

Genomic surveillance reveals that the dengue 2 virus lineage responsible for the 2023-2024 epidemic in the French Caribbean Islands is resistant to Mosnodenvir

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Abstract

Dengue fever is the most important arbovirolosis for public health, with more than 5 million cases worldwide in 2023. Mosnodenvir is the first anti-dengue compound with very high preclinical pan-serotype activity, currently undergoing phase 2 clinical evaluation. Here, by analyzing dengue virus (DENV) genomes from the ongoing epidemic in the French Caribbean Islands, we show that they all exhibit mutation NS4B:V91A, previously associated with strong resistance to mosnodenvir *in vitro*. Using antiviral activity tests on clinical and reverse-genetic strains, we confirm a 600-fold decrease in mosnodenvir sensitivity. Finally, combining phylogenetic analysis and experimental testing for resistance, we find that the V91A resistance mutation likely emerged multiple times over the last 30 years in DENV-2 and DENV-3. These results call for increased genomic surveillance, in particular to track lineages with resistance mutations. These efforts should allow to better assess the activity profile of DENV treatments in development against circulating strains.

Keywords

DENV, Genomic surveillance, antivirals, resistance mutation, reverse genetics

Introduction

Dengue is the most prominent arbovirolosis in terms of public health. The number of reported dengue cases rose 10-fold between 2000 and 2019¹ and around half of the world population is estimated to be currently at risk of contracting the disease². Dengue is caused by dengue virus (DENV), a mosquito-borne virus belonging to the *Orthoflavivirus* genus and including 4 different serotypes (1-4). The infection is primarily transmitted through the bite of mosquitoes from the species *Aedes aegypti*, widely distributed across tropical and subtropical latitudes, where the disease is considered endemic³. With the expansion in range of a

secondary vector *Ae. Albopictus*⁴, autochthonous cases of dengue are increasingly reported beyond the subtropics including in Europe, where more than 100 local cases were identified in 2023¹.

The World Health Organization (WHO) reported exceptional numbers for dengue in 2023, with more than 5 million cases and over 5,000 dengue-related deaths, distributed across more than 80 countries and territories². Among these territories, the French Caribbean Islands have been experiencing intense DENV circulation due to the Cosmopolitan genotype of DENV-2. The islands of Guadeloupe, Martinique, Saint Martin and Saint Barthélemy all entered a state of epidemic during the second half of 2023, with more than 30,000 cases as of March 2024⁵. This ongoing epidemic appears to be driven by a single main lineage that circulates in the four islands and has also become established in French Guiana –another French overseas territory located in South America that shares strong ties with the Caribbean Islands⁶.

Vector control has long been the first-line intervention to prevent dengue but in recent years a first vaccine, DENVAXIA⁷, has become available for people with a history of dengue virus infection^{8,9}. Since then, another live attenuated vaccine TAK-003 (QDenga) has been authorized in several countries^{10,11}. Finally, the Butantan–Dengue Vaccine (Butantan-DV) has attracted a great deal of interest following promising Phase III results¹².

Also, in recent years, a new type of DENV antiviral has been discovered using a phenotypic screen¹³, specific to dengue and effective across all 4 serotypes. The first molecule of this series, JNJ A07, has been shown to display *in vitro* and *in vivo* efficacy and to be a highly potent NS4B-inhibitor. NS4B is a small, non-structural protein integrated into the membrane via 5 transmembrane domains. It associates with NS3 to form the scaffolding of the replication complex and is therefore indispensable to the viral cycle¹⁴. JNJ A07 acts by blocking the formation of a NS4B-based complex with NS3/NS2B that supports virus replication¹⁵. The molecule has nM pan-serotype and pan-genotype activity *in vitro* and is highly effective *in vivo* in mice. Two years after the characterization of JNJ A07, an analog optimized for clinical use, JNJ 1802 was produced¹⁶. This molecule, -renamed mosnodenvir for clinical trials- has a pM pan-serotype and genotype activity, and is also active in non-human primates against DENV-2 and DENV-1¹⁶. Mosnodenvir has completed a phase I clinical trial and is now in phase IIa^{17–20}.

Both JNJ A07 and JNJ 1802 have a high resistance barrier and selection pressure assays have shown that key positions within the NS4B induce escape by preventing blockage of the NS3 interaction induced by the molecules. The main resistance-inducing mutations are T108I (low resistance), V91A and L94F (high resistance). Mutations inducing strong resistance to compounds, notably V91A, have previously been observed in NS4B of wild-type strains of DENV-2 and DENV-3 at very low frequency¹⁶.

The French National Reference Center (CNR) for arboviruses implements systematic genomic surveillance for all PCR-positive dengue cases referred to the center. To detect the emergence of DENV lineages potentially resistant to antiviral drugs in development, genomes are routinely screened for potential resistance mutations. Here, by analyzing sequence data from dengue infections from the French Caribbean Islands⁶, we show that the lineage responsible for the current epidemic exhibits the abovementioned V91A resistance mutation to mosnodenvir. By evaluating the antiviral effect of JNJ A07 and JNJ 1802 (mosnodenvir) on a

clinical isolate and on strains reconstituted using reverse genetics, we demonstrate that the epidemic lineage has a high level of resistance to these two molecules. Then, using a combination of phylogenetic analysis and resistance profiling, we show that mosnodenvir resistance V91A has emerged repeatedly over the last 20 years within serotype 2, but also in serotype 3.

Results

The lineage responsible for the current epidemic in the French Caribbean Islands is resistant to JNJ A07 and mosnodenvir

A previous phylogenetic analysis has shown that the epidemic in the French Caribbean Islands is associated with one main lineage belonging to the Cosmopolitan genotype of DENV-2⁶. To determine whether some of the virus strains from the epidemic lineage could be resistant to mosnodenvir, we screened 98 DENV-2 genomes from cases recorded between February 2023 and January 2024 on the islands of Martinique, Guadeloupe, and Saint Barthélemy (Supp Table 1a) for previously described mutations conferring resistance to JNJ A07¹⁵. We found that the NS4B:V91A mutation (corresponding to a T to C transition at position 7001 in the CDS) was present in all DENV sequenced from the epidemic (Supp Table 1b). This observation suggests that the lineage driving the epidemic in the French Caribbean Islands may be resistant to JNJ A07 and mosnodenvir.

