



# Low-Abundance Drug-Resistant HIV-1 Variants in Antiretroviral Drug-Naive Individuals: A Systematic Review of Detection Methods, Prevalence, and Clinical Impact

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*Background.* The presence of high-abundance drug-resistant HIV-1 jeopardizes success of antiretroviral therapy (ART). Despite numerous investigations, the clinical impact of low-abundance drug-resistant HIV-1 variants (LA-DRVs) at levels <15%–25% of the virus population in antiretroviral (ARV) drug-naive individuals remains controversial.

*Methods.* We systematically reviewed 103 studies assessing prevalence, detection methods, technical and clinical detection cutoffs, and clinical significance of LA-DRVs in antiretroviral drug-naive adults.

**Results.** In total, 14 919 ARV drug-naive individuals were included. Prevalence of LA-DRVs (ie, proportion of individuals harboring LA-DRVs) was 0%–100%. Technical detection cutoffs showed a 4 log range (0.001%–10%); 42/103 (40.8%) studies investigating the impact of LA-DRVs on ART; 25 studies included only individuals on first-line nonnucleoside reverse transcriptase inhibitor-based ART regimens. Eleven of those 25 studies (44.0%) reported a significantly association between preexisting LA-DRVs and risk of virological failure whereas 14/25 (56.0%) did not.

**Conclusions.** Comparability of the 103 studies is hampered by high heterogeneity of the studies' designs and use of different methods to detect LA-DRVs. Thus, evaluating clinical impact of LA-DRVs on first-line ART remains challenging. We, the WHO HIVResNet working group, defined central areas of future investigations to guide further efforts to implement ultrasensitive resistance testing in routine settings.

**Keywords.** HIV-1; antiretroviral therapy; HIV-1 drug resistance; low-abundance drug-resistant HIV-1 variants; antitretroviral drug-naive individuals; next-generation sequencing; minority variants.

Since its introduction, antiretroviral therapy (ART) has greatly reduced global mortality rates and lengthened the lifespan of people living with human immunodeficiency virus (HIV) [1, 2]. However, despite its potency, the efficacy of ART in suppressing viral replication can be jeopardized by the presence of drug resistance [3]. Recognizing the potential consequences of drug resistance in achieving HIV epidemic control, the World Health Organization's *Global Action Plan on HIV Drug Resistance* 

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2017–2021 defines areas where improved collective efforts are needed to strengthen the monitoring, prevention, and response to HIV drug resistance [4]. Using the framework of the Global Action Plan, WHO HIVResNet—a network of HIV drug resistance experts coordinated by WHO—developed a prioritized list of research gaps [5] that, once addressed, will enhance the ability to monitor resistance and interpret its impact on ART outcomes. These priority areas include the need for: (1) an improved understanding of optimal methods to detect low-abundance drugresistant HIV-1 variants (LA-DRVs), often referred to as minority variants; (2) defining the appropriate technical and clinical detection thresholds for various types of assays; and (3) characterizing the clinical relevance of LA-DRVs in ARV drug-naive people initiating treatment with drugs to which LA-DRVs are present at varying levels of the viral population (or quasispecies) [5].

In HIV-1 infected, antiretroviral drug-naive individuals, LA-DRVs may arise due to de novo mutagenesis as a result of

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error-prone replication or by transmission from an HIV-1-infected antiretroviral drug-treated person [6]. In clinical practice, DRVs are commonly detected by population, Sanger-based sequencing of the HIV-1 pol gene [7]. LA-DRVs present at less than 15%-25% of the circulating viral population may not be detected by population sequencing [8, 9]. However, with the advent of more sensitive methods such as next-generation sequencing (NGS), virus variants present at low frequencies within the virus population of individuals can be detected. Several techniques to detect LA-DRVs have been developed. Some of the earliest methods included particularly allelespecific real-time polymerase chain reaction (AS-PCR) [10]. All of these techniques have different thresholds or cutoffs for detecting low-abundance variants, and specific strengths and limitations [11]. More recently, NGS has revolutionized the detection of LA-DRVs and is increasingly used for genotypic HIV-1 drug resistance testing worldwide [12, 13].

It has been shown that LA-DRVs can be detected in individuals acutely or recently infected with HIV-1 [14–19], and their transmission has been documented [20, 21], although these are probably very rare events. Although several reports indicate that the presence of drug-resistant HIV-1 at high abundance may affect future efficacy of ART, the clinical importance of LA-DRVs at time of treatment initiation remains uncertain, with some but not all studies reporting an association between LA-DRVs and suboptimal treatment outcomes. In this systematic review, we generate an up-to-date assessment of the prevalence, detection methods, technical and clinical detection cutoffs, and the clinical significance of LA-DRVs in antiretroviral drug-naive adults. This review is important to guide further efforts to implement resistance testing in routine settings for patient care and surveillance, in an evolving antiretroviral drug landscape.

