

1 **Patterns of acquired HIV-1 drug resistance mutations and predictors of virological**
2 **failure in Moshi, northern Tanzania**

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27 **Abstract**

28 Drug resistance is a public health concern. Profiles of HIV drug resistance mutations
29 (HIVDRM) and virological failure (VF) are not extensively studied in Tanzania. This study
30 aimed to determine HIVDRM and predictors of VF in HIV-infected individuals failing first-
31 line HIV drugs in Moshi, northern Tanzania. A case-control study was conducted at KCMC,
32 Mawenzi, Pasua and Majengo health facilities with HIV-care and treatment clinics in Moshi
33 from October, 2017 to August, 2018. Cases and controls were HIV-infected individuals with
34 VF and viral suppression (VS) respectively. HIV-1 reverse transcriptase and protease genes
35 were amplified and sequenced. Stanford University's HIV drug resistance database and
36 REGA HIV-1 Subtyping tool 3.0 determined HIVDRM and HIV-1 subtypes respectively.
37 Odds ratios with 95% confidence intervals investigated predictors of VF. P-value <5% was
38 considered statistically significant. A total of 124 participants were recruited, of whom 63
39 (50.8%) had VF and 61 (49.2%) had VS. Majority (66.1%) were females. Median [IQR] age
40 and duration on ART were 45 [35-52] years and 72 [48-104] months respectively. Twenty
41 five out of 26 selected HIV-1 RNA samples from cases were successively sequenced. Twenty
42 four samples (96%) had at least one major mutation conferring resistance to HIV drugs, with
43 non-nucleoside reverse transcriptase inhibitor (NNRTI) associated mutations as the majority
44 (92%). Frequent NNRTI resistance mutations were K103N (n=11), V106M (n=5) and G190A
45 (n=5). Prevalent nucleoside reverse transcriptase inhibitors mutations were M184V (n=17),
46 K70R (n=7) and D67N (n=6). Dual-class resistance was observed in 16 (64%) samples.
47 Thirteen samples (52%) had at least one thymidine analogue-associated resistance mutation
48 (TAM). Three samples (12%) had T69D mutation with at least 1 TAM. Age was
49 independently associated with VF [aOR 0.94 (0.90-0.97) p<0.001]. In conclusion, HIV drug
50 resistance is common among people failing antiretroviral therapy and resistance testing will
51 help to guide switching of HIV drugs.

52 **Introduction**

53 Human Immunodeficiency Virus (HIV) infection is still a public health problem with
54 an estimation of 37.9 million people living with it worldwide by the end of 2018. Among the
55 people living with HIV (PLHIV) globally, 36.2 million are adults, 1.7 million are children
56 below 15 years and 18.8 million are women aged 15 years and above. Every day, 5000
57 people are infected with HIV globally, and more than a half of these new infections occur in
58 sub-Saharan Africa (sSA). Eastern and Southern Africa alone harbours more than a half of
59 the world burden of HIV-infections with 20.6 million of PLHIV by the year 2018 [1]. The
60 incidence-prevalence ratio (IPR) of the worldwide HIV-infection has declined considerably
61 from 11.2% in 2000 to 4.6% in 2018. In the same year, sSA was also observing a decline in
62 HIV-infection IPR to about 3.9% and 5.5% in Eastern and Southern Africa; and Western and
63 Central Africa respectively. Despite the decline in IPR, HIV-infection is still a public health
64 problem in sSA due to unacceptably high number of PLHIV in this setting (approximately
65 68% of the global burden) with substantial new HIV-infections [1].

66 Introduction of highly active antiretroviral therapy (HAART) in sSA countries
67 including Tanzania has significantly helped to reduce HIV/AIDS related mortality from
68 around 900,000 in 2010 to 470,000 in 2018 [1] with improved quality of life [2]. The globe
69 further committed that by the year 2020, 90% of PLHIV should know their HIV status, 90%
70 of PLHIV who know their HIV status should be on ART, and also 90% of PLHIV on ART
71 should enjoy the sustainable viral suppression, this is alias known as 90-90-90 target [3]. In
72 the race to achieve the second UNAIDS ‘90’ target, about 51% of PLHIV are on HAART in
73 Western and Central Africa (WCA); and 67% in Eastern and Southern Africa (ESA)
74 respectively. The proportions of HIV-infected individuals on treatment with an enjoyment of
75 viral suppression is better in WCA (79%) compared to ESA (58%) respectively, however, the

76 numbers are below the third UNAIDS ‘90’ target [1]. One of the key challenges which partly
77 explain the failure to achieve the third UNAIDS ‘90’ in sSA is the emergence of HIV drug
78 resistance (HIVDR).

79 HIVDR is defined by World Health Organisation (WHO) as presence of one or more
80 mutations in HIV drug targeted genes that compromise the ability of a specific drug or
81 combination of drugs to block replication of HIV [4]. HIVDR reverses the gains of HAART
82 in HIV-infected individuals on treatment for at least 6 months. HIV-infected individuals on
83 failed first-line HAART regimens are reported to have 50 to 97% of non-nucleoside reverse
84 transcriptase inhibitors (NNRTI) resistance world-wide [4]. In sSA, more than 80% of HIV-
85 infected individuals with VF on first-line HAART have HIV-drug resistance [5]. In addition,
86 sSA has been reported to accommodate tenofovir resistance in more than a half of people
87 with first-line HAART failure on tenofovir-based regimens. Cytosine analogue resistance
88 was also highly evident in sSA as compared to Western Europe. Eastern Africa was more
89 commonly reported to have lamivudine and emtricitabine resistance than NNRTI resistance
90 [6].