Mutation V91A has demonstrated strong resistance *in vitro* against JNJ A07 and JNJ 1802 (i) alone in a replicon system (Asian I genotype), and (ii) combined with other resistance mutations including L94F and T108A in a competent virus (American genotype)^{15,16}. The resistance conferred by mutation V91A could thus be weaker if taken alone and in a genomic background distinct from the ones used to initially demonstrate its effect. Accordingly, we performed resistance profiling analyses for both JNJ A07 and JNJ 1802, using a virus isolate from a case identified during the epidemic in April 2023 in Martinique (Mart-2023). We followed the same protocol as the one employed to characterize the pan genotype/serotype activity of the two molecules *in vitro*^{15,16} and used as a reference CNR-25679, a DENV-2 strain from the Cosmopolitan genotype that lacks the V91A mutation, and for which sensitivity to JNJ A07 and JNJ 1802 (mosnodenvir) has already been described^{15,16}. As a control, we added the adenosine analog NITD008²¹. This broad-spectrum flavivirus inhibitor targets the NS5 and should not be affected by NS4b mutations. Moreover, this compound has previously been characterized against DENV-2 CNR-25679 and others²².

When measuring the activity of our control NITD008 against Mart-2023 and CNR-25679, we obtained similar EC₅₀ values for both strains (fold change below 2), with values very close to what we had previously reported for this molecule²², which validates our experimental protocol (Table 1). For JNJA07, we observed a very sharp decrease in antiviral activity with a fold change above 1900 between the EC₅₀ values obtained with the Cosmopolitan DENV-2 carrying V91A (Mart-2023) and the one without V91A (CNR-25679) (Figure 1, Table 1). Similarly, for JNJ 1802 (mosnodenvir), we observed a fold change above 600 when comparing EC₅₀ values obtained with Mart-2023 and CNR-25679. For both molecules, these differences in EC₅₀ values translate into a drop in level of activity from pM to μM. Our results are in line

with those already described for mutation V91A as well as those we previously reported for our reference DENV-2 CNR-25679^{15,16} and show that the virus isolate from the French Caribbean Islands epidemic exhibits strong resistance to both JNJ A07 and JNJ 1208. Further, this finding suggests that all strains belonging to the French Caribbean islands epidemic lineage are likely resistant to JNJ A07 and mosnodenvir as they all exhibit mutation V91A.

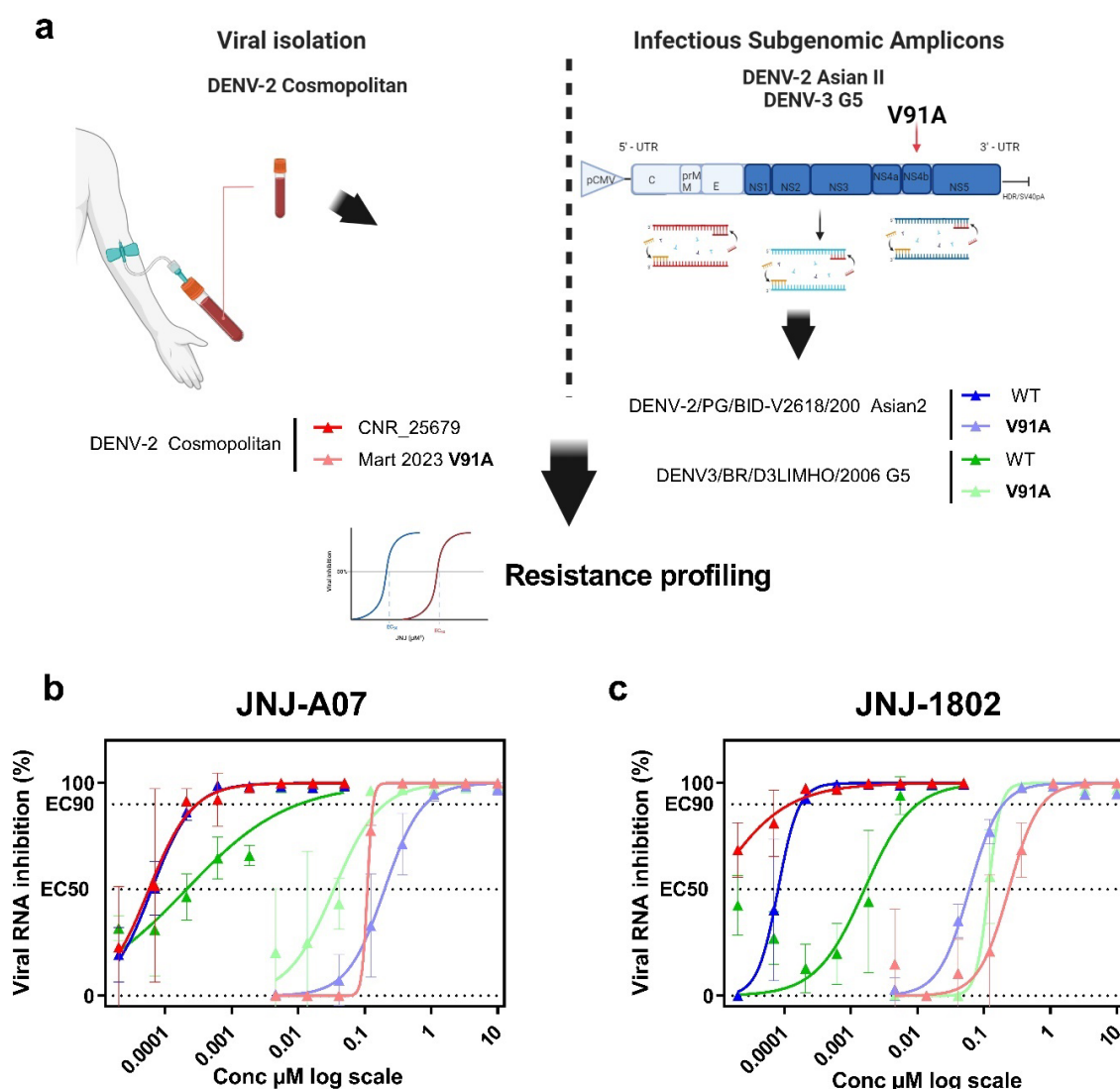


Figure 1: In vitro characterization of V91A strains against JNJ A07 and JNJ 1802. a) Strategy used to characterize the resistance mutation V91A against JNJ A07 and 1802 NS4B inhibitors either by testing clinical samples as well as with the ISA technic. Dose response curves reporting the susceptibility of DENV against b) JNJ A07 and c) JNJ 1802. Data presented are from a representative experiment in three technical replicates in VeroE6, and error bars show mean \pm s.d

Table 1: Activity of JNJ A07, JNJ 1802 and NITD008 against wild type and V91A strains. Interpolated EC₅₀ values are expressed in µM. EC₅₀ are the mean n=2 to n=8 independents experiments, see Supp. Table 2 for detailed EC₅₀ and EC₉₀ values. Fold change reductions were calculated in comparison with the EC₅₀ of each NS4B wild type genotype strain. f.c: fold change