## **METHODS**

#### Search Strategy

We searched PubMed's MEDLINE database for publications using 8 search strings constructed for Medline. Our search included every related article added to PubMed since its creation through 31 May 2019. Articles that contained all or some of the string words in the title or abstract were screened for inclusion. The search strings used in different combinations were: "HIV drug resistance," "minority variants," "minority mutations," "minority quasispecies," "low frequency variants," "lowabundance variants," "allele-specific," "deep sequencing," and "next-generation sequencing."

## **Inclusion Criteria for Eligible Studies**

A study was included if it mentioned the detection, prevalence (ie, the proportion of individuals harboring LA-DRVs), and/or clinical impact of LA-DRVs in ARV drug-naive adults. Infections caused by any HIV-1 subtype were included; only articles written in English were considered.

## **Exclusion Criteria for Noneligible Studies**

Studies including only ARV drug-experienced individuals (ie, long- or short-term ART, the latter particularly applied for prevention of mother-to-child transmission of HIV). In addition, reviews, brief communications, conference proceedings, abstracts, or posters were excluded because of the very limited information that they provided or because of duplication of the information in full articles. All duplicate publications from the different search string results were removed.

#### RESULTS

#### **Summary of Study Characteristics**

Applying the 8 search strings to PubMed, we found 1074 publications, the majority of which were duplicates. Of the 1074 publications, 204 were retained with contents matching the search strings. Ninety-two publications met inclusion criteria (Figure 1) [14–105]. Eight publications reported on 2–3 studies each, thus in total 103 studies were included in the analysis (Supplementary Table 1). Across the studies, numbers of participants ranged from 1 to 1148, with a median of 65 (interquartile range, 27–162) individuals (Table 1). Most participants were sampled between the years 2001 and 2014. The earliest specimens were collected in 1994 [20, 21] and the latest in 2016

**1074** Full text publications from PubMed using the following search strings (Date: 31 May 2019)

- 198 PubMed: HIV drug resistance AND deep sequencing
- 199 PubMed: HIV drug resistance AND next-generation sequencing
- 84 PubMed: HIV drug resistance AND allele-specific
- 124 PubMed: HIV drug resistance AND low frequency variants
- 24 PubMed: HIV drug resistance AND low abundance variants
- 38 PubMed: HIV drug resistance AND minority quasispecies
- 234 PubMed: HIV drug resistance AND minority mutations
  173 PubMed: HIV drug resistance AND minority variants

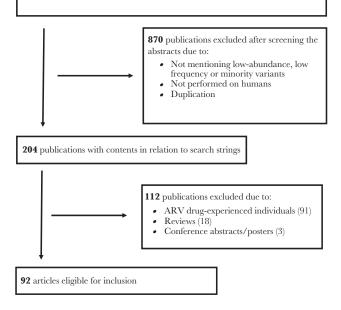


Figure 1. Summary of study search and selection procedure. Abbreviations: ART, antiretroviral therapy; HIV, human immunodeficiency virus.

Table 1. Summary of All Publications on Detection, Prevalence, and/or Clinical Impact of Low-Abundance Drug-Resistant HIV-1 Variants in ARV Drug-Naive, Adult Individuals (92 Publications, 103 Studies)

Parameter	Studies, n (%)
Number of participants, median (min–max)	65 (1–1148)
Stage of HIV-1 infection at time of inclusion	
Acute/recent (Mainly) chronic Not specified	17 (16.5) 44 (42.7) 42 (40.8)
Type of specimen used for LA-DRVs detection	
Plasma PBMCs Serum Dried blood spot CSF Virus isolate	97 (94.2) 10 (9.7) 4 (3.9) 1 (1.0) 1 (1.0) 1 (1.0)
Geographic area	
Europe North America Africa Asia Latin America Worldwide Europe/North America Not specified	40 (38.8) 21 (20.4) 19 (18.4) 12 (11.7) 4 (3.9) 4 (3.9) 2 (1.9) 1 (1.0)
Type of study	
Prevalence Prevalence and clinical impact of LA-DRVs Case-control studies Case reports Meta-analysis	61 (59.2) 30 (29.1) 9 (8.7) 2 (1.9) 1 (1.0)
Detection method of LA-DRVs	
454 pyrosequencing AS-PCR Illumina NGS Cloning + sequencing HIV-SNaPshot OLA Pyrosequencing (Pyro-Mark) DEEPGEN NGS RCA SGA SMRTS (PacBio)	34 (33.0) 34 (33.0) 25 (24.3) 3 (2.9) 2 (1.9) 2 (1.9) 2 (1.9) 1 (1.0) 1 (1.0) 1 (1.0) 1 (1.0)
Inclusion/exclusion of individuals harboring DRVs detected by population sequencing	
DRVs not excluded Certain DRVs excluded Any DRVs excluded Presence of DRVs as inclusion criteria No population sequencing performed/no data shown	32 (31.1) 15 (14.6.) 9 (8.7) 4 (3.9) 25 (24.3)