91 Tanzania introduced antiretroviral therapy (ART) program in 2004. As of 2016, the
92 total number of people on ART was 839,544, and the current recommended first-line
93 HAART for adults and adolescents is tenofovir + lamivudine + dolutegravir. In case of first-
94 line HAART failure, the recommended second-line HAART for adults and adolescents is
95 zidovudine/lamivudine + ritonavir-boosted atazanavir or tenofovir/emtricitabine + ritonavir-
96 boosted atazanavir [7]. In Tanzania, the markers for treatment failure are based on
97 immunological, clinical and WHO recommended virological criteria [8]. Clinical and
98 immunological criteria were extensively described to be less sensitive and less effective [9]
99 and may reduce early notifications of VF. Tanzania continues to scale up HIV viral load

100 (HVL) testing which is currently done at few selected settings. Of more public health
101 importance is that HIV-infected individuals confirmed to have VF are switched to second-
102 line HAART without programmatic HIV drug resistance testing and monitoring, a practice
103 which may transfer cross-resistance patterns to newly switched drugs and limit the choices
104 for few available treatment options.

105 Recently, few studies in Tanzania have reported a wide range of first-line HIV drug
106 resistance mutations (HIVDRMs) including the thymidine analogue associated mutations
107 which compromise susceptibility to multi-NRTIs [10–12]. In order to complement the efforts
108 to unearth the burden of HIVDR and preserve the integrity of limited second-line HIV drugs
109 in Tanzania, this study aimed to test genotypically for drug resistance in the reverse
110 transcriptase (RT) and protease genes from individual with VF on first-line HAART in Moshi
111 municipality, northern Tanzania. The study also explored the independent predictions for VF.

112 **Materials and methods**

113 **Study design and settings**

114 Between October, 2017 and August, 2018, unmatched case-control study was done in
115 four HIV/AIDS care and treatment clinics (CTC) in Moshi municipality, situated in
116 Kilimanjaro region, northern Tanzania. Moshi municipality is one of the seven districts of
117 Kilimanjaro region. The municipality has a total of 18 health facilities with CTC. Four out of
118 18 CTCs with high client volume were purposively selected to participate in the study. The
119 CTCs included were that of Kilimanjaro Christian Medical Centre (KCMC), Mawenzi
120 regional referral hospital, Majengo and Pasua health centres. KCMC provides tertiary care
121 hospital services to around 6.8 million people living in the northern zone of Tanzania (Tanga,
122 Kilimanjaro, Arusha and Manyara) and other referrals from nearby settings. Mawenzi

123 regional referral hospital provides referral medical services to around 1.6 million people in
124 Kilimanjaro region.

125 At the time of recruitment of study participants, the management of HIV-infected
126 individuals was done in-line with national guidelines for management of HIV and AIDS of
127 2017 [8]. The CTCs routinely provided HIV counselling and testing services, ART care and
128 treatment, treatment monitoring, laboratory investigations and treatment adherence support to
129 HIV-infected individuals. The recommended first-line HAART for adults and adolescents at
130 the time of the study was tenofovir + lamivudine + efavirenz (TLE), given as a single dose
131 formulation. Prescriptions of antiretroviral drugs were done by clinicians and to some points
132 by trained nurses in the health centres. HVL testing was routinely done to all HIV-infected
133 individuals who have been on ART for at least 6 months. Those found with HVL > 1,000
134 copies/ml were offered enhanced adherence counselling (EAC) by trained health care
135 providers. EAC was provided on monthly bases for three months at the CTCs. After 3 months
136 of EAC, retesting of HVL was done and HIV-infected individuals found still to have HVL >
137 1,000 copies/ml were classified as having VF and followed by further actions to change their
138 regimens to second-line. The clinic visits for adolescents and youths were scheduled at
139 different times from adults to maximize adherence counselling and support. Adherence level
140 of $\geq 95\%$ and $< 95\%$ was regarded as good and poor respectively [8].

141 **Study population**

142 The study population was HIV-infected individuals attending the selected CTCs for
143 routine care and were on first-line HAART treatment for a year or more. HIV-infected
144 individuals with VF and viral suppression (VS) were included into study as cases and
145 controls respectively. The cases were defined as HIV-infected individuals with >1000
146 copies/ml of HIV plasma RNA confirmed by <0.5 logarithmic difference between initial and

147 second HVL with EAC in between. Controls were the HIV-infected individuals attending the
148 same CTCs along with cases but they have viral suppression (HVL < 1000 copies/ml). The
149 cases found to have less than three EAC were excluded from the study. The study further
150 excluded the cases with significant difference HVL measured at the date of interview and that
151 measured before starting EAC (HIV-1 plasma RNA viral log₁₀ drop greater than 0.5 at three
152 month interval with 3 EAC in between).

153

154 **Sample size determination**

155 We assumed that the study had 80% power and the proportion exposed in the control
156 group was 20%. With equal number of cases and controls (ratio of 1:1), we could manage to
157 detect odds ratio (OR) of 3.0 or greater with the following sample size calculation as
158 described by Charan and Biswas [13].

159

$$160 \quad n = \left(\frac{r+1}{r}\right) \frac{(\bar{p})(1-\bar{p})(Z_{\beta} + Z_{\alpha/2})^2}{(p_1 - p_2)^2}$$

161

162 n = sample size in each group, r = ratio of controls to cases, \bar{p} = a measure of variability
163 (average proportion exposed), p_1 = proportion exposed in cases, p_2 = proportion exposed in
164 controls, $p_1 - p_2$ = Effect size (the difference in proportions), $Z_{\alpha/2}$ = level of two-tailed
165 statistical significance, Z_{β} = standard normal variate for power of the study. Our study power
166 was 80%, $Z_{\beta} = 0.84$; Level of significance was 0.05, $Z_{\alpha} = 1.96$; $r = 1$ (equal number of cases
167 and controls), $OR = 3.0$ and $p_2 = 20\%$ or 0.2.

$$168 \quad p_1 = \frac{OR \times p_2}{p_2(OR - 1) + 1} = \frac{3.0 \times 0.2}{0.2(3.0 - 1) + 1} = 0.43$$

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$$\bar{p} = \frac{(p_1 + p_2)}{2} = \frac{(0.43 + 0.2)}{2} = 0.31$$

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$$\therefore n = \frac{2 \times (0.31) \times (1 - 0.31) \times (0.84 + 1.96)^2}{(0.43 - 0.2)^2} = 63$$

173

174 Therefore, the study planned to recruit 63 study participants with first-line VF and 63 with
175 VS making a total sample size of 126.

