

1                   **BWA-mem is not the best aligner for ancient DNA short reads**

2                   Adrien Oliva<sup>1</sup>, Raymond Tobler<sup>1,2</sup>, Bastien Llamas<sup>1,2,3</sup>, Yassine Souilmi<sup>1,2,3,\*</sup>

3                   <sup>1</sup>Australian Centre for Ancient DNA, School of Biological Sciences, Faculty of Sciences, The University  
4                   of Adelaide, Adelaide SA 5005, Australia

5                   <sup>2</sup> The Environment Institute, Faculty of Sciences, The University of Adelaide, Adelaide SA 5005,  
6                   Australia

7                   <sup>3</sup> National Centre for Indigenous Genomics, Australian National University, Canberra, ACT 0200,  
8                   Australia

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10                  \*Corresponding Author: Y.S. [yassine.souilmi@adelaide.edu.au](mailto:yassine.souilmi@adelaide.edu.au)

11 **Abstract**

12 Xu and colleagues (Xu et al., 2021) recently suggested a new parameterisation of *BWA-mem* (Li, 2013)  
13 as an alternative to the current standard *BWA-aln* (Li and Durbin, 2009) to process ancient DNA  
14 sequencing data. The authors tested several combinations of the -k and -r parameters to optimise  
15 *BWA-mem*'s performance with degraded and contaminated ancient DNA samples. They report that  
16 using *BWA-mem* with -k 19 -r 2.5 parameters results in a mapping efficiency comparable to *BWA-aln*  
17 with -l 1024 -n 0.03 (i.e. a derivation of the standard parameters used in ancient DNA studies;  
18 (Schubert et al., 2012)), while achieving significantly faster run times.

19 We recently performed a systematic benchmark of four mapping software (i.e. *BWA-aln*, *BWA-mem*,  
20 *NovoAlign* (<http://www.novocraft.com/products/novoalign>), and *Bowtie2* (Langmead and Salzberg,  
21 2012) for ancient DNA sequencing data and quantified their precision, accuracy, specificity, and impact  
22 on reference bias (Oliva et al., 2021). Notably, while multiple parameterisations were tested for *BWA-*  
23 *aln*, *NovoAlign*, and *Bowtie2*, we only tested *BWA-mem* with default parameters.

24 Here, we use the alignment performance metrics from Oliva et al. to directly compare the  
25 recommended *BWA-mem* parameterisation reported in Xu et al. with the best performing alignment  
26 methods determined in the Oliva et al. benchmarks, and we make recommendations based on the  
27 results.

28 **Methods**

29 We investigated the alignment performance of the parameterisation recommended by Xu et al., i.e. -  
30 k 19 and -r 2.5 (hereafter called BWA9) against several of the best performing strategies identified in  
31 Oliva et al. (namely, BWA1, BWA2, BWA8, Novo1IUPAC, Novo2IUPAC, and Novo2, see Table 1 for  
32 parameter settings).

33 Following the analytical framework of Oliva et al., our benchmark is based on simulated reads  
34 (including fragmentation, damage, and sequencing errors typical for ancient DNA samples; see (Oliva  
35 et al., 2021)) that were generated for each of the following three samples from the 1000 Genome  
36 Project (1000 Genomes Project Consortium et al., 2015) dataset, each coming from a distinct  
37 population, and were aligned to reference genome GRCh37:

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- 39 • Individual *HG00119* from the British in England and Scotland population; GBR; labelled Europe  
in this study.
- 40 • Individual *NA19471* from the Luhya population in Webuye, Kenya; LWK; labelled Africa in this  
study.

42     ● *Individual HG00513* from the Han Chinese population in Beijing, China; CHB; labelled East Asia  
43     in this study.

44     In addition to quantifying read alignment precision (i.e. the proportion of correctly aligned reads  
45     relative to all aligned reads) and proportion of aligned reads (i.e. the fraction of aligned reads relative  
46     to the total number of simulated reads) for each strategy, we tested the specificity (i.e., the fraction  
47     of unmapped reads) of these strategies for two sets of potential contaminants—i.e. bacterial and dog  
48     reads—that were also used in Oliva et al., 2021.