Abbreviations: ART, antiretroviral therapy; AS-PCR, allele-specific polymerase chain reaction; CSF, cerebral spinal fluid; DRV, drug-resistant HIV-1 variant; HIV, human immunodeficiency virus; LA, low abundance; NGS, next-generation sequencing; OLA, oligonucleotide ligation assay; PBMCs, peripheral blood mononuclear cells; RCA, rolling-circle amplification; SGA, single genome amplification; SMRTS, single molecule real-time sequencing.

[40, 41, 67, 93, 96]. Forty-two (40.8%) studies did not differentiate between acute and chronic HIV-1 infection. Seventeen (16.5%) studies reported on acute/recent HIV-1 infection and 44 (42.7%) studies focused (mainly) on chronic HIV-1 infection. Plasma was the most frequent specimen type (97 studies, 94.2%). Most studies (68, 66.0%) were conducted in highincome countries (mainly in Europe and the United States), with comparably fewer (30, 29.1%) conducted in low- and middle-income countries: sub-Saharan Africa (19, 18.4%), Asia (8, 7.8%), and Middle/South America (3, 2.9%).

Sixty-one (59.2%) studies reported solely on the prevalence of LA-DRVs in ARV drug-naive individuals and did not assess their impact on treatment outcomes, while 30 (29.1%) different prevalence studies also investigated the impact of LA-DRVs on ART clinical outcomes (Table 1). Of the remaining 12 studies, 9 (8.7%) were case-control studies [38, 53, 57, 60, 70, 84, 88, 99, 105], 2 (1.9%) were case reports [25, 100], and 1 (1.0%) was a meta-analysis [65]; all reported on the association between LA-DRVs and treatment outcomes (Supplementary Table 1).

## Methods Used in the Detection of Low-Abundance Drug-Resistant HIV-1 Variants

A variety of different methods were used to detect LA-DRVs in the 103 studies. Most studies used AS-PCR (34, 33.0%) and 454 pyrosequencing (34, 33.0%) or Illumina (25, 24.3%) NGS platforms (Table 1 and Supplementary Table 1). Prior to 2005, when the first NGS platform became available, AS-PCR was the most frequently used method. Despite having the highest sensitivity, a major limitation of point mutation assays, such as AS-PCR, is that they can only detect 1 single point mutation at a time [10] and their ability to detect alternative polymorphisms at the codon of interest is reduced [106].

Generally, each method may be affected by polymorphisms associated with drug resistance, which may skew the sensitivity of primers and probes used in the assay [106]. Other important issues, particularly when applying NGS assays, are experimental challenges during sample preparation, for example loss during DNA or RNA extraction or contaminations, and errors introduced during reverse transcription or amplifications, for example nucleotide misincorporation, resampling, biases due to primer/probe mismatches, or in vitro recombination [107, 108]. Some of them can be addressed by quantifying input cDNA copy numbers as done, for instance, in the study by Mbunkah et al [67], or by using primer IDs [36, 109, 110]. Details of the technical strengths and limitations of the methods used in the studies are shown in Table 2.

The technical sensitivity of each method dictates the lower limit of detection to be used with it. Studies that used AS-PCR had a minimum limit of detection (technical cutoff) of 0.001% and a maximum of 1%, with 0.01% used most often (Table 2). Studies using NGS technologies (454 pyrosequencing, Illumina NGS, or single-molecule real-time sequencing by Pacific Biosciences) had minimum technical cutoffs of 0.02% and 1%, respectively. A 1% technical cutoff was most commonly applied with those methods. Sources of errors in genotypic resistance assays, including errors introduced by reverse transcription, multiple rounds of amplification (including PCR recombination) followed by sequencing, may affect the technical cutoffs [108]. Lowering technical cutoff values below 1% for most NGS-based assays could give rise to false positives due to these inherent errors from the assay [111]. The high heterogeneity in limits of detection not only between the different methods used but also within the same methods argues for future interlaboratory studies [11, 94, 112].