Serotype		2				3	
Genotype		Cosmopolitan		Asian-2		V	
Strain		DENV-2 CNR_25679	DENV-2 Mart 2023 V91A	DENV-2/PG/BID- V2618/2008	DENV-2/PG/BID- V2618/2008 V91A	DENV3/BR/D3LIMHO/2006	DENV3/BR/D3LIMHO/2006 V91A
JNJ A07	EC50 (µM)	0.000067	0.11	0.000069	0.20	0.001160	0.03
	EC90 (µM)	0.000204	0.13	0.000252	0.82	0.004639	0.33
	f.c	-	1644.4	-	2892.9	-	23.0
JNJ 1802 (mosnoden- vir)	EC50 (µM)	0.000008	0.19	0.000081	0.08	0.001128	0.10
	EC90 (µM)	0.000122	0.82	0.000176	0.20	0.008247	0.43
	f.c	-	23414.1	-	1004.7	-	87.2
NITD008	EC50 (µM)	0.80	1.12	1.29	1.1	0.39	0.6
	f.c	-	1.4	-	0.9	-	1.5
fc<5		5>fc>100	fc>100				

Mutation V91A appeared shortly before the emergence of the lineage circulating in the French Caribbean Islands

Our sequence data analysis indicates that all strains from the French Caribbean Islands exhibit V91A, suggesting that the mutation emerged in a precursor of the epidemic lineage, the latter may have descendants circulating in other locations in the Caribbean or elsewhere. To evaluate if V91A is present in phylogenetic relatives of the French Caribbean Islands epidemic lineage, we combined the 98 DENV-2 sequences from the epidemic with all near-complete public genomes (>8500 nt) from the Cosmopolitan genotype of DENV-2 and inferred their phylogenetic relationships (Figure 2). We found that mutation V91A was only present in the closest phylogenetic relative of the French Caribbean Islands epidemic clade, a sequence sampled from a case in Florida in July 2023 (DENV-2/USA/FL-BPHL-0109/2023, Genbank accession: OR771147), which suggests that the mutation may have emerged recently. To estimate the time of emergence of V91A, we used a Bayesian approach to infer the time to the most recent common ancestor (TMRCA) of the French Caribbean Islands epidemic clade and DENV-2/USA/FL-BPHL-0109/2023. We found that the TMRCA estimate was around September 9th 2022 (95% highest posterior density [HPD] interval: [2021-12-12:2023-01-07]), which indicates that the emergence of V91A likely shortly preceded that of the lineage associated with the epidemic in the French Caribbean Islands (estimated to be around September 30th 2022 (95% highest posterior density [HPD] interval: [2022-06-24:2022-12-26]))⁶.

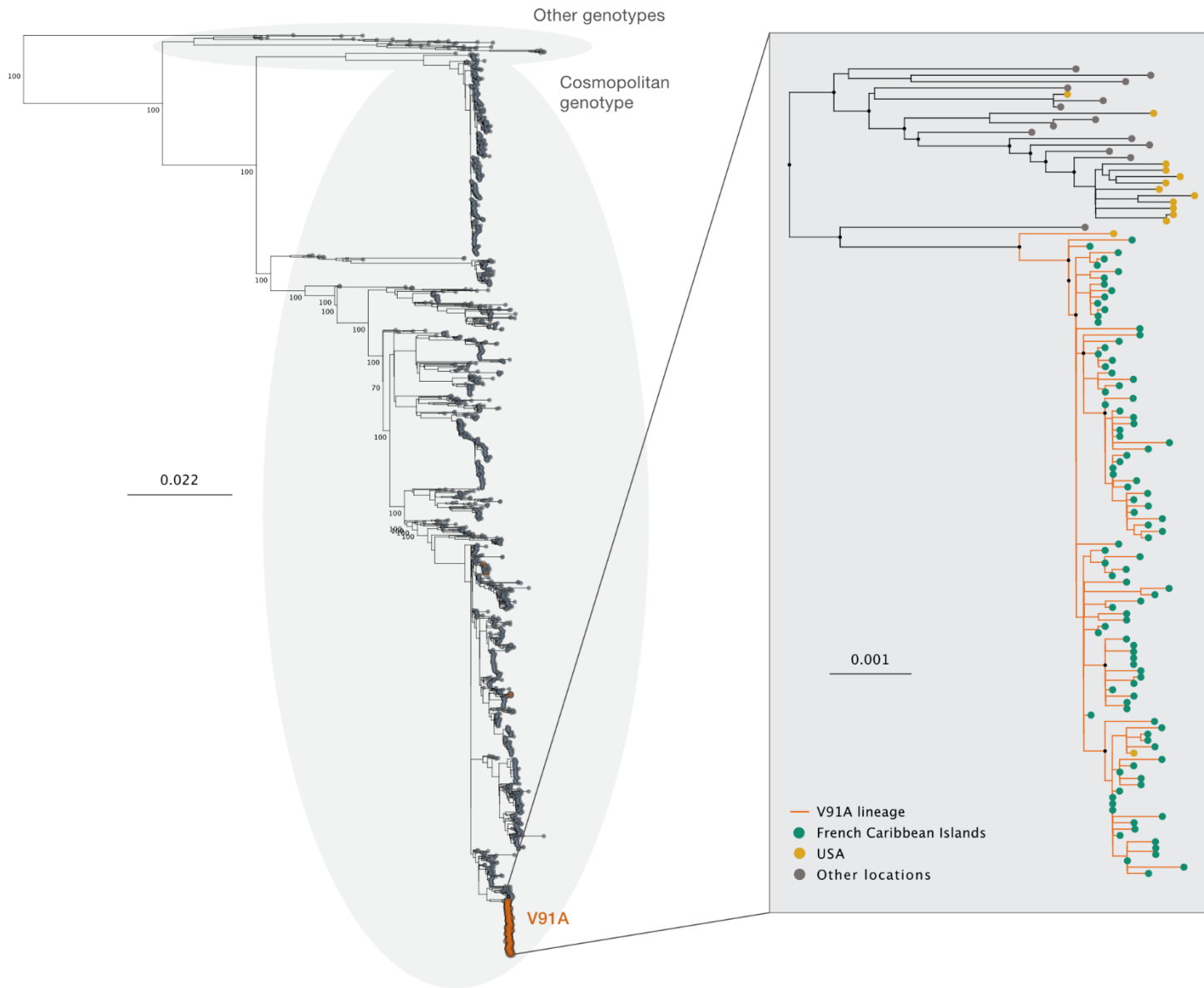


Figure 2: V91A is present in the entire epidemic clade and its closest phylogenetic ancestor. Maximum-Likelihood phylogeny of all publicly available genomes from the French Caribbean Islands epidemic combined with all DENV2 sequences from the Cosmopolitan genotype covering more than 85 % of the CDS available on Genbank as of March 2024 and a set of reference sequences from other genotypes. Phylogenetic inference was performed using IQTREE2 under a GTR+F+R5 substitution model with ultrafast bootstrap approximation (1000 replicates). The tree was rooted using the sylvatic genotype of DENV2. In the subtree in the right-hand panel, sequences from the French Caribbean Islands are highlighted in sea green and sequences from the USA (Florida) are colored in mustard yellow, sequences from other locations are colored in grey. Branches are colored in orange for lineages exhibiting the V91A mutation. In the main tree, bootstrap values are shown for all nodes with more than 800 descendants. In the French Caribbean Islands subtree, all nodes with a bootstrap support above 95 and more than 10 descendants are highlighted with a black circle.