49     **Results**

50     BWA9 had a slight improvement in the proportion of total reads aligned relative to *BWA-mem* using  
51     default settings (BWA8), but this came at the cost of consistently lower precision (Figure 1). These  
52     precision differences are particularly accentuated for reads between 30 to 60bp, the range of read  
53     lengths that is typical of ancient DNA. As demonstrated here and in more detail in our recent alignment  
54     software benchmark (Oliva et al., 2021), *BWA-aln* (BWA1 and BWA2) is the most precise alignment  
55     method amongst the tested strategies, having moderately higher precision relative to *BWA-mem* for  
56     shorter reads while mapping a much higher percentage of reads overall (Oliva et al., 2021; van der  
57     Valk et al., 2021).

58     When comparing specificity against potential contaminants, BWA9 has a near identical specificity to  
59     the default *BWA-mem* parameterisation (BWA8) for dog reads, and slightly poorer specificity when  
60     testing with bacterial reads, but both parameterisations perform considerably worse than the tested  
61     *NovoAlign* (Novo1IUPAC, Novo2IUPAC, and Novo2) and *BWA-aln* (BWA1 and BWA2) strategies for dog  
62     reads (Figure 2).

63     Finally, comparing running times of the two *BWA-mem* parameterisations for each of the three  
64     simulated human datasets showed that BWA9 is slightly quicker than BWA8 (Figure 3), confirming the  
65     results of ref. (Xu et al., 2021).

66 **Conclusion**

67 Xu et al. report that *BWA-mem* produces alignment results that are comparable to a derivation of the  
68 widely used *BWA-aln* in the ancient DNA field. Consequently, they recommend the use of a specific  
69 non-default *BWA-mem* parameterisation for ancient DNA studies because of its superior runtime and  
70 specificity relative to *BWA-aln*. However, we find that this parameterisation actually decreases  
71 alignment precision relative to *BWA-mem* using default settings for sequencing reads shorter than 70  
72 bases, which are particularly abundant in ancient DNA samples. Moreover, *BWA-mem* is consistently  
73 outperformed by *BWA-aln* under the tested parameterisations for both precision and the proportion  
74 of reads mapped, and also had greatly improved specificity when the DNA contamination came from  
75 a phylogenetically related organism (i.e. a dog in the present study). Crucially, Oliva et al. have  
76 demonstrated that improvements in these alignment metrics are also complemented by a reduction  
77 in reference genome bias—an alignment-related bias that can inflate false positives and is particularly  
78 problematic for ancient DNA studies.

79 Accordingly, despite having improved run times, we do not recommend that *BWA-mem* is prioritised  
80 over *BWA-aln* for research using short reads—such as ancient DNA, cell-free DNA, and forensic  
81 research fields. If run time is an issue for researchers, we recommend the use of *NovoAlign* using the  
82 free default parameterisation, so long as an appropriate IUPAC reference can be generated. Readers  
83 interested in more detailed discussion of these issues are directed to refs. (Oliva et al., 2021; Poulet  
84 and Orlando, 2020; Schubert et al., 2012; van der Valk et al., 2021) for recent benchmarks of different  
85 alignment strategies using short reads.

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91 **Conflict of Interest:** The authors declare no conflict of interest.

92 **Data Accessibility**

93 The scripts used to create the used datasets in this study are available in the github repository at:  
94 <https://github.com/AdrienOliva/Benchmark-aDNA-Mapping>.