#### Prevalence of Low-Abundance Drug Resistant HIV-1 Variants

Ninety-one (88.3%) studies of ARV drug-naive adults reported DRVs prevalence data. The reverse transcriptase region was the most commonly studied part of the HIV-1 genome. Sixtyone of the 91 studies (67.0%) were conducted in high-income countries, 14 (15.4%) in low- and middle-income countries, and 14 (15.4%) in upper middle-income countries, as classified by the World Bank [113]. For 2 (2.2%) studies, the countries of origin were not specified. The drug-resistant mutations K103N, Y181C, and M184V were the most commonly reported mutations at varying detection thresholds (Table 3 and Supplementary Table 1). The K103N, Y181C, and M184V mutations as LA-DRVs were detected in a median of 2.0%, 0.2%, and 0.5% of ARV drug-naive adults, respectively. The prevalence of the K103N, Y181C, and M184V mutations as LA-DRVs in ARV drug-naive individuals reached up to 33.0%, 10.0%, and 41.9%, respectively (Table 3 and Supplementary Table 1).

Taken together, the prevalence of these LA-DRVs was highly variable in different studies of ARV drug-naive individuals. Several issues complicate the comparison of prevalence data between studies. Considerable heterogeneity was present with respect to time of sampling, detection methods used to characterize LA-DRVs, the thresholds applied in their detection, and to a lesser extent the study participants' inclusion/exclusion criteria. Consequently, highly variable prevalence estimates of LA-DRVs are reported across the different studies, even those performed in the same country. Another complicating factor was the presence of DRVs as revealed by genotypic resistance testing methods based on population sequencing. Ten of 91 (11.0%) studies included only individuals without any DRVs detected by population-based sequencing, 15 (16.5%) excluded specific DRVs detected by population-based sequencing, and 37 (40.7%) allowed the presence of DRVs at high abundance. In 5 of 91 (5.5%) studies, the presence of DRVs detected by population-based sequencing was an inclusion criteria, and in 24 (26.4%) studies, genotypic resistance testing by populationbased sequencing was not performed or the data were not shown (Table 1). Nevertheless, it was generally true that the use of more sensitive detection assays led to the reporting of higher prevalence estimates of DRVs.

## Impact of Low-Abundance Drug-Resistant HIV-1 Variants on the Outcome of Antiretroviral Therapy

LA-DRVs have been suggested to have an impact on ART outcomes in antiretroviral drug-naive individuals [10]. We found 42/103 (40.8%) studies investigating the impact of LA-DRVs on first-line ART in ARV drug-naive adults. Of note, the presence of DRVs detected by standard population sequencing was not an exclusion criterion in most of the studies (Supplementary Table 1). Four studies described single individuals on nonnucleoside reverse transcriptase inhibitor (NNRTI)-based ART regimens in whom preexisting low-abundance NNRTI-resistant variants were rapidly selected and became the predominant variant during virological failure (Supplementary Table 1) [25, 27, 87, 100]. Another study showed the selection of preexisting lowabundance protease inhibitor (PI)-resistant variants during virological failure in 3 individuals receiving ritonavir-boosted protease inhibitor (PI/r)-based regimens [90].

Besides these 5 case reports, 1 meta-analysis [65], 9 casecontrol studies, and 27 prevalence studies investigated the clinical relevance of LA-DRVs (Supplementary Table 1). Four of these 37 studies (10.8%) investigated the impact of preexisting RTI- and/or PI LA-DRVs on first-line PI/r-based ART and did not find any impact of LA-DRVs on clinical outcome [17, 59, 60, 85]. In 8 of the 37 studies (21.6%), individuals received various first-line ART regimens, mainly NNRTI- or PI/r-based therapy. No impact of preexisting LA-DRVs on treatment outcomes was reported in these studies [15, 18, 29, 31, 44, 54, 71, 95]. So far, no study has reported the potential impact of integrase strand transfer inhibitor (INSTI) LA-DRVs on INSTI-based ART regimens in ARV drug-naive individuals.