Mosnodenvir resistance has emerged repeatedly within DENV-2 serotype over the last 30 years

Our phylogenetic analysis results indicate that the mosnodenvir resistance-inducing mutation V91A has emerged in a precursor of the Cosmopolitan DENV-2 lineage that is associated with the current epidemic in the French Caribbean Islands. This is however, not the first time that V91A is identified in circulating DENV lineages¹⁶. A previous study reported that 1.3% of the sequences available as of May 2020 on the Virus Pathogen Resource database (ViPR, now BV-BRC at <https://www.bv-brc.org/>), exhibited the mutation, which suggests that resistant lineage(s) other than the one associated with the French Caribbean Islands epidemic have circulated –and may still circulate.

To determine whether –in addition to the current event– V91A has occurred once or multiple times within serotype 2 and to identify the genotypes compatible with the mutation, we downloaded all DENV-2 sequences available on Genbank as of March 2024. When screening the sequences, we found that 37 exhibited the V91A mutation in addition to sequences from the French Caribbean Islands, its closest phylogenetic relative and another sequence from Florida likely corresponding to a potential import from the French Caribbean epidemic (Figure 2). These sequences amount to ~0.86% of all 4658 publicly available sequences covering the NS4B region of DENV-2 (See Supp. Table 3 and Supp. Figure 1). To determine the genotypes of these sequences, we combined V91A sequences with a set of reference sequences representative of DENV-2 genotypes and performed phylogenetic inference. We found that the 37 sequences carrying the V91A mutation were distributed across three genotypes: Asian I (30 sequences), Cosmopolitan (5 sequences), and Asian American (2 sequences) (Supp. Figure 1). These results show that V91A is compatible with at least three genotypes within the DENV-2 serotype.

To evaluate the number of emergence events associated with V91A-carrying lineage(s), we built a maximum-likelihood phylogeny using all DENV-2 nearly complete genomes publicly available on Genbank as of March 29th 2024. We found that V91A has emerged at least on twelve occasions over the last 30 years within serotype 2 — in addition to the present event associated with the French Caribbean Islands epidemic (Figure 3). Most of the 91A sequences were isolated on the tree, suggesting the virus lineages exhibiting the mutation were either relatively short-lived and of small magnitude or largely undersampled. Six of the 91A sequences were recent, with sampling dates in the year 2019 or later. We could, however, identify three clades of larger magnitude, that encompassed sequences sampled over several years. Two small clades encompassed two sequences each, one from Thailand, with sequences sampled in 2007 and 2010, and one from Viet-Nam with sequences sampled in 2022 and 2023. The third clade we identified comprised 21 sequences from Thailand, sampled in 2001, 2004, 2005, and 2014. These results show that V91A has emerged repeatedly over the last 30 years, with possible instances of circulation over multiple years in addition to the present epidemic in the French Caribbean Island.