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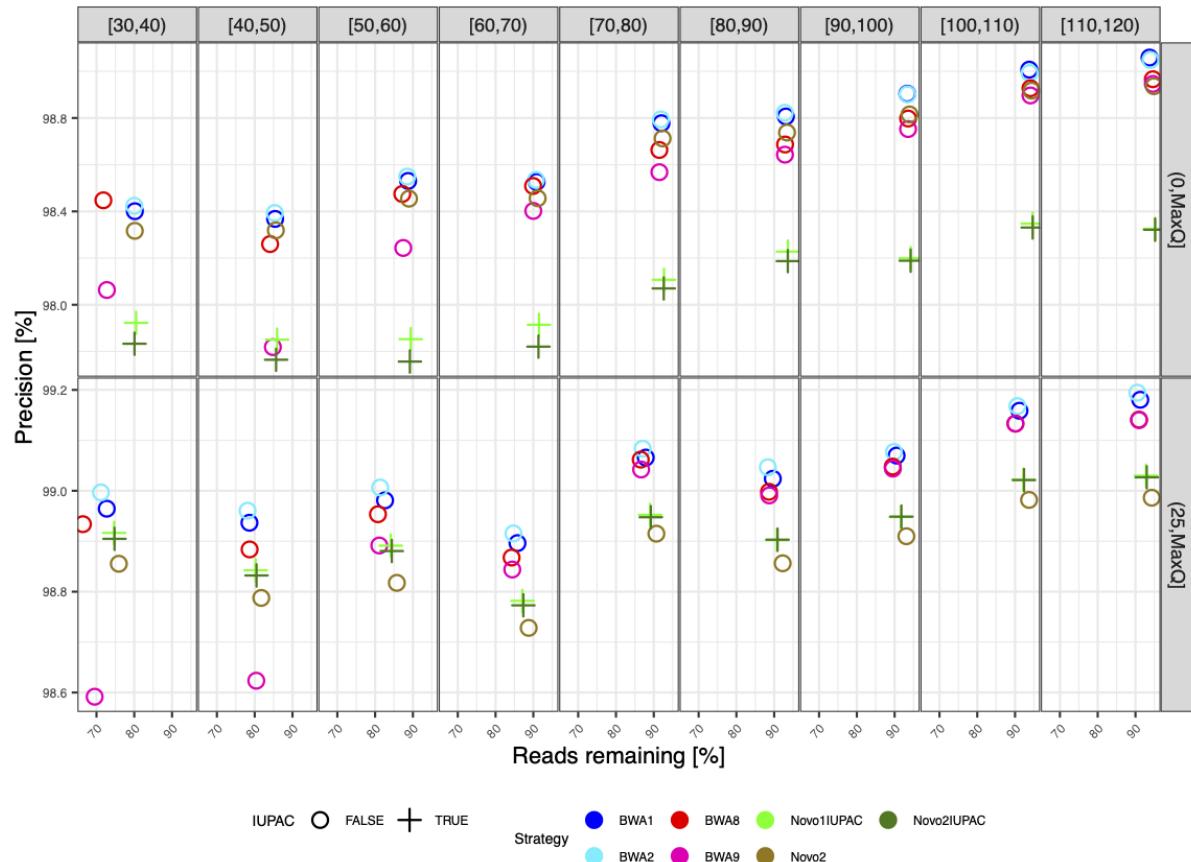
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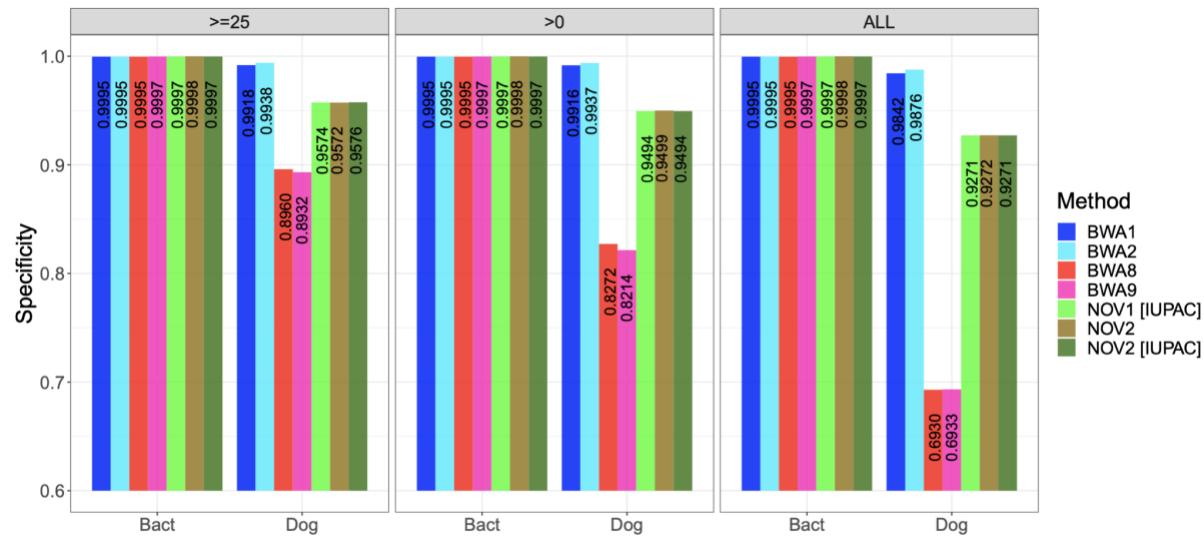
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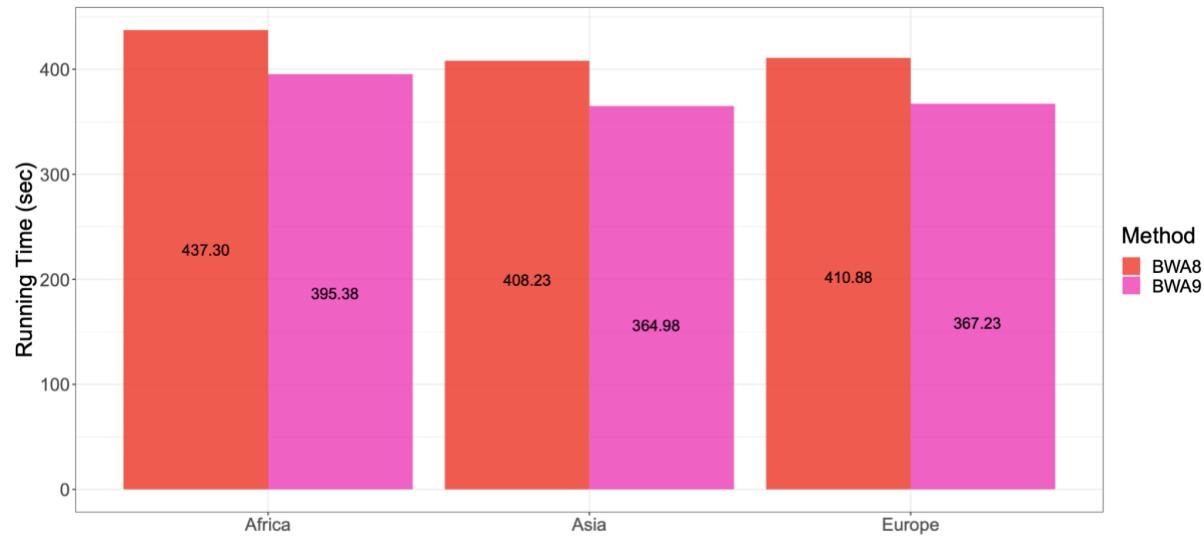
120 **Figure 1. Alignment precision relative to read length and mapping quality for the simulated East**  
121 **Asian sample.** Results are shown for seven parameterisations of four different alignment software,  
122 including an IUPAC reference-based alignment for a subset of the *NovoAlign* parameterisations (see  
123 key). BWA9 is the *BWA-mem* strategy recommended by Xu et al., 2021, with parameter details for the  
124 other strategies provided in Table 1. The panels in each row show results after applying the specific  
125 mapping quality filter, which results in the removal of all reads below the required mapping quality.  
126 Results were similar for the simulated European and African samples and are shown in Appendix  
127 Figures 1 and 2, respectively.