The potential impact of LA-DRVs on first-line NNRTI-based ART regimens is very controversially discussed. Twenty-five of the 37 studies (67.6%) included only individuals on first-line NNRTI-based ART, regimens considered to have a relatively low genetic barrier to resistance. Case reports are not included in this subset of studies. We assessed the quality of these 25 studies using 18 criteria based on the recommendations by the Strengthening of Reporting of Observational Studies in Epidemiology (STROBE) statement covering information on study design, participants' characteristics, methods, and results (Table 4 and Supplementary Table 2) [114]. A majority of the 25 studies reached high scores showing the high quality of these studies. Nevertheless, the comparability of those studies is hampered by the high heterogeneity of the studies' designs (Supplementary Table 2) with respect to several factors: (1) some used AS-PCR, hence reporting only 1 or a few DRVs, while others used NGS and reported a selection of DRVs, including some studies reporting all nucleoside reverse transcriptase inhibitor (NRTI)- and NNRTI-DRVs; (2) a few studies focused solely on NNRTI-DRVs, while others included all RTI-DRVs; (3) a wide range of technical cutoffs was used, that is 0.001%-10.0%; (4) most studies excluded individuals with preexisting high-abundance DRVs, while others did not; (5) the number of participants was highly variable, ranging from 5 to 489; (6) the criteria and definitions used to determine the impact of LA-DRVs on clinical outcome were highly diverse; and (7) the clinical and epidemiological characteristics of the

#### Table 2. Detection Methods for Low-Abundance Drug-Resistant HIV-1 Variants Used in the Included Publications

Detection Method	Technical Strengths	Technical Limitations	Technical Cutoff Applied, % Min–Max
454 pyrosequencing	Good sensitivity and specificity; long reads at short run times	Homopolymer errors; relatively high insertion/deletion rate; low throughput; costly reagents, (not available anymore)	0.02–5
AS-PCR	High sensitivity and specificity; fairly labor-intensive; easy interpretation of results	Only particular mutations of interest can be detected; false-positive results at lower limits; polymorphisms at primer binding sites can reduce assay's sensitivity/specificity; varying sensitivity/specificity for different mutations due to virus- and assay- related issues	0.001-2
Cloning + sequencing	High sensitivity; not susceptible to primer polymorphisms; genetic linkage is possible if single genome amplification is applied	Time and labor intensive	0.5–10; depending on sequenced clones
Illumina NGS	High-throughput data with low error rates; high sensitivity; relatively cheap	Fairly laborious with long run times	1–3
OLA	High sensitivity and specificity; fairly labor intensive; easy interpretation of results	Only particular mutations of interest can be detected; false-positive results at lower limits; polymorphisms can reduce sensitivity	2
RCA	High sensitivity and specificity; fairly labor intensive; easy interpretation of results	Only particular mutations of interest can be detected; false-positive results at lower limits; polymorphisms can reduce sensitivity	1
SGA	Risk of nucleotide misincorporation or template switching introduced during PCR amplification is reduced; genetic linkage is possible	Very labor intensive and costly; much time involved in determining the appropriate dilution to use	2
SMRTS (Pacific Bio- sciences)	Long reads; low error rate due to circular consensus sequencing	Fairly laborious; high input amount of DNA required	1

Abbreviations: AS-PCR, allele-specific polymerase chain reaction; HIV, human immunodeficiency virus; NGS, next-generation sequencing; OLA, oligonucleotide ligation assay; RCA, rolling-circle amplification; SGA, single-genome amplification; SMRTS, single-molecule real-time sequencing.

participants varied substantially, for example year of sampling and stage of HIV-1 infection at time of study enrolment (Supplementary Table 2).

Fourteen of those 25 studies (56.0%) showed no association between preexisting LA-DRVs and risk of virological failure in individuals receiving NNRTI-based first-line ART: 3 case-control studies [88, 99, 105] and 11 prevalence studies [24, 26, 50, 68, 72, 75, 77, 79, 80, 89, 96]. Eleven of the 25 studies (44.0%) reported a higher risk of virological failure if low-abundance NNRTI-DRVs were present prior to treatment initiation (1 meta-analysis [65], 5 case-control studies [38, 53, 57, 70, 84], and 4 prevalence studies [23, 41, 46, 48, 115]; Supplementary Table 2).