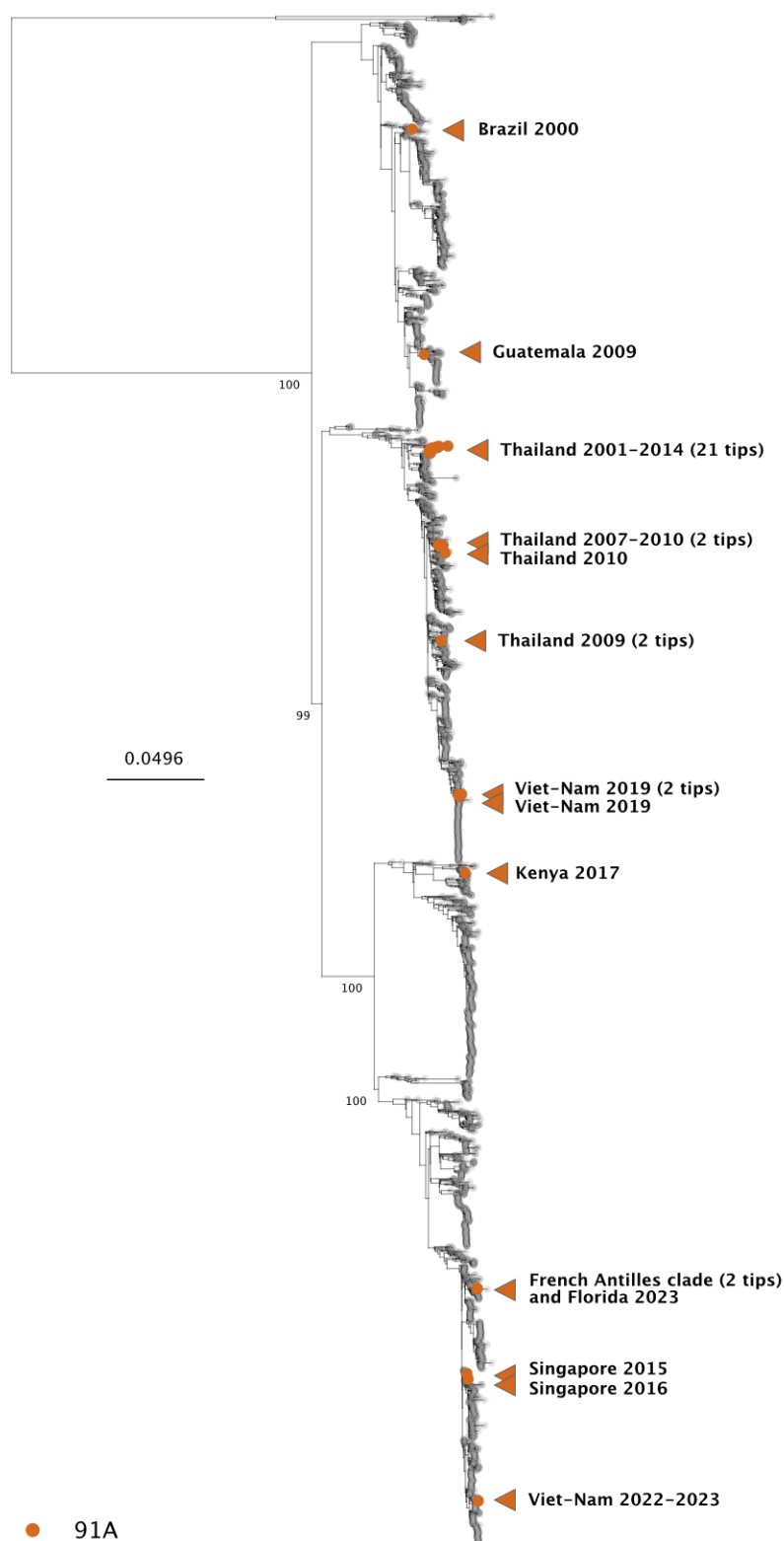


Figure 3: V91A emergence events within DENV-2 serotype. Maximum-Likelihood phylogeny of all publicly available genomes for DENV2 covering more than 85 % of the CDS available on Genbank as of March 2024. Phylogenetic inference was performed using IQTREE2 under a GTR+F+R5 substitution model with ultrafast bootstrap approximation (1000 replicates). The tree was rooted using the sylvatic genotype of DENV2. Sequences exhibiting the V91A mutation are highlighted in orange. Only one representative from the French Caribbean Islands clade was included in the tree (in addition to the two sequences from the USA, one corresponding to the closest phylogenetic relative of the clade and the other to a potential import from the epidemic into Florida). Bootstrap values are shown for all nodes with more than 1280 descendants.

Previous studies^{15,16} have shown that V91A confers resistance to both JNJ A07 and JNJ1802 in the Asian I (replicon system) and American (live virus) DENV-2 genomic backgrounds and our experiment identified a similar behavior with the Cosmopolitan genotype. These results suggest that V91A confers resistance across multiple –potentially all– genotypes of DENV-2. To confirm the pan-DENV-2 effect of the V91A mutation, we evaluated its ability to confer resistance against JNJ A07 and JNJ 1802 (mosnodenvir) in a DENV-2 from the Asian II genotype (DENV-2/PG/BID/V2618/2008). Taking advantage of the versatility of the ISA reverse genetics method²³ we introduced V91A into a reverse genetics system already developed for DENV-2/PG/BID-V2618/2008²². We then compared the resistance profiles of the Asian II “wild type” strain and of its V91A mutant counterpart as we did previously for the two Cosmopolitan strains. For the DENV-2 Asian II wild-type strain, we obtained a profile similar to that of the Cosmopolitan strain DENV-2 CNR-25679, with a high sensitivity of the wild-type to both molecules, with EC₅₀ values in the pM range (Figure 1 and Table 1). Similarly, we observed a strong resistance phenotype with a fold change above 100 for the V91A mutant strain (Table 1), with EC₅₀ values in the μM range. Combined with our previous findings, these results show that V91A is able to confer robust resistance to JNJ A07 and mosnodenvir across most genotypes of DENV-2.

The mosnodenvir-resistance mutation V91A previously also emerged in DENV-3, but has not been reported in DENV-1 or DENV-4

In the previous section, we showed that V91A has been observed in other DENV-2 lineages than the French Caribbean Islands epidemic clade, with at least thirteen events of emergence events in DENV-2 over the last 30 years. As V91A has also been reported in circulating lineages of DENV-3¹⁶ we investigated DENV-1, DENV-3 and DENV-4 public sequence data to assess the emergence of V91A-lineages beyond serotype 2.

To determine the number of V91A emergence events within DENV serotype 3 and to identify the genotype(s) associated with the mutation, we downloaded all DENV-3 sequences available on Genbank as of December 5th 2023 and screened them for the V91A mutation. In all, we identified 10 sequences carrying the V91A mutation, amounting to ~0.4% of all publicly available 2189 sequences covering the NS4B region of DENV-3 (Supp. Table 4). Also, we identified one sequence carrying a V to L change at position 91 in the NS4B instead V to A. To determine the genotype of the DENV-3 sequences carrying mutation V91A, we combined them with a set of reference sequences representative of DENV-3 genotypes and performed again a phylogenetic inference. We found that the 10 sequences carrying the V91A mutation were equally distributed across genotypes II (5 sequences), and III (5 sequences) (Supp. Figure 2). The V91L sequence belonged to genotype II. To evaluate the number of emergence events associated with the DENV-3 91A-carrying sequences, we built a phylogeny of all DENV-3 genomes publicly available on Genbank as of December 2023. We found that V91A emerged at least on 7 occasions over the last 30 years within serotype 3 (Figure 4). All but two of the 91A sequences were isolated on the tree, which suggests -as observed for DENV-2- that most lineages with the mutation were relatively either short-lived with limited magnitude or undersampled. Only two sequences from Nicaragua from the years 2012 and 2013 grouped together in the phylogeny, which indicates a potential instance of lineage circulation over

several months. Overall, these results show that V91A emerged multiple times within serotype 3 over the last 30 years and might have been associated with sustained virus transmission.

As we identified naturally occurring V91A-lineages within DENV-3 genotypes I and III, we sought to determine whether V91A also conferred resistance to JNJ A07 and JNJ 1802 (mosnodenvir) in a DENV-3 background. Using the same experimental setup as in the previous experiments, we evaluated the activity of both molecules against a DENV-3 strain from genotype V (DENV-3/BR/D3LIMHO/2006) and its V91A-mutant counterpart produced by reverse genetics. For the DENV-3 strain carrying the V91A mutation, we observed EC_{50} values similar (between 0.02 and 0.12) to those obtained for V91A-DENV-2 strains (all comprised between 0.08 and 0.8, Figure 1 and Table 1). But for the wild-type DENV-3 strain, we found EC_{50} values were higher (~ 0.001) than those obtained for wild-type DENV-2 strains (ranging between 0.00006 and 0.0004). These results indicate that in DENV-3, V91A does induce resistance against both molecules, with fold changes between 18 and 60 (JNJ A07 and JNJ 1802, respectively), albeit with a weaker effect than that observed in DENV-2 — all fold changes were above 100 with DENV-2 strains (Table 1).

To determine if V91A circulating lineages have been identified within DENV serotypes 1 and 4, we downloaded all DENV-1 and DENV-4 sequences available on Genbank as of the 28th and 20th of November 2023, respectively, and screened them for the V91A mutation. Within DENV-1, none of the 5434 sequences exhibited an A at position 92 in the NS4B (equivalent of NS4B position 91 in DENV-2) but we identified 12 sequences with a V to I change at that position, all originating in Thailand and collected between 2004 and 2006. Finally, we screened 968 DENV-4 sequences but none of them carried a V to A change at position 88 in the NS4B (equivalent of NS4B position 91 in DENV-2). These results suggest that V91A is not present in past or currently circulating lineages from DENV serotypes 1 and 4.