176

177 **Enrolment and study procedures**

178 Study participants who met the inclusion criteria and consented to participate were
179 interviewed to collect demographic and clinical information. After the interviews, 8-10 ml of
180 EDTA whole blood was collected and centrifuged at 2200 revolutions per minute for 10
181 minutes with brake-offs to separate plasma from buffy coat and red blood cells within 4 hours
182 post-collection. HVL was enumerated in-vitro from plasma by reverse transcription-
183 polymerase chain reaction as per Abbott m2000rt system and was expressed in copies/ml of
184 plasma.

185 Due to financial constraints, 26 out of 63 samples of cases were selected for
186 sequencing. Selection was based on having HVL \geq 14,000 copies/ml. Plasma HIV-1 RNA
187 was extracted using PureLink® Viral RNA/DNA Mini Kit (Invitrogen, Thermo Fisher
188 Scientific, USA) as per manufacturer's instructions. RT and protease genes of the extracted
189 HIV-1 RNA was reversely transcribed into complementary DNA (cDNA) and subsequently
190 subjected into nested polymerase chain reactions (PCR) according to manufacturer's

191 instructions prescribed in HIV-1 genotyping kit: Amplification module (Applied Biosystems,
192 Life Technologies, Warrington, UK). The amplified cDNA was purified using ExoSAP-IT™
193 PCR product clean-up reagent (Applied Biosystems, Thermo Fischer Scientific, Inc.).
194 Reactions were performed using HIV-1 genotyping kit: Cycle sequencing module (Applied
195 Biosystems, Life Technologies, Warrington, UK) based on Sanger sequencing method using
196 BigDye™ Terminator v3.1 cycle sequencing kit (Applied Biosystems, Thermo Fischer
197 Scientific, Inc.). Sequencing was done using 3500xl genetic analyzer (Applied Biosystems)
198 with a 24 capillary 50 cm array. The study profile was described in Fig 1.

199 **Fig 1. Study profile**

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201 **Data analysis**

202 **Sequence data analysis**

203 The raw sequence data were assembled, aligned and edited using automated base
204 calling software, RECall, available at (<http://pssm.cfenet.ubc.ca>) to generate individual
205 consensus sequences. The sequence data were submitted to GenBank and obtained accession
206 numbers MT347616 – MT347640. HIVDRMs were analysed using HIV drug resistance
207 database of Stanford University available at
208 (http://hivdb.stanford.edu/pages/alg/sierra_sequence.html) and HIVDRM mutation list from
209 2019 updates of drug resistance (AIDS Society). To get HIV-1 subtypes, generated consensus
210 sequences were analysed using REGA HIV-1 Subtyping tool 3.0 available at
211 (<http://dbpartners.stanford.edu:8080/RegaSubtyping/stanford-hiv/typingtool/>). REGA
212 confirmed a subtype after clustering with a pure subtype in a database by > 800 base pairs
213 with a bootstrap confidence of more than 70% in absence of recombination in the boot scan.

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215 **Statistical analysis**

216 Data analysis was performed using STATA version 14.0 (College Station, Texas
217 77845-4512, USA). Categorical variables were summarized using frequency and proportion
218 while mean or median with their respective measure of dispersion were used to summarize
219 numerical variables. A Chi-square test was used to compare the differences in proportions
220 between groups. Odds ratios (OR) and 95% confidence interval (CI) for predictors of
221 virological failure were estimated using multivariable logistic regression model. A p-value
222 <0.05 (2 tails) was considered statistically significant.

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224 **Ethics Consideration**

225 The study was approved by the Kilimanjaro Christian Medical Research Ethics
226 Review Committee in 2017 with ethical clearance certificate number 2028. Approvals to
227 conduct the study were further granted by respective authorities in four study sites. Patient
228 information sheet was given to every potential study participant to ensure informed
229 consenting process before and after commencement of the study, potential participants
230 discussed it with the researcher. The sheet explained in detail the aim of the study, purpose,
231 confidentiality, benefits, unconditional withdrawal from the study and risks of taking part into
232 the study. Every study participant consented/assented in writing to take part in the study. The
233 HIV drug resistance testing results were shared with the respective CTCs for further
234 management of the HIV-infected individuals.

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240 Results

241 Demographic characteristics of study participants

242 A total of 124 study participants were recruited in this study. Out of the 124, 63
 243 (50.8%) of study participants had virological failure and 61 (49.2%) had viral suppression.
 244 The age of the 124 participants ranged from 15 to 79 years, with median [IQR] age of 45 [35-
 245 52] years. Of the 124; 82 (66.1%) were females and 89 (71.8%) were employed in either
 246 formal or informal sector (Table 1).

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Table 1. Demographic characteristics of study participants (N=124)

Characteristic	Overall	VF	VS
	n (%)	n (%)	n (%)
Age (years)			
15-34	29 (23.4)	26 (41.3)	3 (4.9)
≥35	95 (76.6)	37 (58.7)	58 (95.1)
Median age [IQR] ^a	45 [35-52]	41 [21-49]	48 [43-54]
Sex			
Male	42 (33.9)	26 (41.3)	16 (26.2)
Female	82 (66.1)	37 (58.7)	45 (73.8)
Education level			
Primary or none	84 (67.7)	36 (57.2)	48 (78.7)
Secondary and above	40 (32.3)	27 (42.8)	13 (21.3)
Marital status			
Married/cohabiting	40 (32.3)	18 (28.6)	22 (36.1)
Single	84 (67.7)	45 (71.4)	39(63.9)
Occupation			
Employed	89 (71.8)	36 (57.1)	53 (86.9)
Unemployed	35 (28.2)	27 (42.9)	8 (13.1)
CTC enrolled			
KCMC	53 (42.7)	38 (60.3)	15 (24.6)
Majengo HC	19 (15.3)	7 (11.1)	12 (19.7)
Mawenzi RRH	29 (23.4)	14 (22.2)	15 (24.6)
Pasua HC	23 (18.6)	4 (6.4)	19 (31.1)

VF = Virological failure, VS = Viral suppression; a = Expressed as median [Interquartile range]

248 **Clinical characteristics of study participants**

249 The median [IQR] time on ART for the 124 participants was 72 [IQR 48 - 104]
 250 months, 92 (74.0%) had good adherence, 65 (52.4%) were in non-tenofovir based HAART
 251 and 66 (53.2%) were in WHO clinical stage III/IV (Table 2). The median CD4 count
 252 (cells/ μ L) at follow up was higher in VS participants 518 [IQR: 326-741] than in VF group
 253 334 [IQR: 134-549]. Likewise 100% of VS participants reported good adherence to ART
 254 compared to 49% of VF participants (Table 2).

