An open dataset of *Plasmodium falciparum* genome variation in 7,000 worldwide samples

MalariaGEN Plasmodium falciparum Community Project

Mapping genetic markers to resistance status classification

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In the accompanying data release we have classified all samples into different types of drug resistance based on published genetic markers including SNPs and copy number variations (CNVs). The methods of classification are heuristic and represent a best attempt based on the available data. Our aim is to improve the accuracy of classification in future data releases, as new sources of evidence become available on the relationship between genotype and drug resistance phenotype.

Each type of resistance was considered to be either present, absent or unknown for a given sample. We have not attempted to make a quantitative assessment of the level of drug resistance, which may depend on complex genetic interactions that remain poorly understood.

This is more problematic for some types of resistance than others. For example, the *crt* 76T allele is a very reliable marker of chloroquine resistance, whereas there are various degrees of resistance to sulfadoxine-pyrimethamine (SP) that are determined by complex interactions between multiple mutations in the *dhfr* and *dhps* genes. Where appropriate, we used the simplest approach, e.g. the *dhfr* 108N allele appears sufficient for clinically significant treatment failure, and so parasites were classified as pyrimethamine resistant if this mutation was present irrespective of other *dhfr* and *dhps* alleles.

This document describes the heuristic utilised for each of the following drugs or combination of drugs:

- Chloroquine
- Pyrimethamine
- Sulfadoxine
- Mefloquine
- Artemisinin
- Piperaquine
- Sulfadoxine-Pyrimethamine (SP) when used for the treatment of uncomplicated cases
- SP when used for Intermittent Preventive Treatment in Pregnancy (IPTp)
- Artesunate-mefloquine

• Dihydroartemisinin-piperaquine

For each drug, the rules have priorities and are applied sequentially according to the "Step" column with the first successful criterion determining the classification and stopping the procedure. For example, a sample is only considered to be "Undetermined" for artemisinin resistance if it has no mutation from the lists of mutations given, or else if it has no mutation but at least one missing genotype call between amino acids 349 and 726. If there is both a non-synonymous mutation associated with resistance and any missingness, the sample will be considered resistant because the rule concerning the non-synonymous mutation is triggered before the rule concerning missingness.

The inferred resistance status classifications for all samples can be found on the resource page at https://www.malariagen.net/resource/26.

Chloroquine

Info on the drug: https://en.wikipedia.org/wiki/Chloroquine

Locus utilized: PF3D7_0709000 (crt)

Codon: 76

Workflow:

Step	Genetic change	Interpretation	Classification
1	76 K/T heterozygote	Heterozygous mutant	Undetermined
2	76 missing	Missing	Undetermined
3	K76	Wild type	Sensitive
4	76T	Mutant	Resistant
5	otherwise	Unknown mutant	Undetermined

References:

• Djimdé, A., Doumbo, O. K., Steketee, R. W. & Plowe, C. V. Application of a molecular marker for surveillance of chloroquine-resistant falciparum malaria. *Lancet* 358, 890–891 (2001).

Notes:

• There is evidence linking SNPs in the gene *mdr1* with some level of chloroquine resistance. However their impact on clinical phenotypes and the interactions with *crt* mutations is not fully understood hence the decision to not use that in the classification at this stage.

Pyrimethamine

Info on the drug: https://en.wikipedia.org/wiki/Pyrimethamine

Locus utilized: PF3D7_0417200 (dhfr)

Codon: 108

Workflow:

Step	Genetic change	Interpretation	Classification
1	108 S/N heterozygote	Heterozygous mutant	Undetermined
2	108 missing	Missing	Undetermined
3	S108	Wild type	Sensitive
4	108N	Mutant	Resistant
5	otherwise	Unknown mutant	Undetermined

References:

• Cowman, A. F., Morry, M. J., Biggs, B. A., Cross, G. A. & Foote, S. J. Amino acid changes linked to pyrimethamine resistance in the dihydrofolate reductase-thymidylate synthase gene of Plasmodium falciparum. *Proc. Natl. Acad. Sci. U. S. A.* **85**, 9109–13 (1988)

Notes:

• The allele 108N appears to be necessary and sufficient for clinical resistance to pyrimethamine. However different set of mutations in the gene have been associated with various levels of resistance. To date the link between those mutations and the clinical outcome is not completely understood hence the decision to not consider those mutations in the classification.