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130 **Figure 2. Specificity of all tested alignment methods.** Bacterial and dog reads were aligned to the  
131 GRCh37 reference using the seven tested parameterisations of four different alignment software,  
132 including an IUPAC reference-based alignment for a subset of the *NovoAlign* parameterisations (see  
133 key). The specificity corresponds to the number of unmapped reads, with higher values being better.



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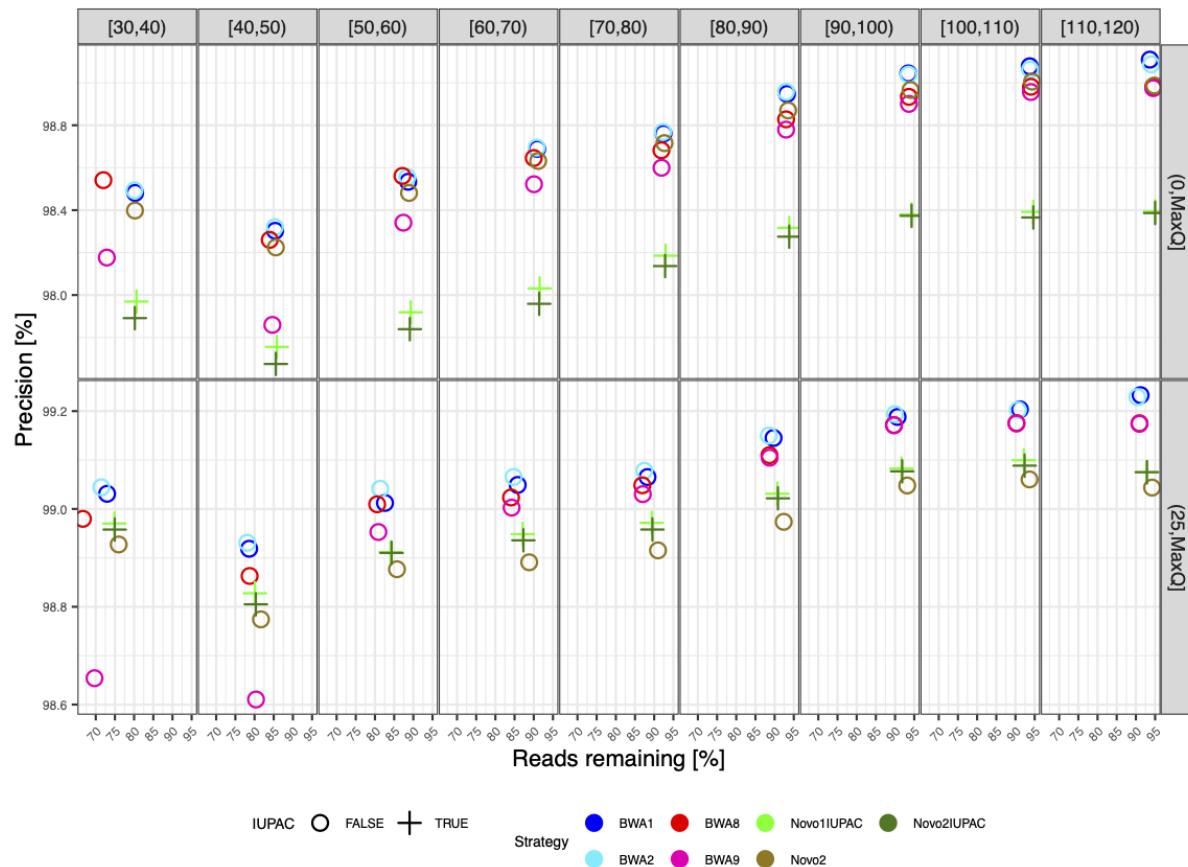
135 **Figure 3: Execution time for each of the BWA-mem strategies.** The execution time (walltime) in  
136 seconds of BWA8 (default parameters) and BWA9 (Xu et al. parameterisation; -k 19 -r 2.5) based on  
137 1.5 million simulated reads.