255 **Table 2. Clinical characteristics of the participants (N = 124)**

Characteristic	Overall n(%)	VF n(%)	VS n(%)
Duration of ART intake (months)			
12 – 36	20 (16.1)	7 (11.1)	13 (21.3)
>36	104 (83.9)	56 (88.9)	48 (78.7)
Median [IQR]	72 [48-104]	84 [60-120]	72 [48-96]
Adherence status			
Good	92 (74.2)	31 (49.2)	61 (100.0)
Poor	32 (25.8)	32 (50.8)	0 (0.0)
Ever switched ART			
Yes	54 (43.5)	30 (47.6)	24 (39.3)
No	70 (56.5)	33 (52.4)	37 (60.7)
HAART initiated			
TDF based	39 (31.5)	12 (19)	27 (44.3)
None TDF based	85 (68.5)	51 (81)	34 (55.7)
HAART on use			
TDF based	59 (47.6)	22 (34.9)	37 (60.7)
Non TDF based	65 (52.4)	41 (65.1)	24 (39.3)
Baseline CD4 count (cells/ μ L)			
<100	37 (29.8)	17 (27)	20 (32.8)
\geq 100	87 (70.2)	46 (73)	41 (67.2)
Median CD4 count [IQR]	173 [72-276]	179 [68-256]	169 [73-282]
Follow up CD4 count (cells/ μ L)			
<100	13 (10.5)	12 (19)	20 (32.8)
\geq 100	111 (89.5)	51(81)	41 (67.2)
Median [IQR]	444[215-628]	334 [134-549]	518 [326-741]
WHO clinical stage			
I/II	58 (46.8)	26 (41.3)	32 (52.5)
III/IV	66 (53.2)	37 (58.7)	29 (47.5)
Time from HIV diagnosis to ART initiation (months) ^a		3.5 [1.4 – 17.9]	2.6 [0.9 – 14.0]

TDF= Tenofovir Disoproxil Fumarate, **VF=** Virological failure **VS=** Viral suppression; **a=** Expressed as median [Interquartile range]

256 **Profiles of acquired HIV drug resistance in RT and protease**
257 **genes**

258 Genotyping of RT and protease genes of HIV-1 was successful on 25 out of 26
259 selected samples from participants with VF. Of the 25, almost all (n=24) had at least one
260 major mutation conferring resistance to HIV drug (Table 3). Out of 25, 23 (92%) samples had
261 at least one non-nucleoside reverse transcriptase inhibitor (NNRTI) resistance associated
262 mutations (Fig 2). The most frequent NNRTI mutations were K103N (44%), V106M (20%),
263 and G190A (20%) (Fig 2), all of these three mutations confer high level resistance to
264 efavirenz and nevirapine.

265 **Fig 2. Profiles of NNRTI resistance mutations in participants with virological failure**

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267 In addition, 17 samples (68%) had at least one mutation associated with nucleoside
268 reverse transcriptase inhibitors (NRTI) resistance. The most frequent NRTI mutations were
269 M184V (68%), K70R (28%), and D67N (24%) (Fig 3). M184V mutation was associated with
270 high level resistance to emtricitabine, and lamivudine; while K70R and D67N are among
271 thymidine analogue-associated resistance mutations (TAM) reducing the susceptibility of all
272 current NRTI on use.

273 **Fig 3. Profiles of NRTI resistance mutations in participants with virological failure**

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278 **Characteristics of successfully genotyped samples**

279 The characteristics of successfully genotyped samples have been displayed in Table 3.
280 Dual class resistance was observed in 16 (64%) samples. In general, thirteen samples (52%)
281 had at least one TAM while three samples (12%) had T69D mutation together with at least 1
282 TAM. Identified TAMs were T215YF (n=9), K219QE (n=7), K70R (n=7), D67N (n=6),
283 M41L (n=4), and L210W (n=3). Presence of T69D mutation along with at least 1 TAM
284 reduces the susceptibility of all currently NRTIs on use. Of more scientific interest is that one
285 sample was fully susceptible (no detectable HIV drug resistance mutation) despite having VF
286 and substantial high HVL at the date of interview.

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Table 3. Characteristics of successfully genotyped samples (N=25)