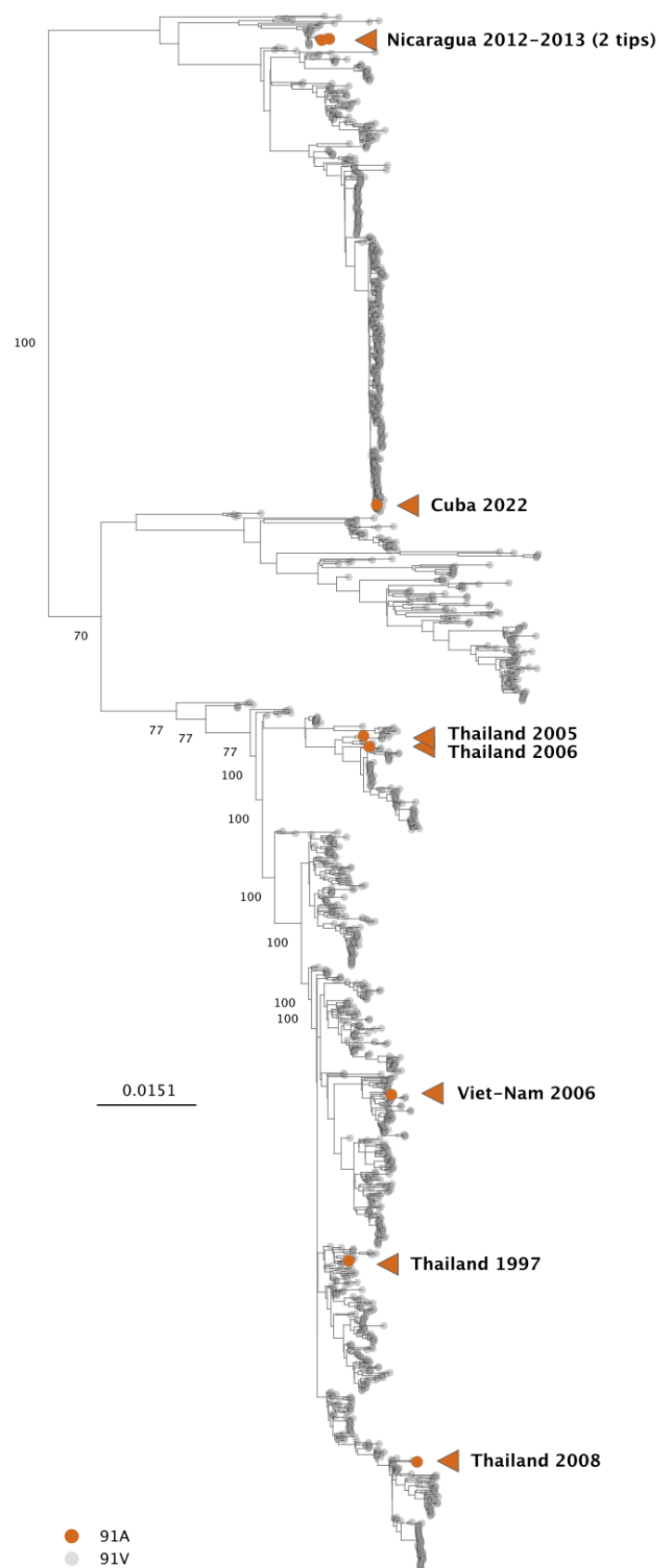


Figure 4: V91A emergence events within DENV-3 serotype. Maximum-Likelihood phylogeny of all publicly available genomes for DENV3 covering more than 85 % of the CDS available on Genbank as of December 2023. Phylogenetic inference was performed using IQTREE2 under a GTR+F+R5 substitution model with ultrafast bootstrap approximation (1000 replicates). The tree was rooted using DENV1. Sequences exhibiting the V91A mutation are highlighted in orange. Bootstrap values are shown for all nodes with more than 500 descendants.

DISCUSSION

Due to its economic importance, public health burden and the number of people exposed, the development of countermeasures against dengue fever has been a priority over the last two decades. In addition to the significant progress made recently in the development of quadrivalent live attenuated vaccines, the identification of effective antivirals remains crucial, both for prevention in people who cannot be vaccinated or who respond poorly to the vaccine, and in people who are already infected, particularly if they are at risk of developing serious clinical forms, such as patients with sickle cell disease. In order to be effective and sustainable, antiviral therapies need to be implemented along with robust genomic surveillance of circulating strains to i) ensure that treatments are used against susceptible strains and ii) that their use does not lead to the emergence of resistance mutants.

Recent experiments demonstrated that the activity of a promising dengue antiviral molecule, mosnodenvir, can be impaired by the presence of resistance mutations in NS4B in particular V91A and L94F^{15,16}. Here, we show that the V91A mutation does indeed induce strong resistance to this compound in DENV-2, using both an epidemic strain and a strain from the genotype Asian II, engineered through reverse genetics¹⁵. Along with previous experiments^{15,16}, our results validated the ability of V91A to confer strong resistance to mosnodenvir, alone, and across most genotypes of DENV-2 (Cosmopolitan, Asian I, Asian II, and Asian American). The breadth of the effect of V91A on the resistance of strains from DENV-2 to mosnodenvir—strong resistance was observed four out of six genotypes—suggests the mutation might also induce robust mosnodenvir resistance in the American and Sylvatic genotypes. However, these two genotypes have not been tested in this study as they are the least prominent in terms of epidemiology. The American genotype has been displaced by the Asian American genotype²⁴, and the sylvatic genotype is much less frequently reported than its counterparts^{25–28}.

As mutation V91A mutation can be found in clinical isolates of DENV-2 but also DENV-3, we also evaluated the effect of V91A on resistance to mosnodenvir in this serotype. Interestingly, we only obtained a moderate increase in resistance, with a fold change of 60 in EC₅₀ values. As V91A was obtained in DENV-2 resistance selection experiments, it is possible that the antiviral effect is in part specific to the topology of NS4B in this serotype and in DENV-3. Alternatively, this more moderate change in resistance could be explained by the naturally lower activity of mosnodenvir (and JNJ A07) against wild-type DENV-3¹⁴, as the EC₅₀ values obtained with DENV-3-V91A and DENV-2-V91A strains were comparable. Interestingly, the EC₅₀ obtained for all the V91A strains (0.2<EC₅₀<1μM) are similar to the one obtained with closely related flaviviruses¹⁶ WNV, JEV and ZIKV highlighting the fact that the main antiviral mechanism is based on blocking the NS4B/NS3 interaction is likely impaired, but that a less specific pan-flavivirus antiviral activity may remain.

When assessing the prevalence of V91A in DENV-3, we identified another type of amino acid change at position 91 in the NS4B, from a valine to a leucine. While this change in residue is not equivalent to a valine to alanine shift (the valine side chain is longer than the alanine but shorter than the leucine), since it is located at the same position, it might also affect the sensitivity of DENV-3 strains to mosnodenvir and deserves further investigation. Similarly,

while we did not identify the equivalents of V91A in any of the sequences publicly available for DENV-1 (V92A) and DENV-4 (V88A), we found 10 DENV-1 sequences carrying a valine to isoleucine change at the same position. As for DENV-3 V92L mutation, this mutation may not be equivalent to V91A but still deserves further investigation of its ability to confer resistance to mosnodenvir.

