Multiple introductions and recent spread of the emerging human pathogen Mycobacterium ulcerans across Africa Running title: Population genomics of M. ulcerans in Africa


To cite this version:

HAL Id: inserm-01463433
https://www.hal.inserm.fr/inserm-01463433
Submitted on 9 Feb 2017

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L’archive ouverte pluridisciplinaire HAL, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d’enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.
Multiple introductions and recent spread of the emerging human pathogen *Mycobacterium ulcerans* across Africa

**Running title:** Population genomics of *M. ulcerans* in Africa

Koen Vandelannoote¹,²,#, Conor J. Meehan¹, Miriam Eddyani¹, Dissou Affolabi³, Delphine Mavinga Phanžú⁴, Sara Eyangoh⁵, Kurt Jordans²,⁶, Françoise Portaels¹, Kirstie Mangas⁷, Torsten Seemann⁸, Laurent Marsollier⁹, Estelle Marion⁹, Annick Chauty¹⁰, Jordi Landier⁵,¹¹, Arnaud Fontanet¹¹, Herwig Leirs², Timothy P. Stinear⁷,*⁰, Bouke C. de Jong¹,*

¹Department of Biomedical Sciences, Institute of Tropical Medicine, Nationalestraat 155, 2000 Antwerp, Belgium; ²Evolutionary Ecology Group, University of Antwerp, 2020 Antwerp, Belgium; ³Laboratoire de Référence des Mycobactériases, Cotonou, Benin; ⁴Institut Médical Evangélique, Kimpese, Democratic Republic of Congo; ⁵Service de Mycobactériologie, Centre Pasteur du Cameroun, Yaoundé, Cameroun; ⁶Invertebrates Section, Royal Museum for Central Africa, 3080 Tervuren, Belgium; ⁷Department of Microbiology and Immunology, University of Melbourne, 3010 Victoria, Australia; ⁸Victorian Life Sciences Computation Initiative, University of Melbourne, 3010 Victoria, Australia; ⁹CRCNA Inserm U892 CNRS 6299, CHU & Université d’Angers, 49035 Angers, France; ¹⁰CDTUB de Pobè, Pobè, Benin; ¹¹Emerging Diseases Epidemiology Unit, Institut Pasteur, 75015 Paris, France; *Shared last authorship

#Address correspondence to Koen Vandelannoote, Department of Biomedical Sciences, Institute of Tropical Medicine, Nationalestraat 155, 2000 Antwerp, Belgium; kvandelannoote@itg.be; Tel:(+32)32476318.

**Keywords:**

- Bacterial pathogen transmission
- Microbial population genomics
- Molecular evolution
- Phylogeography
ABSTRACT

Buruli ulcer (BU) is an insidious neglected tropical disease. Cases are reported around the world but the rural regions of West and Central Africa are most affected. How BU is transmitted and spreads has remained a mystery, even though the causative agent, Mycobacterium ulcerans, has been known for more than 70 years. Here, using the tools of population genomics, we reconstruct the evolutionary history of M. ulcerans by comparing 165 isolates spanning 48 years and representing 11 endemic countries across Africa. The genetic diversity of African M. ulcerans was found to be restricted due to the bacterium’s slow substitution rate coupled with its relatively recent origin. We identified two specific M. ulcerans lineages within the African continent, and inferred that M. ulcerans lineage Mu_A1 existed in Africa for several hundreds of years, unlike lineage Mu_A2, which was introduced much more recently, approximately during the 19th century. Additionally, we observed that specific M. ulcerans epidemic Mu_A1 clones were introduced during the same time period in the three hydrological basins that were well covered in our panel. The estimated time span of the introduction events coincides with the Neo-imperialism period, during which time the European colonial powers divided the African continent among themselves. Using this temporal association, and in the absence of a known BU reservoir or vector on the continent, we postulate that the so-called “Scramble for Africa” played a significant role in the spread of the disease across the continent.
INTRODUCTION

Buruli ulcer (BU) is a slowly progressing necrotizing disease of skin and subcutaneous tissue caused by the pathogen *Mycobacterium ulcerans* (Portaels, et al. 2009). BU is considered a neglected tropical disease, and in some highly endemic areas it is more prevalent than the most notorious mycobacterial diseases, tuberculosis and leprosy (Walsh, et al. 2011). Even though BU can affect all age groups, the majority of cases occur in children under age 15 (Debacker, et al. 2004). On the African continent, the first detailed clinical descriptions of ulcers caused by *M. ulcerans* have been attributed to Sir Albert Cook, a missionary physician who worked in Uganda in 1897 (Cook 1970). Since this first description BU was reported in 16 Sub-Saharan African countries over the course of the 20th and the early 21st century. Today, more than 30 countries worldwide have reported the emerging disease, although the highest incidence by far is still observed in impoverished, rural communities of West and Central Africa (Janssens, et al. 2005).

BU is known to occur primarily in foci around rural marshes, wetlands, and riverine areas (Portaels, et al. 2009; Wagner, et al. 2008). As proximity (but not contact) to these slow flowing or stagnant water bodies is a known risk factor for *M. ulcerans* infection (Jacobsen and Padgett 2010), it is generally believed that *M. ulcerans* is an environmental mycobacterium that can initiate infection after a micro-trauma of the skin (Meyers, et al. 1974b; Williamson, et al. 2014). Indeed, *M. ulcerans* DNA has been detected in a variety of aquatic specimens (Portaels, et al. 1999; Vandelannoote, et al. 2010), yet the significance of the detection of *M. ulcerans* DNA by PCR in environmental samples remains unclear in the disease ecology of BU (Durnez, et al. 2010; Eddyani, et al. 2004;
Gryseels, et al. 2012; Marsollier, et al. 2007; Merritt, et al. 2005; Portaels, et al. 1999; Vandelannoote, et al. 2010; Williamson, et al. 2008). This is largely due to the fact that definite evidence for the presence of viable *M. ulcerans* in potential environmental reservoirs is lacking owing to the challenge of culturing the slow growing mycobacterium from non-clinical, environmental sources (Portaels, et al. 2008). Consequently, the mode of transmission and non-human *M. ulcerans* reservoir(s) remain poorly understood (Röltgen and Pluschke 2015). As until today no animal reservoir for *M. ulcerans* has been identified in the Afrotropic ecozone (Durnez, et al. 2010), our working hypothesis is that humans with active, openly discharging BU lesions may play a pivotal role in the spread of the bacterium.