SN	Sample ID	Age (years)	Duration on HAART (years)	HAART at date of interview	Viral Load at date of interview	NRTI mutations	NNRTI Mutations	PI Mutations	HIV-1 Subtype
1	K03	18	10	AZT+3TC+EFV	389,006	M184V, D67T, K70R, T215AITV, K219E	Y188L, K238T	None	A1
2	K11	55	6	ABC+3TC+LPVr	24,463	D67N, K70R, M184V, K219E, T215F	None	L10F, K20T, M46I, I47V, N88G	C
3	K12	29	6	AZT+3TC+EFV	20,805	M184V	K103N, V108I, K238T	None	CRF 10_CD
4	K15	49	12	AZT+3TC+NVP	81,123	None	None	None	A1
5	K16	44	3	TDF+3TC+EFV	23,354	None	K103N	None	A1
6	K17	15	7	AZT+3TC+NVP	25,879	None	G190A	None	A1
7	K19	17	6	ABC+3TC+EFV	296,646	M41L, D67N, K70R, M184V, T215Y, K219Q, L74I, T69D	A98G, K103N, P225H, F227F, 238T	None	C
8	K21	20	13	ZVD+3TC+EFV	33,887	M184V, T215F	K103N, Y188F, M230L	None	C
9	K25	19	10	AZT+3TC+EFV	37,794	None	V106M, G190A	None	C
10	K29	34	9	AZT+3TC+EFV	14,431	None	K103S, V106M	None	C
11	K32	41	4	TDF+3TC+EFV	161,220	A62V, K65R, M184V, K219E	K101E, V106M, Y181C, G190A	None	C
12	K36	29	10	AZT+3TC+EFV	23,056	M184V	L100I, K103N	None	A1
13	K37	15	9	AZT+3TC+NVP	20,540	D67N, K70R, M184V, T215F, K219Q	A98G, K101E, G190A	None	C
14	K38	46	13	ABC+3TC+ATVr	1,635,827	M41L, E44D, D67N, T69D, M184V, L210W, T215Y, K219R	K101E, E138K, Y181C, G190A, H221Y	L24I, L33F, M46I, I54V, Q58E, V82A, N88S	CRF 10_A1D
15	M02	35	5	AZT+3TC+NVP	124,714	D67N, T69D, K70R, M184V	G190A	None	D
16	M03	69	9	AZT+3TC+NVP	36,600	M41L, E44A, M184V, L210W, T215Y, K219N	Y181C, H221Y	None	A1
17	M05	53	10	AZT+3TC+NVP	65,638	D67G, K70R, M184V, T215FV, K219E	K103S, E138Q	None	A1

18	M07	52	4	ABC+3TC+EFV	66,486	M184V	K103N	None	A1
19	M10	41	8	AZT+3TC+NVP	45,819	D67N, K70R, M184V,K219Q	K103N, V179L, K238T	None	A1
20	MJ01	48	9	AZT+3TC+EFV	14,065	M184V,L210W, T215Y	K103N	None	C
21	MJ03	36	9	TDF+3TC+EFV	176,378	None	K103N	None	C
22	MJ05	45	5	TDF+FTC+EFV	222,227	None	L100I, K103N	None	C
23	MJ06	51	4	TDF+3TC+EFV	14,711	K70E, M184V	K103N,V108I, H221Y, F227L	None	D
24	P02	54	8	AZT+3TC+EFV	235,443	None	V106M,V179D	None	C
25	P03	45	5	TDF+3TC+EFV	128,781	M41L, K70S, L74I, M184V, T215Y	V106M,E138Q, F227L	None	C

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300 **HIV-1 diversity in the RT and protease gene**

301 The HIV-1 diversity in the RT and protease genes is shown in Table 4. HIV-1 subtype
302 C was the most prevalent subtype (48%) followed by A1 (36%), D (8%) and recombinants
303 (8%). The recombinants identified were A1D and CD. All the recombinants were circulating
304 recombinant forms (CRF).

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Table 4. HIV-1 diversity in RT and protease genes (N=25)

Rega assignment	Number of sequences	Percentage
HIV-1 Subtype C	12	48
HIV-1 Subtype A (A1)	9	36
HIV-1 Subtype D	2	8
Recombinant of A1, D	1	4
Recombinant of C, D	1	4
Total	25	100

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308 **Predictors of virological failure**

309 The predictors of virological failure (VF) are shown in Table 5. In bivariate analysis,
310 participant age, occupation, HAART initiated and HAART on use were significantly
311 associated with virological failure. In the multivariable logistic regression analysis, only age
312 remained to be independent predictor of VF. We found that, one unit increase in participant
313 age (year) was associated with 6% lower odds of VF [aOR 0.94 (0.90-0.97) $p < 0.001$].

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Table 5. Predictors of HIV virological failure (VF) (N=124)

Characteristic	VF		Crude analysis		Multivariable analysis	
	No (%)	Yes (%)	cOR (95% CI)	p-value	aOR (95% CI)	p-value
Age (years)*	48 [43-54]	41 [21-49]	0.93 (0.90-0.96)	<0.001	0.94 (0.90-0.97)	0.001
Sex						
Male	16 (26.2)	26 (41.3)	1		1	
Female	45 (73.8)	37 (58.7)	0.51 (0.24-1.08)	0.079	0.56 (0.21-1.51)	0.254
Marital status						
Married	22 (36.1)	18 (28.6)	0.71 (0.33-1.51)	0.373	-	-
Single	39(63.9)	45 (71.4)	1			
Occupation						
Employed	53 (86.9)	36 (57.1)	0.2 (0.08-0.49)	<0.001	0.35 (0.12-1.04)	0.059
Unemploye	8 (13.1)	27 (42.9)	1		1	
d						
Duration of ART intake (months)						
12 - 36	13 (21.3)	7 (11.1)	1			
>36	48 (78.7)	56 (88.9)	2.17 (0.80-5.87)	0.128	-	-
Switched ART						
Yes	24 (39.3)	30 (47.6)	1.4 (0.69-2.86)	0.353	0.89 (0.31-2.53)	0.827
No	37 (60.7)	33 (52.4)	1		1	
HAART initiated						
TDF based	27 (44.3)	12 (19)	0.3 (0.13-0.66)	0.003	0.26 (0.05-1.27)	0.096
Non-TDF	34 (55.7)	51 (81)	1		1	
HAART on use						
TDF based	37 (60.7)	22 (34.9)	0.35 (0.17-0.72)	0.005	0.85 (0.25-2.85)	0.795
Non-TDF	24 (39.3)	41 (65.1)	1		1	
Baseline CD4 count (cells/μL)						
<100	20 (32.8)	17 (27)	0.76 (0.35-1.64)	0.481	0.86 (0.35-2.11)	0.745
\geq100	41 (67.2)	46 (73)	1		1	
WHO clinical stage at interview						
I/II	32 (52.5)	26 (41.3)	1		1	
III/IV	29 (47.5)	37 (58.7)	1.57 (0.77-3.19)	0.213	1.04 (0.44-2.46)	0.931

318 * Median age [IQR] ; cOR: Crude odds ratio; aOR: Adjusted odds ratio

319

320 Discussion

321 The present study aimed at determining acquired HIV drug resistance mutations
322 (HIVDRMs) and predictors of VF in HIV-infected individuals failing to respond to first-line
323 ART in Moshi municipality, northern Tanzania. High profiles of HIVDRMs conferring
324 acquired HIV drug resistance to NRTIs, NNRTIs and PIs were found. Age was a significant
325 factor associated with VF.