In this study, we identify the mosnodenvir-resistance mutation V91A in an epidemic lineage of DENV-2 which suggests that the mutation is not detrimental to the replicative fitness or transmission cycle of the virus. We demonstrate that a strain from this lineage has increased resistance to the antiviral molecule with a more than 100-fold loss in sensitivity *in vitro*. Although our findings have not yet been confirmed *in vivo*, they raise concerns regarding the efficacy of this antiviral molecule in patients infected with resistant strains. According to the pharmacokinetic results of the phase 1 study¹⁷, to ensure the efficacy of the treatment, it would be necessary to maintain a concentration higher than the EC₉₀ of DENV-2 Martinique, i.e. 0.8 μ M, which corresponds to 471 ng/ml (similar EC values were observed for the V91A-DENV-2 Asian II and V91A-DENV-3 strains). The ongoing phase 2 clinical trial involves the use of two doses, a high dose consisting of a loading dose of 400 mg for two days, followed by a maintenance dose of 150 mg. The low dose consists of a loading dose of 150 mg for two days, followed by a maintenance dose of 50 mg²⁹. Given mosnodenvir pharmacological profile, plasma concentrations higher than 471 ng/ml will not be reached in the low-dose arm despite the observed plasma accumulation¹⁷. In the high-dose arm, the plasmatic concentration will reach and remain above 500 ng/ml for around ten days¹⁷. Once *in vivo* data is available for mosnodenvir resistant strains, the results from the second arm of this trial may be useful to evaluate the clinical efficacy of mosnodenvir, originally developed with nM activity but on strains with μ M activity.

While our work provides evidence that DENV-2 and DENV-3 strains with resistance to mosnodenvir have circulated and still circulate, for now, these strains likely constitute a minor fraction of circulating DENV strains. In 2023 in the Americas, the two only locations where the V91A lineage circulated in 2023 are the French Caribbean Islands and French Guiana – the epidemic lineage was shown to have expanded from the Caribbean to French Guiana. Among the more than 4.2 million cases reported in the Americas in 2023, only ~25,000 cases originated in the French Caribbean Islands³⁰ and ~2000 from French Guiana (where DENV-3 dominated for most of the year³⁰, which would represent less than 1% of reported cases in 2023 in the Americas. These estimates are obviously crude and complicated by heterogeneities in surveillance –both in terms of reported cases and of virus genomes sampled. On the public database BV-BRC (as of March 29th, 2024), there are currently less than 1000 sequences (>8500 nucleotides) published for the year 2023, our knowledge of the lineages that circulated that year is therefore still extremely partial. Nevertheless, based on the data at hand –and disregarding the potential presence of other resistance mutations– most circulating dengue strains should be sensitive to mosnodenvir, which thus remains a crucial tool in the fight against dengue.

From this perspective, the findings from this study re-emphasize the need for robust genomic surveillance as we show that mosnodenvir-resistant DENV lineages have circulated in the

recent past and still circulate. The ongoing circulation of an antiviral-resistant lineage of DENV-2 in an epidemic context in the French Caribbean Islands is of particular concern. First, the Lesser Antilles have been identified as a source of DENV dissemination, seeding other American countries in the past³¹. Second, there is phylogenetic evidence that the lineage in question both became established on the American continent (French Guiana), and initiated autochthonous circulation events in Europe (France)⁶. Finally, in this study we also identified V91A-sequences from 2023 in Asia (Viet-Nam Figure 2), which suggest V91A lineage(s) might currently circulate in that region. However, based on the only sequence available, it is challenging to assess this last point in reliable terms at present.

With the exceptional dengue activity reported in recent years, and with 2024 shaping up to be even more devastating than previous years³², ensuring the effectiveness of the tools used to control this disease appears more crucial than ever. Here, we provided evidence of large-scale transmission of a mosnodenvir-resistant lineage in the French Caribbean Islands, which could severely limit the effectiveness of this antiviral treatment in similar epidemics in the future. By combining phylogenetic inference, reverse-genetics and in vitro experiments, we show that resistance to mosnodenvir has emerged repeatedly in the recent past, indicating a clear risk of circulation of resistant DENV-2 and DENV-3 strains in the future. Our findings warrant for increased genomic tracking of circulating dengue lineages globally, and provide an example of how genomic surveillance and resistance profiling can be effectively combined to investigate the circulation of antiviral resistance virus strains.

MATERIALS AND METHODS

Materials

Cell line

VeroE6 cells (CLC 1586) were obtained from ATCC and were grown in MEM (Minimal Essential Medium-Life Technologies) with 7.5% heat-inactivated Fetal Calf Serum (FCS; Life Technologies with 1% penicillin/streptomycin PS, 5000U.mL⁻¹ and 5000µg.mL⁻¹ respectively (Life Technologies) and supplemented with 1 % non-essential amino acids (Life Technologies), at 37°C with 5% CO₂.

Viral strains description

Genotype Cosmopolitan strain DENV-2 CNR_25679 (France, GenBank: MF004385, EVAg Ref-SKU:001V-02229), genotype Asian II strain BID-V2618 (Papua New Guinea, GenBank: FJ906959.1, EVAg Ref-SKU:001V-03106), and genotype V strain DENV3/BR/D3LIMHO/2006 (Brazil, GenBank: JN697379.1, EVAg Ref-SKU: 001V-03108) were phylogenetically described elsewhere¹⁵ and were previously used to characterize JNJ A07¹¹ and JNJ 1802¹⁵.

Strain DENV-2 Mart-2023 was isolated by inoculating 100 uL of sample residual from diagnostics on a confluent culture of Vero E6 on 6-well flat bottom cell culture plates. The

inoculum was incubated 1 hour at 37°C in a 5% CO₂ atmosphere to infect cells monolayers prior to be removed and replaced by 4 mL of MEM supplemented with 7% heat-inactivated FBS, 1% penicillin–streptomycin, 1% L-glutamine, 1% Kanamycin, and 3% Amphotericin B. Cell cultures were examined daily for the potential presence of cytopathic effect (CPE). At post-inoculation day 5, supernatants were aliquoted and used for RNA extraction and virus detection by RT-qPCR.

Virus propagation

To prepare our working stocks, a 25 cm² culture flask of confluent Vero E6 cells growing with MEM medium with 2.5 % FBS (Life Technologies) was inoculated with 100 µl of infectious supernatant. Cell supernatant medium was harvested at the peak of infection and supplemented with 25mM HEPES (Sigma) before being stored freeze in small aliquots at -80°C.