Multilocus sequence typing analyses (Yip, et al. 2007) and subsequent whole-genome comparisons (Doig, et al. 2012) indicated that *M. ulcerans* evolved from a *Mycobacterium marinum* progenitor by acquisition of the virulence plasmid pMUM001. This plasmid harbors genes required for the synthesis of the macrocyclic polyketide toxin mycolactone (Stinear, et al. 2004), which has cytotoxic and immunosuppressive properties that can cause chronic ulcerative skin lesions with limited inflammation and thus plays a key role in the pathogenesis of BU (George, et al. 1999). Both the acquisition of the plasmid and a reductive evolution (Demangel, et al. 2009; Stinear, et al. 2007) suggested that a generalist proto-*M. marinum* became a specialized mycobacterium, more adapted to a restricted environment, perhaps within a vertebrate host. Analysis of the genome suggests that this new niche is likely to be protected from sunlight, non-anaerobic, osmotically stable, and an extracellular environment where slow growth, the loss of several immunogenic proteins, and production of the immunosuppressive molecule, mycolactone,
provide selective advantages (Doig, et al. 2012; Stinear, et al. 2007). The evolution of \textit{M. ulcerans} has been mediated by the insertion sequence element (ISE) \textit{IS2404}, which is present in the \textit{M. ulcerans} genome in \textasciitilde 200 copies (Stinear, et al. 2007). For some \textit{M. ulcerans} lineages a second ISE, \textit{IS2606}, is also present in a high copy number (\textasciitilde 90 copies). These short, mobile genetic DNA elements promote genetic rearrangements by modifying gene expression and sequestering genes (Mahillon and Chandler 1998). Increased ISE numbers are a signature for bacteria that have passed through an evolutionary bottleneck and undergone a lifestyle shift to a new niche, causing loss of genetic loci that are no longer required for the survival in the new environment (Moran and Plague 2004). Subsequent whole-genome comparisons showed that this “niche-adapted” genomic signature was established in a \textit{M. ulcerans} progenitor before its intercontinental dispersal (Doig, et al. 2012).

The restricted genetic diversity of \textit{M. ulcerans} has meant that conventional genetic fingerprinting methods have largely failed to differentiate clinical disease isolates, complicating molecular analyses on the elucidation of the disease ecology, the population structure, and the evolutionary history of the pathogen (Roltgen, et al. 2012). Whole genome sequencing (WGS) is currently replacing conventional genotyping methods for \textit{M. ulcerans} (Ablordey, et al. 2015; Bolz, et al. 2015; Doig, et al. 2012; Eddyani, et al. 2015). Hence, in the present study we sequenced and compared the genomes of 165 \textit{M. ulcerans} disease isolates originating from multiple African disease foci to gain deeper insights into the population structure and evolutionary history of the pathogen, and to untangle the phylogeographic relationships within the genetically conserved cluster of African \textit{M. ulcerans}. 
METHODS

Bacterial isolates and sequencing

We analyzed a panel of 165 \textit{M. ulcerans} disease isolates originating from disease foci in 11 African countries that had been cultured between 1964 and 2012 (Table S1). Isolates were chosen to maximize temporal and spatial diversity within countries in which more than 20 isolates were available (Figure S1). Even though most well-documented BU endemic countries were well represented, we were unable to include isolates from several African countries (Equatorial Guinea, Kenya, Liberia, Sierra Leone, and South Sudan), that have reported, if not isolated, (a limited number of) BU cases in the past (Janssens, et al. 2005). Two isolates from Papua New Guinea (PNG) were included as outgroups to root the African phylogenetic tree. PNG \textit{M. ulcerans} was specifically chosen as it (together with African and other Southeast Asian \textit{M. ulcerans}) belongs to the more virulent and distinct “classic” phylogenetic lineage (Kaser, et al. 2007), relative to \textit{M. ulcerans} isolates elsewhere.

Permission for the study was obtained from the ITM Institutional Review Board. Isolates were processed and analyzed without use of any patient identifiers, except for country and village of origin if this information was available. Based on conventional phenotypic and genotypic methods, bacterial isolates had previously been assigned to the species \textit{M. ulcerans} (WHO 2014). Mycobacterial isolates were maintained for prolonged storage at ≤-70°C in Dubos broth enriched with growth supplement and glycerol. DNA was obtained by harvesting the growth of three Löwenstein-Jensen (LJ) slants followed by heat inactivation, mechanical disruption, enzymatic digestion and DNA purification on a Maxwell 16 automated platform (Eddyani, et al. 2015).
Index-tagged paired-end sequencing-ready libraries were prepared from gDNA extracts with the Nextera XT DNA Library Preparation Kit. Genome sequencing was performed on Illumina HiSeq 2000 and Miseq DNA sequencers according to the manufacturers’ protocols with 150bp, 250bp or 300bp paired-end sequencing chemistry. Sequencing statistics are provided in Table S1. The quality of raw Illumina reads was investigated with FastQC v0.11.3 (Andrews 2015).

Prior to further analysis, reads were cleaned with clip, a tool in the Python utility toolset Nesoni v0.130 (Harrison and Seeman 2014). Reads were filtered to remove those containing ambiguous base calls, any reads <50 nucleotides in length, and reads containing only homopolymers. All reads were further trimmed to remove residual ligated Nextera adaptors and low quality bases (<Q10) at the 3' end. The total amount of read-pairs kept after clipping and their average read length are summarized for all isolates in Table S1.

**Read mapping and SNP / large deletion detection**

Read mapping and SNP detection were performed using the Snippy v2.6 pipeline (Seemann 2015). The Burrows-Wheeler Aligner (BWA) v0.7.12 (Li and Durbin 2009) was used with default parameters to map clipped read-pairs to two *M. ulcerans* Agy99 reference genomes: the *M. ulcerans* Agy99 bacterial chromosome (Genbank: CP000325) and the *M. ulcerans* pMUM001 plasmid (Genbank: BX649209). Due to the unreliability of read mapping in mobile repetitive regions all ISE elements (IS2404 and IS2606) and all (plasmid-encoded) polyketide synthase genes were masked in these reference genomes (397 kb / 5.63 Mb - 7% of Agy99, 118 kb / 174 kb - 67% of pMUM001). After
read mapping to *M. ulcerans* Agy99 and pMUM001, average read depths were determined with SAMtools v1.2 (Li, et al. 2009) and are summarized for all isolates in Table S1. SNPs were subsequently identified using the variant caller FreeBayes v0.9.21 (Garrison and Marth 2012), with a minimum depth of 10 and a minimum variant allele proportion of 0.9. Snippy was used to pool all identified SNP positions called in at least one isolate and interrogate all isolates of the panel at that position. As such a multiple sequence alignment of “core SNPs” was generated.