326 In the present study, most (96%) of the successfully sequenced samples had at least
327 one major mutation conferring resistance to HIV drugs. NNRTI resistance mutations profiles
328 (92%) were at the lead compared to NRTIs resistance mutation profiles (68%) consistently
329 with findings elsewhere [6]. The most frequent NNRTI mutations were K103N, V106M, and
330 G190A and they are implicated to confer high level resistance to efavirenz and nevirapine
331 [14]. NNRTIs were previously reported to have low genetic barrier and hence highly
332 vulnerable to resistance [15]. These findings further support the Tanzanian programmatic
333 intervention to replace efavirenz with dolutegravir which has proven to have high genetic
334 barrier to resistance [16]. This study further reports frequent NRTI mutations as M184V,
335 K70R, and D67N in line with other studies [10]. M184V associates with high level resistance
336 to abacavir, emtricitabine, and lamivudine; while K70R and D67N are among thymidine
337 analogue-associated resistance mutations (TAM). More than a half of sequenced samples had
338 at least one TAM. Existence of TAMs reduce the susceptibility of all available NRTIs with
339 an exception of emtricitabine and lamivudine [17].

340 In addition, this study reports co-existence of T69D mutation with at least one TAM
341 in three samples, two of these samples had M41L and T215Y TAMs, a combination which
342 further fuel cross-resistance to all US FDA approved NRTIs, a phenomenon known as Multi-
343 NRTI resistance [14,18]. This means that the Tanzanian AIDS control program is at risk of
344 remaining with fewer options of main-stream HIV drugs both in first and second-line
345 regimens. Presence of T69 insertions along with TAMs in northern Tanzania further
346 advocates the need for implementation of HIV drug resistance testing and monitoring before
347 and after switching HAART. Continuous programmatic monitoring of HIV drug resistance in
348 HIV-infected individuals failing to respond to first-line HIV drugs will preserve the integrity
349 of few NRTI options in second-line. However there is a need to consider deployment of
350 NRTIs with substantial genetic barrier to resistance.

351 In the other hand, this study describes full genotypic susceptibility of prescribed
352 HAART to a 49 years old individual with ID K15, on ART for 12 years and with HIV plasma
353 viral load 81,123 copies/ml. At the interview, he reported good adherence to the prescribed
354 HAART. This may be explained by presence of HIV drug resistance mutations away from
355 the *pol* gene and hence necessitating the need for sequencing the whole viral genome in this
356 sample.

357 A significant association between age and VF concurs with findings from Cameroon
358 [19], Senegal [20], Ethiopia [21], Swaziland [22], Kenya [23,24], Rwanda [25] and Uganda
359 [26]. HIV infected adolescent and young adults on HAART were previously reported to have
360 inconsistency in adhering to antiretroviral medication due to anxiety, depression,
361 forgetfulness, fear of disclosure, ART adverse events and abandoning medication when they
362 feel better [27], the consequences which contributes to VF. Therefore, special care and
363 treatment to the adolescent and young adults is of paramount with emphasis on health
364 education regarding the importance of disclosure and adhering to medications. In addition,
365 assessment and treatment of cognitive and mental health problems is also needed.

366 Although not statistically significant, this study reports the association between
367 advancement of WHO clinical stage of AIDS and VF, a finding which was consistent with
368 those reported by Jobanputra et al in (2015). Virological failure in individuals with advanced
369 HIV/AIDS can be explained by the severe state of immunodeficiency which attracts
370 opportunistic infections (OIs) and replicative fitness of HIV [28]. Early diagnosis of HIV,
371 effective treatment and monitoring of HIV/AIDS and related OIs to patients on HAART is
372 highly recommended [9].

373 Tenofovir (TDF) based combination antiretroviral therapy is one of the recommended
374 first-line antiretroviral of choice to the adolescents and adults living with HIV worldwide [9]

375 as well as in Tanzania [8]. Although not statistically significant, being on tenofovir based
376 first-line HAART was protective against VF, this was consistent with studies previously done
377 in the north America [29], Thailand [30] and in the systematic review [31]. On top of that,
378 TDF based regimens were extensively reported in previous randomized clinical trials to be
379 more effective than other combination therapies in bringing favourable virological and
380 immunologic outcomes [32,33]. The possible explanation of this fact is that, compared to
381 other back-borne antiretroviral, TDF based therapy is consumed once daily with minimal
382 treatment related toxicity [32,34], more tolerable [35] and can be easily adhered by PLHIV
383 [36]. Therefore we complement the prescription of TDF based HAART in PLHIV initiating
384 HAART as the strategy of reducing VF.

385 **Limitations of the study**

386 One of the limitations of this study is to rely on self-reporting of adherence to
387 HAART and pill counting at the clinic visit. It is certain that some of the study participants
388 might have provided imprecise information about adherence. However, this was the common
389 practice prescribed under the Tanzanian HIV and AIDS treatment and management guideline
390 of October 2017. In addition, recall biases are certain to some of the information requested
391 from the VS group, for example it was difficult to report when was the last day to miss taking
392 pills.

393 Finally, the profiles of HIVDRMs should not be generalized as some of the samples
394 were not sequenced due to financial meltdowns. However, compared to the data in this study,
395 similar high proportions of HIVDRMs are anticipated in the samples yet to be sequenced.