138 **Table 1. Different alignment parameterisations tested.**

Method	Software	Parameterisation
BWA1	<i>BWA-aln</i>	-l 1024 -n 0.01 -o 2
BWA2	<i>BWA-aln</i>	-l 1024
BWA8	<i>BWA-mem</i>	default
BWA9	<i>BWA-mem</i>	-k 19 -r 2.5
Novo1IUPAC	<i>NovoAlign</i>	-k
Novo2(IUPAC)*	<i>NovoAlign</i>	default

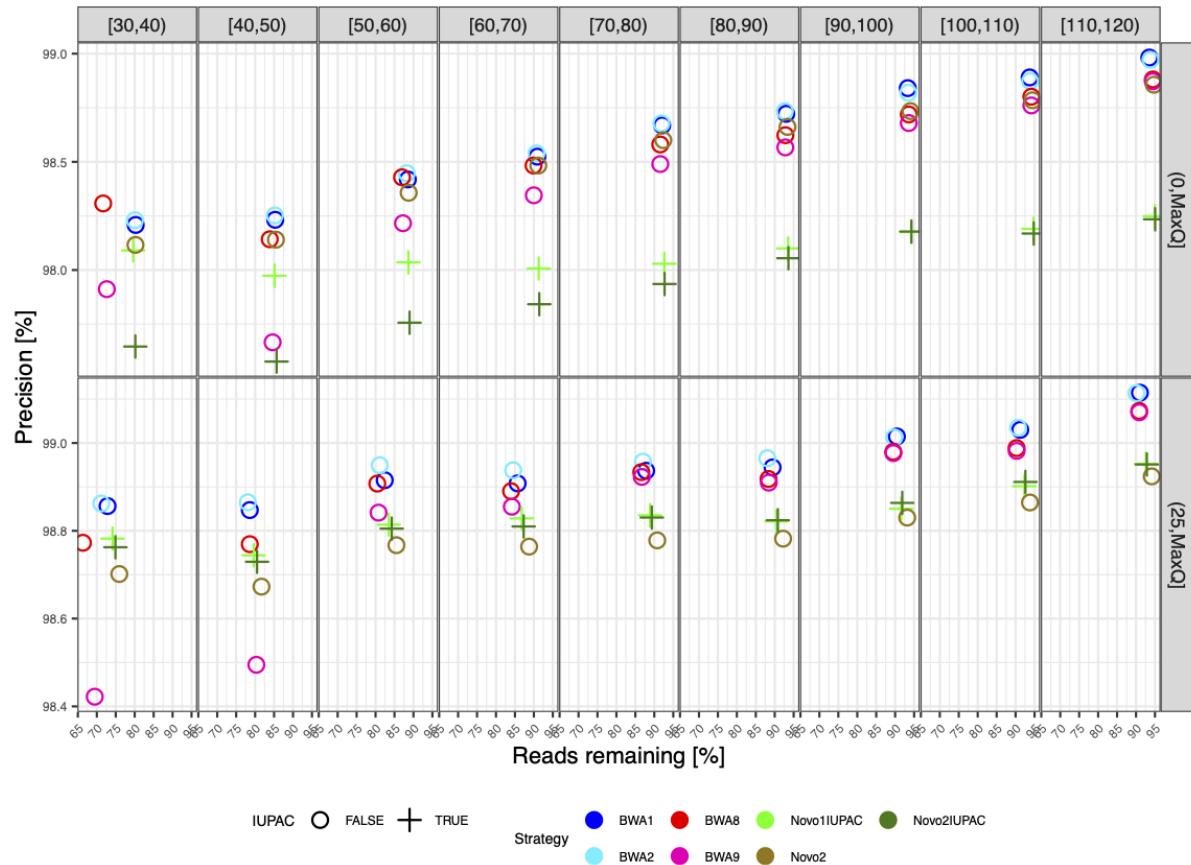
139 \*Used with and without the IUPAC reference (Novo2 and Novo1IUPAC).

140 **Appendix**



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142 **Appendix Figure 1: Alignment precision relative to read length and mapping quality for the**  
143 **simulated European sample. See Figure 1.**



144

145 **Appendix Figure 2: Alignment precision relative to read length and mapping quality for the**  
146 **simulated African sample. See Figure 1.s**