The number of reads mapping to unique regions of the plasmid and the bacterial chromosome were used to roughly infer plasmid copy number. This was achieved by calculating the ratio of the mode of read depth of all positions in the plasmid to that of the chromosome: $\frac{Mo(\text{read depth unique positions plasmid})}{Mo(\text{read depth unique positions chromosome})}$ (Holt, et al. 2012).

Large (>1000 bp) chromosomal deletions were detected with Breseq v.0.27.1 (Barrick, et al. 2014), a reference-based alignment pipeline that has been specifically optimized for microbial genomes. Breseq was used with Bowtie2 v.2.2.6 (Langmead and Salzberg 2012) to map clipped read-pairs to Agy99 and the resulting missing coverage evidence was used to detect large deleted chromosomal regions.

**Population genetic analysis**

Bayesian model-based inference of the genetic population structure was performed using the “Clustering with linked loci” module (Corander and Tang 2007) in BAPS v.6.0 (Corander, et al. 2008). This particular module takes potential linkage within the employed molecular information into
consideration, which is advisable when performing genetic mixture analysis on SNP data from a haploid organism. A concatenation of the core-SNP alignment of both the bacterial chromosome and the plasmid was loaded as a sequential BAPS formatted file. This entry was complemented with a “linkage map” file that differentiated two linkage groups (bacterial chromosome & plasmid). The optimal number of genetically diverged BAPS-clusters ($K$) was estimated in our data by running the estimation algorithm with the prior upper bound of $K$ varying in the range of 3-20. Since the algorithm is stochastic, the analysis was run in 20 replicates for each value of $K$ as to increase the probability of finding the posterior optimal clustering with that specific value of $K$.

QGIS v.2.10 (Quantum_GIS 2012) was used to generate the figures on the geographical distribution of African $M. ulcerans$. The residence of BU patients at the time of their clinical visit was represented as points. In the case where residence information was missing we used the location of the hospital supplying the sample. The administrative borders of countries were obtained from the Global Administrative Unit Layers dataset of FAO.

**Detection of recombination**

Evidence for recombination between different BAPS-clusters was assessed using several methods as studies show that no single method is optimal, whereas multiple approaches may maximize the chances of detecting recombination events (Posada and Crandall 2001). A whole genome alignment was constructed with Snippy using default parameters. Recombination was assessed using the pairwise homoplasy index test $\Phi_w$ (Bruen, et al. 2006) (with significance set at 0.05), as implemented in Splitstree v 4.13.1 (Huson and Bryant 2006) on the whole genome alignment. We used BRAT-NextGen
(Marttinen, et al. 2012) to detect recombination events within our isolate panel using the whole genome alignment. BRAT-NextGen was specifically developed to detect homologous recombinant segments among a group of closely related bacteria over the process of their diversification and has been shown to be highly accurate when applied to mycobacteria (Mortimer and Pepperell 2014). The estimation of recombination was started with a partitioning of the whole genome alignment into 5kb segments and running a clustering analysis separately on each of these segments. The alpha hyper-parameter was estimated with default settings. The proportion of shared ancestry (PSA) tree was cut at 0.15 differentiating a total set of 4 clusters for all taxa. Recombination profiles were calculated with 100 iterations, at which stage parameter estimations had successfully converged. Significance (p<0.05) of each putative recombinant segment was determined with 100 pseudo replicate permutations.

**Maximum-likelihood phylogenetic analysis**

A maximum-likelihood (ML) phylogeny was estimated ten times from the SNP alignment using RAxML v8.2.0 (Stamatakis 2014) under a plain generalized time reversible (GTR) model (no rate heterogeneity) with likelihood calculation correction for ascertainment bias using the Stamatakis method (Stamatakis 2015). Identical sequences were removed before the RAxML runs. For each run we performed 10,000 rapid bootstrap analyses to assess support for the ML phylogeny. The tree with the highest likelihood across the ten runs was selected. We used TreeCollapseCL v4 (Hodcroft 2013) to collapse nodes in the tree with bootstrap values below a set threshold of 70% (Hillis and Bull 1993) to polytomies while preserving the length of the tree. Phylogenetic relationships were inferred with the two PNG strains as outgroups. Root-to-tip distances
were extracted from the ML phylogeny using TreeStat v1.2 (Rambaut 2008). The relationship between root-to-tip distances and tip dates (Rieux and Balloux 2016) was determined using linear regression analysis in R v3.2.0 (R Core Team 2015).

**Bayesian phylogenetic analysis**

We used BEAST2 v2.2.1 (Bouckaert, et al. 2014) to date evolutionary events, determine the substitution rate and produce a time-tree of African *M. ulcerans*, as this approach allows for inference of phylogenies with a diverse set of molecular clock and population parameters (Drummond, et al. 2006). Path sampling (PS) (Lartillot and Philippe 2006) was used to determine the best clock and population model priors by computing the marginal likelihoods of competing models of evolution, as this method has been shown to outperform other methods of model selection (Baele, et al. 2012; Lartillot and Philippe 2006). We compared three clock models (strict, uncorrelated exponential relaxed, and uncorrelated log-normal relaxed) in combination with two demographic coalescent models (constant and exponential). The required number of steps in PS analysis was determined by running one of the more complex models (uncorrelated log-normal relaxed clock / constant coalescent tree prior) with a different amount of steps, starting from 100 steps until 400 using increments of 50. As no difference in marginal likelihood estimates was observed after 100 steps, each model was run for 100 path steps, each with 200 million generations, sampling every 20,000 MCMC generations and with a burn-in of 30%. Likelihood log files of all individual steps were inspected with Tracer v1.6 (Rambaut 2014) to see whether the chain length produced an effective sample size (ESS) larger than 400, indicating sufficient sampling. Marginal likelihoods of the models were then used to calculate natural log
Bayes factors ($\text{LBF} = \ln \text{mL(model1)} - \text{mL(model2)}$), which evaluate the relative merits of competing models (see also SI text).