396

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398

399 **Conclusion**

400 There is high rate of HIVDRMs in HIV-infected individuals failing to respond to
401 first-line HAART in northern Tanzania. This happens when there is no programmatic
402 monitoring of HIV drug resistance in individuals with VF. Prompt intervention are required
403 to safeguard the limited number of second-line HIV drug options, one of them is
404 implementation of HIV drug resistance monitoring before and after switching HAART. In
405 addition, consideration to deploy HIV drugs with higher genetic barrier is of importance.

406

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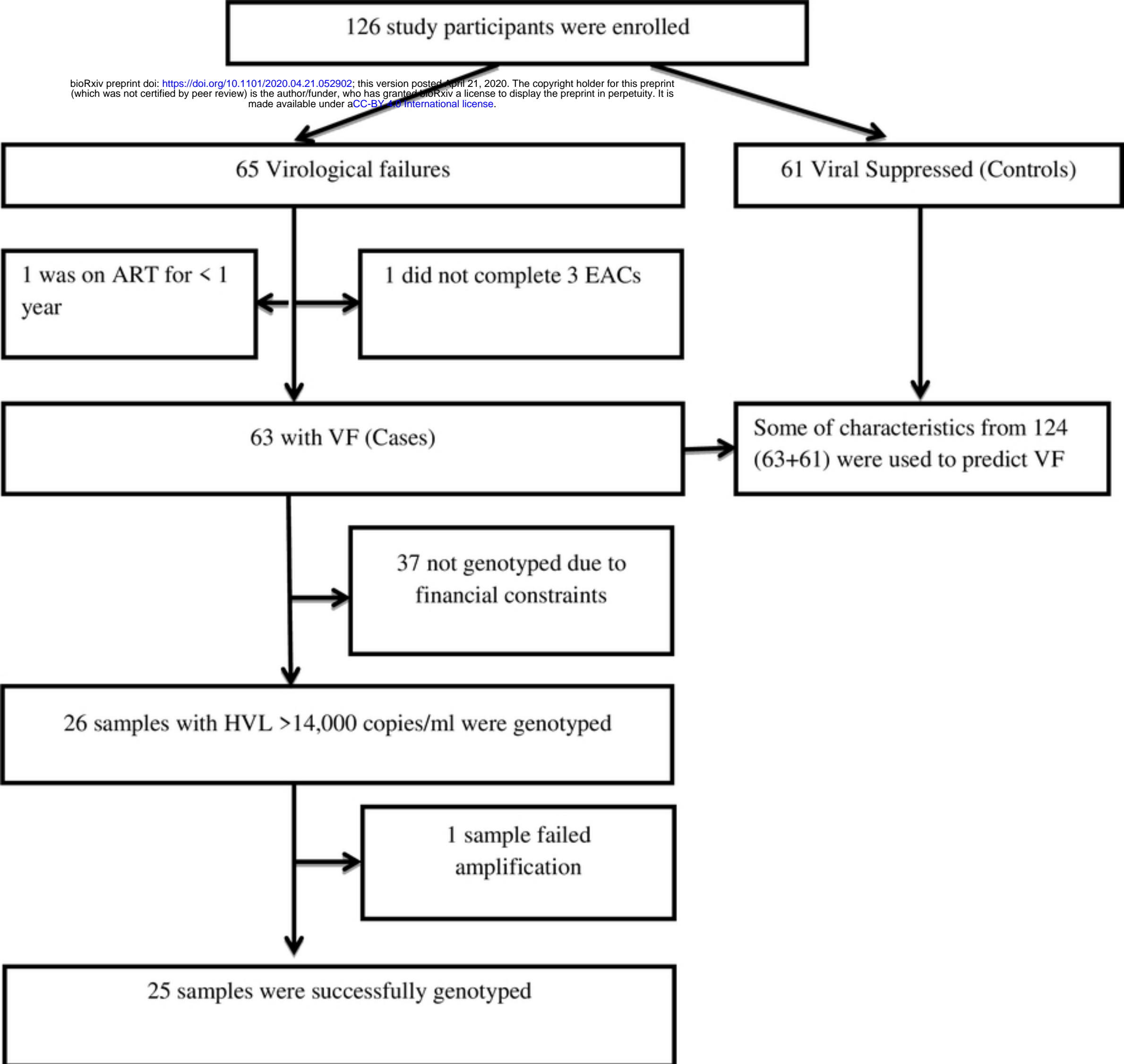
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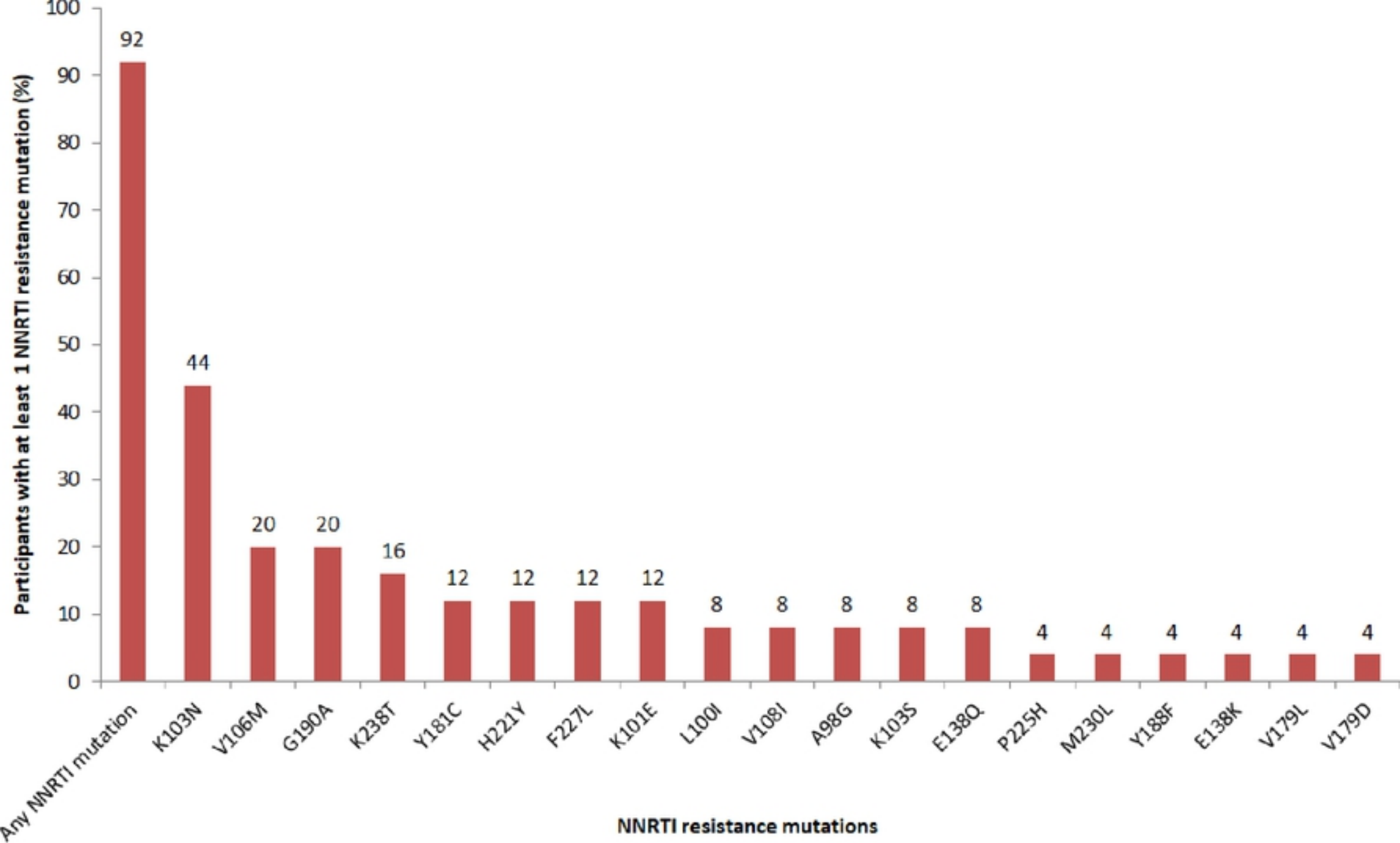
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555 S1 Dataset. Demographic and clinical data