Sulfadoxine

Info on the drug: https://en.wikipedia.org/wiki/Sulfadoxine

Locus utilized: PF3D7_0810800 (dhps)

Codon: 437

Workflow:

Step	Genetic change	Interpretation	Classification
1	437 A/G heterozygote	Heterozygous mutant	Undetermined
2	437 missing	Missing	Undetermined
3	A437	Wild type	Sensitive
4	437G	Mutant	Resistant
5	otherwise	Unknown mutant	Undetermined

References:

• Triglia, T., Wang, P., Sims, P. F. G., Hyde, J. E. & Cowman, A. F. Allelic exchange at the endogenous genomic locus in Plasmodium falciparum proves the role of dihydropteroate synthase in sulfadoxine-resistant malaria. *The EMBO Journal* **17**, (1998)

Notes:

• Although the 3D7 sequence translates as a G at 437, this is thought to be the mutant allele, i.e. 3D7 does not have the wild type allele.

Mefloquine

Info on the drug: https://en.wikipedia.org/wiki/Mefloquine

Locus utilized: PF3D7_0523000 (mdr1)

Codons: Amplification status of whole gene

Workflow:

Step	Genetic change	Interpretation	Classification
1	Missing	Missing	Undetermined
2	Heterozygous duplication	Heterozygous mutant	Undetermined
3	Single copy	Wild type	Sensitive
4	Multiple copies	Mutant	Resistant

References:

• Price, R. N. *et al.* Mefloquine resistance in Plasmodium falciparum and increased pfmdr1 gene copy number. *Lancet* **364**, 438–447 (2004)

Artemisinin

Info on the drug: https://en.wikipedia.org/wiki/Artemisinin

Locus utilized: PF3D7_1343700 (kelch13)

Codons: 349-726 (BTB/POZ and propeller domains)

Workflow:

Step	Genetic change	Interpretation	Classification
1	Homozygous non-synonymous mutations in the <i>kelch13</i> BTB/POZ and propeller domain classified by the World Health Organisation as associated with delayed parasite clearance	Mutant – associated with delayed clearance	Resistant
2	Heterozygous non-synonymous mutations in the <i>kelch13</i> BTB/POZ and propeller domain classified by the World Health Organisation as associated with delayed parasite clearance	Mutant - heterozygous	Undetermined
3	578S as homozygous	Mutant - not associated	Sensitive
4	Any missing call in amino acids 349-726	Missing	Undetermined
5	No non-reference calls in amino acids 349-726	Wild-type	Sensitive
6	otherwise	Mutant - not in WHO list	Undetermined

References:

• World Health Organization. Artemisinin and artemisinin-based combination therapy resistance: status report. (2018) https://apps.who.int/iris/handle/10665/274362.

- Current WHO classification of resistance mutations in the kelch13 BTB/POZ and propeller domain:
 - o Validated: F446I, N458Y, M476I, Y493H, R539T, I543T, P553L, R561H, C580Y
 - Candidate/associated: P441L, G449A, C469F, A481V, P527H, N537I, G538V, V568G, P574L, F673I, A675V
 - Potential: D452E, C469Y, K479I, R515K, S522C, N537D, R575K, M579I, D584V, P667T, H719N

Piperaquine

Info on the drug: https://en.wikipedia.org/wiki/Mefloquine

Loci utilized: PF3D7_1408000 (plasmepsin 2) and PF3D7_1408100 (plasmepsin 3)

Codons: Amplification status of both genes

Workflow:

Step	Genetic change	Interpretation	Classification
1	Missing	Missing	Undetermined
2	Heterozygous duplication	Heterozygous mutant	Undetermined
3	Single copy	Wild type	Sensitive
4	Multiple copies	Mutant	Resistant

References:

• Amato, R. *et al.* Genetic markers associated with dihydroartemisinin–piperaquine failure in Plasmodium falciparum malaria in Cambodia: a genotype–phenotype association study. *Lancet Infect. Dis.* **17**, 164–173 (2017)