The best clock/demographic model (UCLD relaxed clock with a constant coalescent tree prior - see also SI text) was then used to infer a genome scale African \textit{M. ulcerans} time-tree under the GTR substitution model and with tip-dates defined as the year of isolation (Table S1). Analysis was performed in BEAST2 using a total of 10 independent chains of 200 million generations, with samples taken every 20,000 MCMC generations. Log files were inspected for convergence and mixing with Tracer v1.6. LogCombiner v2.2.1 (Bouckaert, et al. 2014) was then used to combine log and tree files of the independent BEAST2 runs, after having removed a 30% burn-in from each run. Thus, parameter medians and 95% highest posterior density (HPD) intervals were estimated from over 1.6 billion visited MCMC generations. To ensure prior parameters were not over-constraining the calculations, the entire analysis was furthermore run while sampling only from the prior. Finally, we also checked for the robustness of our findings under different priors, as states of low mutation rate and large \(t_{\text{root}}\) are hard to distinguish from otherwise identical states of large mutation rate and smaller \(t_{\text{root}}\) (Drummond, et al. 2002). This additional analysis was required as the tree prior and the clock prior interact when adding sequence data, and the strength of this interaction is not visible when sampling exclusively from the prior.

TreeAnnotator was used to summarize the posterior sample of time-trees so as to produce a maximum clade credibility tree with the posterior estimates of node heights visualized on it (posterior probability limit $\geq 0.8$).
A permutation test was used to assess the validity of the temporal signal in the data. This was undertaken by performing 20 additional BEAST2 runs (of 200 million MCMC generations each) with identical substitution (GTR), clock (uncorrelated log-normal relaxed) and demographic models (constant coalescent) but with tip dates randomly reassigned to sequences. This random “null set” of tip-date and sequence correlations was then compared with the substitution rate estimate of the genuine tip-date and sequence correlations (Holt, et al. 2012; Rieux and Balloux 2016).

**Discrete phylogeographic analysis.**

To assess the geospatial distribution of African *M. ulcerans* through time, an additional BEAST2 analysis was performed. In this analysis the posterior probability distribution of the location state (geographic region) of each node in the tree was inferred, in addition to the parameters described above (tree topology, evolutionary & demographic model). Sampled isolates were associated with fixed discrete location states and a discrete BSSVS geospatial model (Lemey, et al. 2009) was subsequently used to reconstruct the ancestral location states of internal nodes in the tree from these isolate regions. To prevent loss of the signal in the data by considering too many discrete regions compared to the number of isolates, we limited the amount of discrete regions by merging neighboring countries (similarly as carried out in (Comas, et al. 2013; He, et al. 2013). As such we differentiated 5 regions: Ivory Coast (20 isolates), Ghana-Togo (25 isolates), Benin-Nigeria (65 isolates), Cameroon-Gabon (24 isolates), and Angola-DRCongo-Congo (30 isolates). Ten independent chains were run for 200 million generations, with subsamples recorded from the posterior every 20,000 MCMC generations. LogCombiner was then used to combine tree files of the independent BEAST2 runs, after
having removed a 30% burn-in from each run. TreeAnnotator was used as described above to summarize the posterior sample of time-trees.
RESULTS & DISCUSSION

In order to understand how and when *M. ulcerans* has spread across Africa we sequenced the genomes of 165 African isolates that were obtained between 1964 and 2012 and spanned most of the known endemic areas of BU in 11 different African countries (Figure S1). This collection captured as much diversity as possible within Africa while minimizing the phylogenetic discovery bias implicit to SNP typing (Pearson, et al. 2004; Roltgen, et al. 2010). Resulting sequence reads were mapped to the Ghanaian *M. ulcerans* Agy99 reference genome and, after excluding mobile repetitive IS elements and small insertion-deletions (indels), we detected a total of 9,193 SNPs uniformly distributed across the *M. ulcerans* chromosome with approximately 1 SNP per 613 bp (0.17% nucleotide divergence) (Figure S2). Similarly, a total of 81 SNPs were identified in the non-repetitive regions of pMUM001, which resulted in a very comparable nucleotide divergence of 0.14%. The maximum chromosomal genetic distance between two African isolates was 5,157 SNPs.