In a multicohort European case-control study that included ARV drug-naive individuals (76 cases and 184 controls), the presence of preexisting low-abundance NNRTI-DRVs more than doubled the risk of virological failure in individuals on first-line NNRTI-based ART (odds ratio, 2.75; 95% confidence interval [CI], 1.35–5.60; P = .005) compared to individuals with no NNRTI LA-DRVs detected [38]. In a pooled analysis of 10 studies with a total of 985 ARV drug-naive individuals, 138 (14%) of whom carried either NNRTI or NRTI LA-DRVs, the detection of LA-DRVs at treatment initiation was associated with more than twice the risk of virological failure early after therapy initiation with NNRTI-based ART compared to individuals in whom no LA-DRVs were detected [65]. Among the few studies in low- and middle-income countries assessing the clinical impact of LA-DRVs on NNRTI-based ART, 1 study conducted in Mexico including 264 ARV drug-naive individuals initiating treatment reported an association of LA-DRVs with virological failure [23].

#### Table 3. Prevalence of Low-Abundance Drug-Resistant HIV-1 Mutations K103N, Y181C, and M184V in the 91 Prevalence Studies

	K103N	Y181C	M184V
Studies reporting the LA-DRV, No. (%)	68 (74.7)	57 (62.6)	58 (63.7)
Number of participants/study, median (IQR; min-max)	55 (29–151; 4–995)	56 (26–133; 4–442)	53 (21–123; 5–833)
Proportion of individuals harboring the LA-DRV, median % (IQR; min–max)	2 (0–5.5; 0–33.3)	0.2 (0-3; 0-10)	0.5 (0-7.3; 0-41.9)

Details are provided in Supplementary Table 1.

Most studies provided information for individuals harboring the K103N, Y181C, and M184V mutations at high abundance. These individuals were not included in this analysis. Abbreviations: HIV, human immunodeficiency virus; IQR, interquartile range; LA-DRV, low-abundance drug-resistant HIV-1 variant. Table 4. Categorization of the 25 Studies Evaluating the Impact of NNRTI Low-Abundance Drug-Resistant HIV-1 Variants Based on Recommendations by the Strengthening of Reporting of Observational Studies in Epidemiology Statement [114]

Reference		Stuc	Study Design						Participants						Methods	Results	ts	Sum
	Сопиту	boineq emit gnilqms2	Duration of follow-up	Befinition of virological failure <sup>a</sup>	stregioitreg to redmuN	əçA	Sex Ethnicity	Route of HIV-1 infection	9qytdus r-VIH	enilesed ts truco lleo-T *AD	9niləzed te beol leıiV	noitoetni I-VIH to eget2	enəmigər TRA no elistəD	GRT prior to study initiation	Technical cutoff	Clinical cutoff/mutational load	Brulief lesigoloviv te TAD	
Johnson et al 2008 [ <mark>57</mark> ]	←	-	~	-	-	0	1	0	0	0	0	0	-	<del>.                                    </del>	-	0	-	1
Metzner et al 2009 [70]	-	-	-	-	-	0	1 0	-	-	0	-	-	-	-	-	0		14
Simen et al 2009 [11 <b>5</b> ]	-	-	-	-	<del>.                                    </del>	<del>.                                    </del>	1	0	0	-	<del>~</del>	<del>~</del>	0	-	<del>-</del>	0	0	13
Balduin et al 2009 [24]	-	-	0	0	-	-	1	-	-	-	-	-	-	-	-	0	0	14
Geretti et al 2009 [46]	-		-	-	<del>.                                    </del>	<del>.                                    </del>	1 0	0	0	-	<del></del>	-	<del>.                                    </del>	-	<del></del>	0	<del></del>	14
Paredes et al 2010 [84]	-	0	-	-	-	<del>~</del>	-	0	0	-	-	-	<del>~</del>	-	<del>~</del>	-	<del>~</del>	15
Goodman et al 2011 [ <b>48]</b>	-	0	-	-	<del></del>	0	0	0	0	-	<del></del>	0	<del>.                                    </del>	-	<del></del>	-	<del></del>	1
Li et al 2011 [65]	-	1	1	-	-	-	1	0	0	-	-	-	-	-	-	-	0	15
Messiaen et al 2012 [68]	-		-			<del></del>	0	0	0	<del>-</del> -	<del></del>	<del>.                                    </del>	-	-	<del></del>	0	AN	13
Bansode et al 2013 [ <mark>26]</mark>	-	-	-	-	-	0	0	0	0	-	0	-	-	-	<del>.                                    </del>	0	AN	10
Mohamed et al 2014 [75]	←	0	-	←	-	0	1	0	←	0	<del>.                                    </del>	0	-	-	<del></del>	0	<del>-</del>	7
Metzner et al 2014 [72]	<del>,</del> —	-	-	-	<del>-</del>	<del>.                                    </del>	-	~	-	<del>~</del>	<del>~</del>	-	<del>.                                    </del>	<del>, -</del>	<del>.                                    </del>	0	-	17
Neogi et al 2014 [ <mark>79</mark> ]		0	-	<del></del>	<del></del>	0	0	0		0	0	0	<del>.                                    </del>	-	<del>.                                    </del>	0	AN	œ
Nicot et al 2015 [80]	-	-	-	0	<del>~</del>	<del>~</del>	1 0	0	0	<del>~</del>	<del>-</del>	-	<del>~</del>	-	<del>~</del>	0	AN	12
Cozzi-Lepri et al 2015 [38]	-		-	-	-	<del></del>	-	~	-	<del>~</del>	<del>~</del>	0	<del></del>	-	<del>~</del>	-	0	16
Zoufaly et al 2015 [1 <mark>05</mark> ]	-	-	-	-	-	-	-	-	-	-	-	-	-	-	<del>.                                    </del>	0	-	17
Porter et al 2015 [ <mark>88</mark> ]	0	0	-	-	<del>~</del>	<del>-</del>	-	0	-	-	<del>~</del>	0	-	<del>-</del>	<del>~</del>	0	AN	12
Van Eygen et al 2016 [99]	0	0	-	-	-	0	1 0	0	-	0	-	-	-	-	-	0	AN	10

