights the speed at which *S. pneumoniae* can adapt to new challenges, including antibiotics, while informing limitations in current health control policy.

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## Abbreviations

| ANCOVA      | Analysis of Covariance                           |
|-------------|--|
| BAPS        | Bayesian Analysis of Population Structure        |
| BC(s)       | primary BAPS Cluster(s)                          |
| BEAST       | Bayesian Evolutionary Analysis by Sampling Trees |
| BLAST       | Basic Local Alignment Search Tool                |
| BURST       | Based Upon Related Sequence Types                |
| BratNextGen | Bayesian recombination tracker Next Generation   |
| CC(s)       | Clonal complex(es)                               |
| CLSI        | Clinical and Laboratory Standard Institute       |
| cps         | capsular polysaccharide synthesis locus          |
| CSP         | Competence stimulating peptide                   |
| DNA         | Deoxyribonucleic acid                            |
| DVL(s)      | double-locus variant(s)                          |
| ENA         | European Nucleotide Archive                      |
| ICE         | Integrative conjugated element                   |
| IPD         | Invasive pneumococcal diseases                   |
| MLEE        | Multilocus enzyme electrophoresis                |
| MLST        | Multilocus sequence typing                       |
| MMR         | Mismatch repair system                           |
| NT(s)       | Nontypable                                       |
| PCV         | Pneumococcal conjugate vaccine                   |
| PFGE        | Pulse field gel electrophoresis                  |
| PMEN        | Pneumococcal Molecular Epidemiology Network      |
| sBC         | secondary BAPS cluster                           |
| SMRU        | Shoklo Malaria Research Unit                     |
| SNP(s)      | Single nucleotide polymorphism(s)                |
| ST(s)       | sequence type(s)                                 |
| SVL(s)      | single-locus variant(s)                          |
| TVL(s)      | triple-locus variant(s)                          |
| WGS         | Whole genome sequencing                          |

#### **Chapter 1: Introduction**

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