**The population structure of *M. ulcerans* in Africa**

Large DNA deletions are excellent evolutionary markers since they are very unlikely to occur independently in different lineages but rather are the result of unique irreversible events in a common progenitor (Brosch, et al. 2002). We explored the distribution of large chromosomal deletions (relative to Agy99) and identified differential genome reduction that supports the existence of two specific *M. ulcerans* lineages within the African continent, hereafter referred to as Lineage Africa I (Mu_A1) and Lineage Africa II (Mu_A2). A total of 20 genomic deletion events were identified in all lineage Mu_A2 strains (Table 1). Most of the 20 deletions were mediated by IS elements IS2404 and IS2606 which are known to profoundly enhance mycobacterial genome plasticity.
(Stinear, et al. 2007). These high copy number IS elements either flanked the deletion or they were present in the deleted or substituted sequence stretches. The 20 identified deletions contained a total of 27 protein coding sequences (CDSs) and 12 pseudogenes (Table 1). The number of deleted CDSs and pseudogenes averaged two per deletion event (range one – eight). Well represented were pseudogenes that either contained frameshift mutations or were disrupted by IS elements.
<table>
<thead>
<tr>
<th>Start position*</th>
<th>End position*</th>
<th>Size of deletion (bp)</th>
<th>Description of affected genes*</th>
</tr>
</thead>
<tbody>
<tr>
<td>26779</td>
<td>28225</td>
<td>1446</td>
<td>MUL_0025: transposase for IS2606</td>
</tr>
<tr>
<td>132163</td>
<td>133609</td>
<td>1446</td>
<td>MUL_0131: transposase for IS2606</td>
</tr>
<tr>
<td>826566</td>
<td>828021</td>
<td>1455</td>
<td>MUL_0780: transposase for IS2606</td>
</tr>
<tr>
<td>1618246</td>
<td>1619692</td>
<td>1446</td>
<td>MUL_1494: hypothetical cytoplasmic protein; MUL_1495: transposase for IS2606</td>
</tr>
<tr>
<td>1711639</td>
<td>1713085</td>
<td>1446</td>
<td>MUL_1581: conserved hypothetical protein (pseudogene - Disrupted by IS2404); MUL_1582: transposase for IS2404</td>
</tr>
<tr>
<td>2627839</td>
<td>2629851</td>
<td>1452</td>
<td>MUL_2348: polyketide synthase (pseudogene - Disrupted by IS2606 &amp; Frame shift mutation)</td>
</tr>
<tr>
<td>2886326</td>
<td>2887702</td>
<td>1376</td>
<td>MUL_2586: PPE family protein (pseudogene - Disrupted by IS2404); MUL_2585: transposase for IS2404</td>
</tr>
<tr>
<td>2976946</td>
<td>2980459</td>
<td>3513</td>
<td>MUL_2663: metal cation transporting P-type ATPase CtpH_1 (pseudogene - Frame shift mutation)</td>
</tr>
<tr>
<td>305344</td>
<td>3058692</td>
<td>3348</td>
<td>MUL_2733: conserved hypothetical protein (pseudogene - Disrupted by IS2404); MUL_2735: transposase for IS2606; MUL_2736: transposase for IS2404</td>
</tr>
<tr>
<td>3304274</td>
<td>3307178</td>
<td>2904</td>
<td>MUL_2983: transposase for IS2606; MUL_2984: transposase for IS2404</td>
</tr>
<tr>
<td>3594994</td>
<td>3596440</td>
<td>1446</td>
<td>MUL_3219: type I restriction-modification system restriction subunit (pseudogene - Frame shift mutation); MUL_3221: transposase for IS2606</td>
</tr>
<tr>
<td>3603880</td>
<td>3605326</td>
<td>1446</td>
<td>MUL_3229: transposase for IS2606</td>
</tr>
<tr>
<td>3811852</td>
<td>3813298</td>
<td>1446</td>
<td>MUL_3438: transposase for IS2606</td>
</tr>
<tr>
<td>3986318</td>
<td>3989256</td>
<td>2938</td>
<td>MUL_3592: transposase for IS2606 (pseudogene - Frame shift mutation); MUL_3593: transposase for IS2404</td>
</tr>
<tr>
<td>4286753</td>
<td>4288200</td>
<td>1447</td>
<td>MUL_3836: transposase for IS2606 (pseudogene - Frame shift mutation)</td>
</tr>
<tr>
<td>4687633</td>
<td>4689079</td>
<td>1446</td>
<td>MUL_4214: transposase for IS2606; MUL_4215: N-term cell filamentation protein Fic (pseudogene - Disrupted by insertion sequence)</td>
</tr>
<tr>
<td>4848769</td>
<td>4850215</td>
<td>1446</td>
<td>MUL_4368: transposase for IS2606</td>
</tr>
<tr>
<td>4876318</td>
<td>4879973</td>
<td>3655</td>
<td>MUL_4394: hypothetical membrane protein; MUL_4395: mid-section conserved hypothetical membrane protein (pseudogene - DNA deletion); MUL_4397: transposase for IS2606; MUL_4398: transposase for IS2404</td>
</tr>
<tr>
<td>4961244</td>
<td>4962690</td>
<td>1446</td>
<td>MUL_4474: transposase for IS2606</td>
</tr>
<tr>
<td>5088793</td>
<td>5096926</td>
<td>8133</td>
<td>MUL_4588: N-term conserved hypothetical protein (pseudogene - Disrupted by IS2404); MUL_4589: transposase for IS2404; MUL_4590: hypothetical cytoplasmic protein; MUL_4591: hypothetical cytoplasmic protein; MUL_4592: hypothetical cytoplasmic protein; MUL_4593: conserved hypothetical protein (pseudogene - Frame shift mutation); MUL_4594: hypothetical cytoplasmic protein; MUL_4595: transposase for IS2404</td>
</tr>
</tbody>
</table>

Table 1: Genomic deletions in Mu_A2 relative to the Agy99 reference genome (Mu_A1). a in Agy99.
SNP-based exploration of the genetic population structure using BAPS (Corander, et al. 2008) agreed with the above deletion analysis and subdivided the African \textit{M. ulcerans} population into four major clusters. Clusters 1 to 3 constitute Mu\_A1 while BAPS-cluster 4 corresponds to Mu\_A2. The composition of these clusters is detailed in Table S1. Cluster 1 circulates throughout the African continent and represents the vast majority of the isolates, n=136 (82.4%). This cluster is also the most genetically diverse with an intra-cluster average pairwise SNP difference (SNPΔ) of 171 SNPs (SD=73). Clusters 2, 3, and 4 were considerably smaller, encompassing 20 (12.1%), 1 (0.6%) and 8 (4.8%) isolates respectively. Cluster 2 circulates in different regions of Cameroon and neighboring Gabon and corresponds to an SNPΔ of 64 SNPs (SD=54). Cluster 3 (1 isolate) was only found in Uganda. Finally, Cluster 4 (which encompasses Mu\_A2 entirely) has a SNPΔ of 81 SNPs (SD=41). Relative to the occurrence of Mu\_A1, Mu\_A2 is common in Gabon (40%, 2 Mu\_A2 / 5 total Gabonese strains), but quite rare in Cameroon (5%, 1/19) and Benin (8%, 5/59).

\textbf{African} \textit{M. ulcerans} \textit{evolves through clonal expansion, not recombination}

Ignoring recombination when analyzing evolving bacterial pathogens can be misleading as the process has the potential to both distort phylogenetic inference and create a false signal of apparent mutational evolution by (horizontally) introducing additional divergence between heterochronously sampled disease isolates (Croucher, et al. 2013). The pairwise homoplasy index (Φw) did not find statistically significant evidence for recombination (p=0.1545) between different BAPS-clusters. Correspondingly, BRAT-NextGen did not detect any recombined segments in any isolate, supporting a strongly
clonal population structure for *M. ulcerans* that is evolving by vertically inherited mutations.

**Phylogenetic analysis reveals strong geographical restrictions on *M. ulcerans* dispersal**

A phylogeny was reconstructed from the chromosomal SNP alignment using both maximum-likelihood (RAxML) and Bayesian (BEAST2) approaches. Figure S3 shows a well-supported ML-phylogeny that resolved the two major African lineages Mu_A1 and Mu_A2 and distinguished between the 4 BAPS-clusters within the African panel. Both the lineages and the BAPS-clusters had 100% bootstrap support and a Bayesian posterior probability of 1 (BEAST2 tree — Figure 1). The genome-based phylogeny was consistent with previously constructed phylogenies based on discriminating ISE-SNP markers even though these previous trees suffered from low branch support (Vandelannoote, et al. 2014). The tree also indicated that Mu_A1 is much more widely dispersed within the African continent than Mu_A2.