Table 4. Continued

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Abbreviations: AHI, antiretroviral therapy; GHI, routine genotypic resistar \*Definition of virological failure or other virological outcome parameters.

Sensitivity thresholds (for identifying cases) and tradeoffs with specificity (ability to identify controls) with respect to the clinical relevance of LA-DRVs have been debated. Sensitivity thresholds were evaluated in more recent studies. After a median follow-up of 8 months after ART initiation, Ávila-Ríos et al observed a variable increased risk of viral nonsuppression at 6 months depending on the sensitivity threshold used [23]. Findings were statistically significant at sensitivity thresholds of 20% (P = .019), 10% (P = .0064), and 5% (P = .015), but not at 2% (P = .074), suggesting an optimal threshold for NNRTI LA-DRVs of 5%. Inzaule et al also reported an optimal sensitivity threshold for NNRTI LA-DRVs of 5%, but not lower [53]: lowering the threshold from 20% through 1% results in improved sensitivity (ability to identify cases) but at a cost of reduced specificity (ability to identify controls). The adjusted odds ratio for virological failure was 9.2 (95% CI, 4.2-20.1) at a detection threshold of 20%, but changed as the threshold was lowered: 6.8 (95% CI, 3.3-13.9) at the 10% threshold, 7.6 (95% CI, 3.4-17.1) at the 5% threshold, and 4.5 (95% CI, 2.0-10.2) at the 1% threshold [53]. A very recent study by Derache et al showed a significantly higher risk of virological failure in the presence of LA-DRVs using a threshold of 5% [41].

An alternative predictor of clinical outcome that has been proposed is the absolute copy number of a particular viral mutant (mutational load), rather than the proportion. A few studies have investigated the relationship between mutational load and its impact on virological outcome. A threshold of 2000 copies/mL of variants with K103N prior to treatment initiation was shown to predict virological failure in a retrospective analysis investigating the effects of low levels of the K103N mutation present at treatment initiation [48]. In a pooled analysis of studies involving ARV drug-naive individuals initiating NNRTI-based regimens, a dose-dependent increased risk of virological failure of first-line ART was observed, although copy numbers of 10-99 per mL plasma or frequencies of <0.5% of low-abundance NNRTI-DRVs were already significantly associated with an increased risk of virological failure of first-line ART [65]. A dose-effect relationship between the mutational load and virological failure was also observed in the multicohort Europe-wide case-control study showing a significantly higher risk of virological failure at mutational loads  $\geq 1000$  copies per mL [38]. Inzaule et al also performed a sensitivity analysis based on mutational load and reported that the association between LA-DRVs and virological failure was significant only at a higher copy number ( $\geq 1000$  copies per mL) [53].

Evaluating the clinical impact of LA-DRVs on first-line ART remains challenging. Most studies enrolled small numbers of participants and were often substudies or subanalyses where LA-DRVs were not the primary focus. Substantial variation in study design and use of different methods to detect LA-DRVs were also observed. The definitions of virological failure also varied and in most studies neither coadministered NRTIs nor the viral and mutational loads were considered. A metaanalysis of these studies would be inappropriate due to these biases, coupled with the fact that some of these studies also included individuals with preexisting DRVs detected by routine genotypic drug resistance assays.