All experiments with replicative viruses were performed in a BSL3 laboratory.

All virus strains are available for the community at European Virus Archive.

<https://www.european-virus-archive.com/>

Antiviral Compounds

JNJ A07 was purchased from MedChemexpress, JNJ-1802 was purchased from Probechem and NITD008 was purchased from Hit2lead (www.hit2lead.com).

Methods

RNA extraction and quantification

Viral RNA was performed as previously described^{15,16,22} using a QIAamp viral RNA kit on the automated QIAcube (Qiagen) following manufacturers recommendations. Relative quantification of viral RNA was performed as previously described^{15,16,22} using the GoTaq® 1-Step RT-qPCR System kit (Promega). The mixture contained 5 µL of 2x Master Mix, 0.25 µL of each primer (250 nM), 0.07 µL of probe (75 nM), 0.2 µL of GoScript RT Mix and 3.8 µL of extracted nucleic acids. Assays were performed using the QuantStudio 12 K Flex real-time PCR machine (Life technologies). Synthetic RNA was used to calculate the amount of viral RNA from standard curves. Set of primers and probes used for RT-qPCR have been already described²²

EC₅₀ and EC₉₀ determination

One day prior to infection, 5×10⁴ VeroE6 cells per well were seeded in 100µL assay medium (containing 2.5% FBS) in 96 well culture plates. The next day, antiviral compounds (JNJ A07, JNJ 1802 and NITD008) were added using the D300e dispenser (TECAN) with eight ½ dilutions. JNJ A07 and JNJ 1802 two types of experiments were performed one with “low dose” to determine wild type strains EC₅₀ and EC₉₀ and one with high dose to determine strains carrying V91A EC₅₀ and EC₉₀. Then, 25µL/well of a virus mix diluted in medium was added to the wells. Prior to the assay it was verified for each DENV strain that they were harvested

during the logarithmic growth phase of viral replication at 96 hours post infection^{15,16,22}. Four virus control wells were included within the plate. Quantification of DENV genome by real-time RT-qPCR was done as previously described^{11,12,15}. Viral inhibition was calculated as follow: $100 * (\text{quantity mean VC} - \text{sample quantity}) / \text{quantity mean VC}$. The 50% effective concentrations (EC50 compound concentration required to inhibit viral RNA replication by 50%) and the 90% effective concentrations (EC90 compound concentration required to inhibit viral RNA replication by 90%) were determined using logarithmic interpolation after performing a nonlinear regression (log(inhibitor) vs. response --Variable slope (four parameters)). All data obtained were analyzed using GraphPad Prism 9 software (Graphpad software).

Infectious Subgenomic Amplicons

Generation of subgenomic amplicons from de novo synthesized gene (Genscript), design, transfection and virus rescue for these strains were already described²². Primers used to generate the sub genomic amplicons have already been described²².

Virus sequence datasets

All publicly available sequences for dengue virus were downloaded for each of DENV serotypes from the NCBI Nucleotide database, Genbank (keywords: “Dengue virus 4” database accessed in November 2023; “Dengue virus 1” database accessed on November, 2023; “Dengue virus 3” database accessed in December, 2023; “Dengue virus 2” database accessed on March, 2023). We filtered the data by: (i) excluding sequences that did not belong to DENV species, (ii) excluding sequences corresponding to patents, recombinants, clones. The remaining sequences were aligned using MAFFT (version 7.511³³), trimmed to their coding regions (ORF) and inspected manually. We kept only the sequences encompassing the region of the NS4B protein encompassing the V91A mutation (for serotypes 1 and 2), or its equivalent for serotypes 3 (92) and 4 (88). Final datasets included 5434 sequences of DENV1, 4658 sequences of DENV2, 2189 datasets of DENV3, and 968 sequences of DENV4. We also generated a set comprising exclusively DENV2-Cosmopolitan sequences (length > 8500 nt, 1828), and a set corresponding to the 98 sequences from the French Caribbean Islands current epidemic available on Genbank as of March 2024.

Prevalence analysis

We used the four datasets comprising all DENV-1, DENV-2, DENV-3 and DENV-4 sequences to screen for the the V91A mutation or its equivalent for DENV1 (V92A) and DENV4 (V88A). For DENV-2 and DENV-3 sequences carrying the V91A mutation, we determined their genotype by combining them with reference sequences representative of DENV-2 and DENV-3 genotypes and inferring a maximum-likelihood phylogeny with IQ-Tree (version 1.6.12, [8-9]), using the best-fit model identified by ModelFinder and assessed branch support using an ultrafast bootstrap approximation (UFBoot2) (1000 replicates).

Inference of phylogenies for DENV-2, DENV-2 Cosmopolitan, and DENV-3

We first filtered out all sequences with a CDS length below 8500 nucleotides from the DENV-2 and DENV-3 datasets and then removed potential recombinant sequences from the DENV-2, DENV-2 Comopolitan and DENV-3 datasets using the Recombination Detection Program (RDP) version 4. We used RDP, GENCONV and MAXCHI methods for primary screening and BOOTSCAN and SISCAN methods to check for recombination signals^{34–38}. We used the automask option to ensure optimal recombination detection. V91A-carrying DENV-2 sequence OQ028215 and DENV-3 sequences KF921927 and MZ008477 were identified as potential recombinant and thus removed from downstream analyses.

Using the resulting recombinant-free alignments, we performed ML phylogenetic reconstruction with IQ-Tree (version 1.6.12³⁹), using a GTR+F+R5 model (General time reversible model with empirical base frequencies and a FreeRate model with 5 categories) and assessed branch support using an ultrafast bootstrap approximation (UFBoot2) (1000 replicates).

Bayesian inference of a time-resolved phylogeny

To evaluate the timing of emergence of the V91A mutation in the precursor of the lineage circulating in the French Caribbean Islands, we reconstructed time-scaled phylogenies with BEAST (v1.10.5⁴⁰), using a subset of 69 sequences from the French Caribbean Islands 2023 under the Shapiro-Rambaut-Drummond-2006 (SRD06) substitution model, a uncorrelated lognormal (UCLN) clock model clock, and a bayesian skygrid coalescent model. We ran two MCMC chains of 50 million states with the BEAGLE computational library⁴¹. We used Tracer (v1.7⁴²) for inspecting the convergence and mixing, discarding the first 10 % of steps as burn-in, and ensuring that estimated sampling size (ESS) values associated with estimated parameters were all >200

All alignment, xml, and tree files for this study are available at: https://github.com/Snseli/Dengue_resistance_supplementary.git.

Author Contributions

Conceptualization: FT, RK, XdL

Methodology: HSB, SS, GP, RA, TC, MG, AF, NA, LP

Formal analysis: FT, RK, SS, RA, GP

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Declaration of interests

The authors declare that there is no conflict of interest.

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