We identified an unambiguous relationship between the genotype of an isolate and its geographical origin. This is illustrated by the explicit regional clustering of *M. ulcerans* within the phylogenetic tree, indicating significant geographical structure in the African mycobacterial population. For instance, all strains isolated from patients living in the hydrological basin of the Kouffo River of southern Benin clustered together in a “basin-specific” clade in the Bayesian phylogeny (Figure 1). Our observations confirm and extend previous data showing geographical subdivisions (Ablordey, et al. 2015; Bolz, et al. 2015; Doig, et al. 2012; Roltgen, et al. 2010; Vandelannoote, et al. 2014), and indicate that when *M. ulcerans* is introduced in a particular area, it remains isolated and
localized for a sufficient amount of time to allow mutations to become fixed in that population. As such, a local genotype that is associated with that area is allowed to evolve.

We also identified a strong association between the distribution of particular genotypes and hydrological drainage areas. It appears that the borders of hydrological basins (consisting of elevated regions, and salt water) also form a barrier to bacterial spread. For instance, the isolates of the Kouffo Basin are distinct from isolates originating from the neighboring Oueme Basin, and are in fact more related to isolates from Ghana and Ivory Coast (Figure 1).

**A central role for the mycolactone producing plasmid**

All sequenced isolates carried the pMUM001 plasmid. By comparing read depths of all plasmid and chromosome positions we roughly estimated an average pMUM001 copy number of 1.3 copies per cell (range 0.4 – 1.7). Furthermore, the plasmid ML-tree (built with the discovered 81 SNPs) was observed to closely match the topology and relative branch lengths of the chromosome ML-tree (Figure S3A), which is consistent with co-evolution of the plasmid with the host-chromosome, stable maintenance of the plasmid, and absence of transfer of plasmid variants between host bacteria. This asserted the central role of the mycolactone producing plasmid in the evolution of African *M. ulcerans*. These findings, combined with the observation that mycolactone negative isogenic mutants are avirulent (George, et al. 1999), indicate that there is strong purifying selection on maintaining a functional plasmid that allows the mycobacterium to biosynthesize its primary virulence determinant mycolactone.
The substitution rate of African *M. ulcerans* is remarkably low

The major objective of this study was to estimate the rate of evolution of *M. ulcerans* in order to estimate the temporal dynamics of the spread of the pathogen across Africa. Like *Mycobacterium tuberculosis* (Comas, et al. 2013), *M. ulcerans* does not exhibit a strict molecular clock with substitution mutations occurring at a fixed regular rate, complicating temporal inferences. To overcome this potential limitation, we used a Bayesian approach with a relaxed molecular clock model to infer the evolutionary dynamics of the African mycobacterial population (See also SI text). As such, a genome scale African *M. ulcerans* time-tree was inferred (Figure 1) while also providing estimates of nucleotide substitution rates and divergence times for key *M. ulcerans* clades.

We estimated a mean genome wide substitution rate of 6.32E-8 per site per year (95% HPD interval [3.90E-8 - 8.84E-8]), corresponding to the accumulation of 0.33 SNPs per chromosome per year (95% HPD interval [0.20 - 0.46]) (excluding IS elements). To test the validity of the discovered temporal signal in the data we performed 20 permutation tests. This produced a null set of 20 “randomized” substitution rate distributions, which were significantly different (Wilcoxon test, p<2.2E-16) to the substitution rate estimate of the genuine tip-date and sequence correlation (Figure S4). This clearly indicated that the tip dates were informative and could provide sufficient calibrating information for the analysis (Holt, et al. 2012; Rieux and Balloux 2016). The estimated genome wide substitution rate is lower than the estimate for *Clostridium difficile* (1.88E-7) (He, et al. 2013) and *Shigella sonnei* (6.0E-7) (Holt, et al. 2012) yet slightly higher than that of *M. tuberculosis* (2.6E-9), the bacterium with the slowest rate currently described (Comas, et al. 2013). The analysis also indicated that the genealogy has undergone very moderate rate variation, with a 2.8-fold
difference between the slowest (3.18E-8) and the fastest (8.87E-8) evolving branches. Rate accelerations and decelerations are found interspersed in the time-tree (Figure 1). The observed slight rate variation is probably attributable to fluctuations in the number of bacterial replication cycles per time unit, changes in selection pressures through time, or combinations of these factors.

**M. ulcerans has existed in Africa for centuries and was recently re-introduced**

African Mu_A2 strains were found to form a very strongly supported (posterior probability = 1) monophyletic group with two PNG strains that were included in the analysis as outgroup, indicating a closer relationship with strains from PNG than African Mu_A1 stains. The Bayesian analysis (Figure 1) indicated furthermore that lineage Mu_A1 has been endemic in the African continent for hundreds of years ($t_{MCRA}(\text{Mu}_A1) = 68 \text{ B.C. (95\% HPD 1093 B.C. - 719 A.D.)}$). Conversely, Lineage Mu_A2 was derived to have been introduced much more recently in the African continent ($t_{MCRA}(\text{Mu}_A2) = 1800 \text{ A.D. (95\% HPD 1689 A.D. - 1879 A.D.)}$), explaining why the lineage is less common and more geographically restricted. Interestingly, the estimated time span of the Mu_A2 introduction event coincides with a historical event of particular interest: the period of Neo-imperialism (late 19th - early 20th century). During this period the European powers divided the African continent among themselves through the invasion, colonization and annexation of territory. In the absence of a known alternative reservoir, nor vector, this specific temporal association implies a human mediated Mu_A2 introduction event, whether through the introduction of *M. ulcerans* bacteria within diseased humans, or an alternative reservoir or vector.
Recent introduction of *M. ulcerans* in the Congo, Kouffo, Oueme and Nyong basins

The time-tree of African *M. ulcerans* also reveals evidence of the potential role that the so-called “Scramble for Africa” played in the spread of endemic Mu_A1 clones in three hydrological basins (Congo, Oueme & Nyong) that are particularly well covered by our isolate panel (Figure 1) (Pakenham 1993). Since, to our knowledge, no epidemiological studies were conducted in these hydrological basins until the late 1900s, whether BU was a newly introduced, versus an old expanding illness in these regions (Janssens, et al. 2005) had remained unclear to date. Close inspection of the time-tree implied that, similar to the Mu_A2 introduction event, the basin-specific introduction events coincide with the start of colonial rule (Table 2).