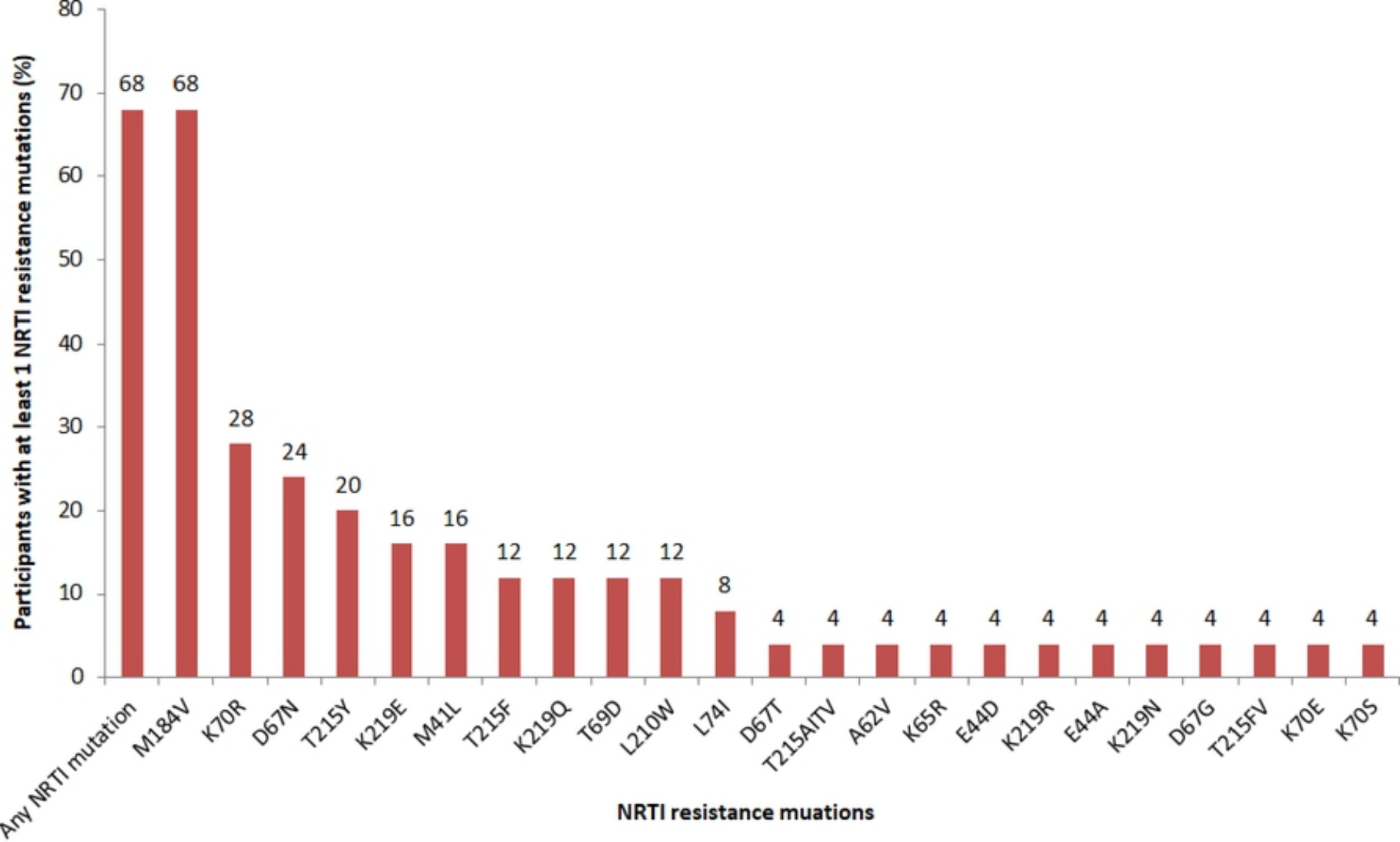


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Figure



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