Sulfadoxine-Pyrimethamine (treatment)

Info on the drugs combination: https://en.wikipedia.org/wiki/Sulfadoxine/pyrimethamine

Locus utilized: PF3D7_0417200 (dhfr)

Codons: 51, 59 and 108

Workflow:

Step	Genetic change	Interpretation	Classification
1	N51 or C59 or S108	Not triple mutant (at least one allele is WT)	Sensitive
2	51I and 59R and 108N, all homozygous	Mutant	Resistant
3	otherwise	Missing or unknown combination	Undetermined

References:

 Nzila, A. M. et al. Towards an Understanding of the Mechanism of Pyrimethamine-Sulfadoxine Resistance in Plasmodium falciparum: Genotyping of Dihydrofolate Reductase and Dihydropteroate Synthase of Kenyan Parasites. 44, (2000)

- Also known as the "triple mutant" and associated with "partial resistance"
- Only need one wild-type allele to determine sample is "Sensitive", even if other alleles are mutant or missing

Sulfadoxine-Pyrimethamine (IPTp)

Info on the drugs combination: https://en.wikipedia.org/wiki/Sulfadoxine/pyrimethamine

Locus utilized: PF3D7_0417200 (dhfr) and PF3D7_0810800 (dhps),

Codons: dhfr, codons 51, 59, 108 and 164 and dhps, codons 437, 540, 581 and 613

Workflow:

Step	Genetic change	Interpretation	Classification
1	dhfr: N51 or C59 or S108 or dhps: A437 or K540 or all of dhfr:I164 and dhps:A581 and dhps:A613	Not sextuple mutant (at least one allele is WT)	Sensitive
2	dhfr: 51I and 59R and 108N and dhps: 437G and 540E and one of dhfr:164L, dhps:581G, dhps:613S or dhps:613T with all mutants homozygous	Sextuple mutant	Resistant
3	otherwise	Missing or unknown combination	Undetermined

References:

• Naidoo, I. & Roper, C. Mapping 'partially resistant', 'fully resistant', and 'super resistant' malaria. *Trends Parasitol.* **29**, 505–515 (2013)

Notes:

• Also known as the "sextuple mutant" and associated with "super resistance"

Artesunate-mefloquine

Info on the drugs combination: https://en.wikipedia.org/wiki/Artesunate/mefloquine

Loci utilized: PF3D7_1343700 (kelch13) and PF3D7_0523000 (mdr1)

Codons: *kelch13*, codons 349-726 and amplification of *mdr1*

Workflow:

Step	Genetic change	Interpretation	Classification
1	Lack of WHO kelch13 mutant or single copy of mdr1	Wild type for at least one component	Sensitive
2	WHO kelch13 mutant and multiple copies of mdr1	Mutant	Resistant
3	otherwise	Unknown	Undetermined

- The classification here is determined by the classification from the Artemisinin and Mefloquine sections above.
- Only one "Sensitive" classification from Artemisinin or Mefloquine classifications is needed to determine sample is "Sensitive", even if other classification is "Resistant" or "Undetermined".

Dihydroartemisinin-piperaquine

Info on the drugs combination: https://en.wikipedia.org/wiki/Artesunate/mefloquine

Loci utilized: PF3D7_1343700 (kelch13), PF3D7_1408000 (plasmepsin 2) and PF3D7_1408100 (plasmepsin 3)

Codons: *kelch13*, codons 349-726 and amplification of both PF3D7_1408000 (*plasmepsin 2*) and PF3D7_1408100 (*plasmepsin 3*)

Workflow:

Step	Genetic change	Interpretation	Classification
1	Lack of WHO K13 mutant or single copy of pm2/3	Wild type for at least one component	Sensitive
2	WHO K13 mutant and multiple copies of pm2/3	Mutant	Resistant
3	otherwise	Unknown	Undetermined

- The classification here is determined by the classification from the Artemisinin and Piperaquine sections above
- Only one "Sensitive" classification from Artemisinin or Piperaquine classifications is needed to determine sample is "Sensitive", even if other classification is "Resistant" or "Undetermined"