To situate the historical model we are suggesting here, it is important to note that inhabitants of the three regions of interest have long exploited the river and forest ecologies prior to the arrival of the European colonial powers (Giles-Vernick, et al. 2015). Many of the basin’s inhabitants relied on natural resources for their survival and as such, were continuously exposed to the lentic environments. However, it was only after the start of colonial rule that the basin associated epidemic Mu_A1 clones were introduced, presumably through the introduction of a *M. ulcerans* reservoir or vector. However, given the fact that no vector or reservoir species is known in the Afrotropic ecozone other than *Homo sapiens* (Durnez, et al. 2009; Narh, et al. 2015; Vandelannoote, et al. 2010), we postulate that it was the arrival of displaced BU-infected humans that played a role in the observed spread of *M. ulcerans*. Colonialism was commonly violent and introduced significant socio-economic changes in the three basins that often involved population displacement. In all
likelihood, displaced BU-infected humans were not directly infecting other humans as human-to-human transmission of *M. ulcerans* is extremely rare (Debacker, et al. 2003). Humans were nevertheless in all probability an important reservoir as displaced BU-infected patients with active, openly discharging lesions could contaminate the environment during water contact activities by shedding concentrated clumps of mycobacteria.

A fourth noteworthy hydrological basin is that of the Beninese Kouffo River. The timing of its basin specific introduction event (1977 A.D. (95% HPD 1959 A.D. - 1988 A.D.)) is much more recent than the three previously discussed basins. Notably, the first BU cases from this region were identified and treated in 1977 (Aguiar 1997), concurrent with the estimated introduction event.
<table>
<thead>
<tr>
<th>Hydrological Basin</th>
<th>Endemic hotspot</th>
<th>Approx. start of colonial rule</th>
<th>Mean t(MRCA)</th>
<th>95% HPD t(MRCA)</th>
<th>First reported cases</th>
</tr>
</thead>
<tbody>
<tr>
<td>Congo</td>
<td>Songololo Territory</td>
<td>1885&lt;sup&gt;a&lt;/sup&gt;</td>
<td>1905</td>
<td>1855-1941</td>
<td>1961&lt;sup&gt;d&lt;/sup&gt; (Andersen 1965)</td>
</tr>
<tr>
<td>Nyong</td>
<td>Between Ayos and Akonolinga</td>
<td>1884&lt;sup&gt;c&lt;/sup&gt;</td>
<td>1901</td>
<td>1848-1937</td>
<td>1969 (Ravisse 1977; Ravisse, et al. 1975)</td>
</tr>
<tr>
<td>Oueme</td>
<td>Southeastern Benin</td>
<td>1892&lt;sup&gt;b&lt;/sup&gt;</td>
<td>1890</td>
<td>1835-1932</td>
<td>1988 (Muelder and Nourou 1990)</td>
</tr>
</tbody>
</table>

**Table 2**: Timing of introduction events of four selected epidemic lineage Mu_A1 clones in their respective hydrological basin. <sup>a</sup> Founding of the Belgian Congo Free State; <sup>b</sup> Kingdom of Dahomey annexed into the French colonial empire; <sup>c</sup> German Empire claimed the colony of Kamerun and began a steady push inland; <sup>d</sup> Based on interviews and observations of healed lesions in the villages of the Songololo territory it was believed that *M. ulcerans* infections already existed in the area in 1935 (Meyers, et al. 1974a). Abbreviations: HDP, highest probability density interval; t(MRCA), time to most recent common ancestor.
The historic spread of *M. ulcerans* lineage Mu_A1

The phylogeographic analysis also offered new insights on the geospatial spread of *M. ulcerans* lineage Mu_A1 through time (Figure 2). Uganda, Cameroon, and Gabon occupy basal branches in the Mu_A1 time-tree indicating that the bacterium has been extant in these regions for the longest time. The lineage subsequently expanded from these regions into West and Central Africa. Ancestral state reconstruction analysis indicated that this expansion most likely occurred from the region that encompasses Benin and Nigeria (posterior probability = 0.91). From there Mu_A1 spread further west (into Togo, Ghana and Ivory Coast) and back east (into Congo, DRC and Angola).

In other bacterial pathogens, the discipline of microbial phylogeography has also proved to be a powerful means of investigating not only the spread of microbes but also the movement of their hosts. For example, interesting associations were found between the genotypes of *Helicobacter pylori* strains, their places of origin, and the migration and ethnicity of their human hosts (Linz, et al. 2007). Additionally, the spread of *M. tuberculosis* and *M. leprae* also reflects the migrations of early humans (Comas, et al. 2013; Monot, et al. 2009).

Comparable as in these landmark studies, the phylogeographic approach applied here is limited in the respect that it studies a sample of the mycobacterial population from which it then infers information about the entire population through various statistical methods. Even though our isolate panel originates from all African disease foci that have ever yielded positive *M. ulcerans* cultures, the spatial coverage of disease isolates is moderately
restricted to specific geographical areas, which might have confounded our interpretation of the historic spread of African *M. ulcerans*.
CONCLUSION

Here we reconstructed the population structure and evolutionary history of African *M. ulcerans* using the molecular and bioinformatics tools of modern population genomics. The genetic diversity of *M. ulcerans* proved restricted because of its slow substitution rate coupled with its recent origin. Sequence types appear to be maintained in geographically separated subpopulations that are associated with hydrological drainage areas. Our data suggest that the spread of *M. ulcerans* across Africa is a relatively modern phenomenon and one that has escalated since the late 19th and early 20th centuries. Using temporal associations, this work implicates human-induced changes and activities behind the expansion of BU in Africa. We hypothesise that humans with actively infected, openly discharging BU lesions inadvertently contaminated aquatic environments during water contact activities and thus played a role in the spread of the mycobacterium. Our observations on the possible role of humans as potential maintenance reservoir to sustain new BU infections suggests that interventions in a region aimed at reducing the human BU burden will at the same time break the transmission chains within that region. Active case-finding programs, improved disease surveillance, and the early treatment of pre-ulcerative infections with specific antibiotics will decrease the amounts of mycobacteria shed into the environment and may as a result reduce disease transmission. Our findings are supported by the observed decline of BU incidence recorded in some areas which profited from both improved BU surveillance and early treatment (WHO 2015).
DATA ACCESS

Read data for the study isolates have been deposited in the NCBI Sequence Read Archive (SRA) under BioProject accession PRJNA313185.