## CONCLUSIONS

The prevalence of LA-DRVs has been reported in antiretroviral drug-naive individuals across the globe at varying levels. In the past decade, different technologies have evolved and new ones have been developed, making detection of LA-DRVs in individuals easier in terms of costs and sensitivity. The application of these novel platforms to routine HIV drug resistance genotyping has the potential to be revolutionary. This review documents a considerable range in the lower limit of detection of LA-DRVs for different assays, from <0.01% as seen with AS-PCR to 1%–5% for ultradeep sequencing assays and other methods [54].

LA-DRVs have been shown to be clinically relevant, especially prior to the initiation of a first-line NNRTI-based regimen. Of note, not each ARV drug-naive individual harboring LA-DRVs experiences virological failure. Furthermore, in the case of virological failure, the preexisting LA-DRVs are not necessarily the selected variants. The clinical impact of LA-DRVs on response to regimens that are based on other drug classes generally remains even more uncertain, as reflected by the latest recommendations on HIV-1 drug resistance testing by the International Antiviral Society USA [116]. Although just a single study in this review reported low-abundance INSTI-DRVs at a prevalence of 2.4% [52], we believe that the relevance of LA-DRVs with potential impact on INSTI-containing regimens will depend on a number of factors including: (1) the prevalence of transmitted INSTI resistance, which remains low but which may increase in the future; and (2) the overall genetic barrier of INSTI regimens.

Important questions concerning LA-DRVs remain to be addressed, such as defining a clinically relevant threshold or cutoff at which they are associated with an increased risk of virological failure (Box 1). A large prospective study investigating the impact of LA-DRVs on different ART regimens and in different clinical settings in different countries could shed light on this widely debated, timely, and clinically relevant question, but such a study will be challenging and costly to set up. Future studies should assess the effect of mutational load on virological outcomes, identify which LA-DRVs are clinically relevant, the impact of linked mutations, and the time it takes to virological failure.

Standardization of assays and bioinformatics procedures in this field is also important [117]. Because it is crucial to understand the point at which LA-DRVs may become clinically significant, defining a clinically relevant threshold for HIV drug resistance testing will be equally valuable [23, 53]. Therefore, more studies are needed to determine a threshold,

## Box 1. Outstanding questions about LA-DRVs

- At what threshold are LA-DRVs associated with increased risk of virological failure for regimens based on NRTIs, NNRTIs, PIs, and INSTIs?
- What is the role of the mutational load, ie, the total amount of particular LA-DRVs?
- Which drug resistance mutations are clinically relevant in the context of LA-DRVs?
- Are there any linkages or interplays between the mutations/variants and could this have any effects?
- How much time does it take until virological failure occurs due to the outgrowth of LA-DRVs?
- For which ART combination might the detection of LA-DRVs be beneficial?
- Which viral and host factors contribute to virological failure due to the outgrowth of LA-DRVs? Vice versa, which factors prevent virological failure in the presence of LA-DRVs?

Abbreviation: ART, antiretroviral therapy; INSTI, integrase strand transfer inhibitor; LA-DRV, low-abundance drugresistant human immunodeficiency virus-1 variants; NNRTI, nonnucleoside reverse transcriptase inhibitor; NRTI, nucleoside reverse transcriptase inhibitor; PI, protease inhibitor.

below which the risk of treatment failure decreases. Because cutoffs may depend on several factors such as viral load and the relative fitness cost of specific mutations, defining a single cutoff for all DRVs is unlikely to be possible. Consequently, clinical cutoffs specific for each mutation and treatment regimen may be required. In the near future, the clinical impact of LA-DRVs on treatment outcome will possibly depend on the genetic barrier of the remaining current drugs to resistance and the potency of emerging drugs. Furthermore, wider implementation of some of the sensitive technologies for detection of LA-DRVs in low- and middle-income countries is also encouraged.

## Supplementary Data

Supplementary materials are available at *The Journal of Infectious Diseases* online. Consisting of data provided by the authors to benefit the reader, the posted materials are not copyedited and are the sole responsibility of the authors, so questions or comments should be addressed to the corresponding author.

## Notes

Author contributions. S. B., R. P., N. P., M. R. J., and K. J. M. conceptualized the review. H. A. M. and K. J. M. searched

the literature, selected studies, extracted the data, and wrote the manuscript. All authors made contributions to writing and review of the manuscript and also approved the final manuscript.

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All authors have submitted the ICMJE Form for Disclosure of Potential Conflicts of Interest. Conflicts that the editors consider relevant to the content of the manuscript have been disclosed.

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