ACKNOWLEDGEMENTS

KV was supported by a PhD-grant of the Flemish Interuniversity Council - University Development Cooperation (Belgium). BdJ & CM were supported by the European Research Council-INTERRUPTB starting grant (nr.311725). TPS was supported by a fellowship from the National Health and Medical Research Council of Australia (1105525).

Funding for this work was provided by the Department of Economy, Science and Innovation of the Flemish Government, the Stop Buruli Consortium supported by the UBS Optimus Foundation, and the Fund for Scientific Research Flanders (Belgium) (FWO grant n° G.0321.07N). The computational resources used in this work were provided by the HPC core facility CalcUA and VSC (Flemish Supercomputer Center), funded by the University of Antwerp, the Hercules Foundation and the Flemish Government - department EWI. Aspects of the research in Cameroon and Benin were funded by the Raoul Follereau Fondation France. The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

We thank Tanja Stadler for helpful discussions. We thank Pim de Rijk, Wim Mulders, Krista Fissette, Elie Nduwamahoro, and Cécile Uwizeye for their excellent technical assistance.
AUTHORS’ CONTRIBUTIONS

Designed research: KV, ME, FP, HL, TPS, BJ
Performed research: KV, KM, TPS
Contributed new reagents or analytic tools: KV, CM, DA, DP, SE, TS, LM, EM, AC, JL, AF, TPS
Analysed data: KV, CM, TPS
Wrote the paper: KV, CM, TPS, KJ, BJ

DISCLOSURE DECLARATION

The authors declare that they have no conflict of interests.
FIGURE LEGENDS
Fig. 1: Bayesian maximum clade credibility phylogeny for African *M. ulcerans*. The tree was visualized and colored in Figtree v1.4.2 (Rambaut 2015). Branches are color coded according to their branch specific substitution rate (legend at top). Branches defining major lineages are annotated on the tree. Tip labels are color coded according to their respective BAPS-clusters (the best visited BAPS partitioning scheme of our sample yielded a natural log marginal likelihood of -95857). Divergence dates (mean estimates and their respective 95% HDP) are indicated in green for major nodes. Note 95% HDP intervals grow larger closer to the root of the tree as increasingly less timing calibration information is available the further one goes back in time. Geographically localized clonal expansions associated with four particular hydrological basins (Congo, Kouffo, Oueme, and Nyong) are highlighted with boxes and their corresponding $t(MRCA)$ & 95% HDP are specified in green.
Fig. 2: Geospatial distribution of African *M. ulcerans* through time. A Bayesian maximum clade credibility phylogeny is drawn for lineage Mu_A1 with branches colour coded according to their most likely location state (legend at top). Pie charts indicate location state posterior probability distributions of major nodes. The amount of location states was limited to five by merging the
disease isolates of certain neighboring countries. The genetically distinct Ugandan singleton node (which represents its own BAPS-cluster) was omitted from the analysis as multiple isolates are required per cluster. Divergence dates (mean estimates and their respective 95% HDP) are indicated in green for nodes that fall outside of the time scale. A number of oversampled localized clonal expansions are collapsed in the tree with the size of their representing cartoon proportional to the amount of collapsed taxa. The tips of the tree are connected to the location of residence of patients from whom the isolate was grown.

Fig. S1: Distribution of BU in Africa by country, as of 2016. Relative endemicity is denoted as high (red), moderate (yellow), and low (green); dots denote countries with suspected BU cases. Stars represent the residence of BU patients from whom *M. ulcerans* disease isolates were grown at the time of
clinical visit. In the case where residence information was missing we used the location of the hospital supplying the sample. Five countries (Equatorial Guinea, Kenya, Liberia, Sierra Leone, and South Sudan) that have reported a limited number of BU cases in the past (Janssens, et al. 2005) were not included in the study due to a lack of isolates.

Fig. S2: Distribution of SNPs identified compared to the Ghanaian *M. ulcerans* Agy99 reference genome. The Y-axis corresponds to SNP counts per 10,000bp window, the dashed line indicates the average rate of 16 SNPs per 10,000bp (or 1 SNP per 613 bp window).
Fig. S3: Maximum-likelihood phylogeny of African *M. ulcerans* based on 9,193 SNP differences detected across the whole core genome of 167 sequenced isolates. Branches defining major lineages are annotated on the tree. Nodes in the tree with bootstrap support below a set threshold of 70% were collapsed to polytomies, while preserving the length of the tree. The tree was rooted with...
the two PNG strains as outgroup. Branches are color coded according to their respective BAPS-clusters as indicated in the legend. Branches defining major lineages are further annotated on the tree. Tip labels are color coded according to country of isolation. Inset A: Maximum-likelihood phylogeny of the plasmid which was constructed from 81 SNPs identified in the non-repetitive regions of pMUM001. The topology and relative branch lengths of the plasmid tree match those of the chromosomal tree. Inset B: Linear regression analysis of year of isolation vs root-to-tip distances extracted from chromosomal ML-phylogeny. Linear regression lines (with 95% CI) and Spearman's rank correlation coefficients are indicated separately for each lineage.
Fig. S4: Comparison of Bayesian estimates of nucleotide substitution rates for real and randomized tip dates. Filled squares & circles represent mean estimates, while bars indicate values of the 95% highest probability density (HDP) interval. The estimate obtained using the real tip date associations (circle) is shown to the far right while estimates from random associations
(squares) are shown to the left. All randomized data sets were analyzed in BEAST2 using identical model settings as used in the analysis of the real tip date data. Note the y-axis is on the log scale.
REFERENCES


Quantum_GIS. 2012. Quantum GIS Geographic Information System Open Source Geospatial Foundation Project.


Stinear TP, et al. 2007. Reductive evolution and niche adaptation inferred from the genome of Mycobacterium ulcerans, the causative agent of Buruli ulcer. Genome research 17: 192-200. doi: 10.1101/gr.5942807


WHO. 2015. WHO meeting on Buruli ulcer Control and Research: Summary report of the control group. In.

