

# Ultra-deep Sequencing Reveals Dynamics of Drug Resistance-Associated Variants in Hepatitis C Viruses: Relevance to Treatment Outcome and Resistance Screening

Richard Barnard<sup>1</sup>, Abha Chopra<sup>2</sup>, Ian James<sup>2</sup>, Don Cooper<sup>2</sup>, John Blinco<sup>2</sup>, Mark Watson<sup>2</sup>, Cassandra Jabara<sup>3</sup>, Stanley Lemon<sup>4</sup>, Simon Mallal<sup>2,5</sup>, Silvana Gaudieri<sup>2,6</sup>

<sup>1</sup>Antiviral Research, Merck and Co., West Point, PA, USA, <sup>2</sup>Institute for Immunology and Infectious Diseases, Murdoch University, Western Australia, <sup>3</sup>Department of Biology, & Lineberger Comprehensive Cancer Center, University of North Carolina, USA, <sup>4</sup>Division of Infectious Diseases, Department of Medicine, & Lineberger Comprehensive Cancer Center, University of North Carolina, USA, <sup>5</sup>Center for Translational Immunology and Infectious Diseases, Department of Pathology, Microbiology and Immunology, Vanderbilt University, Nashville Tennessee, USA, <sup>6</sup>School of Anatomy, Physiology and Human Biology, University of Western Australia

## Background:

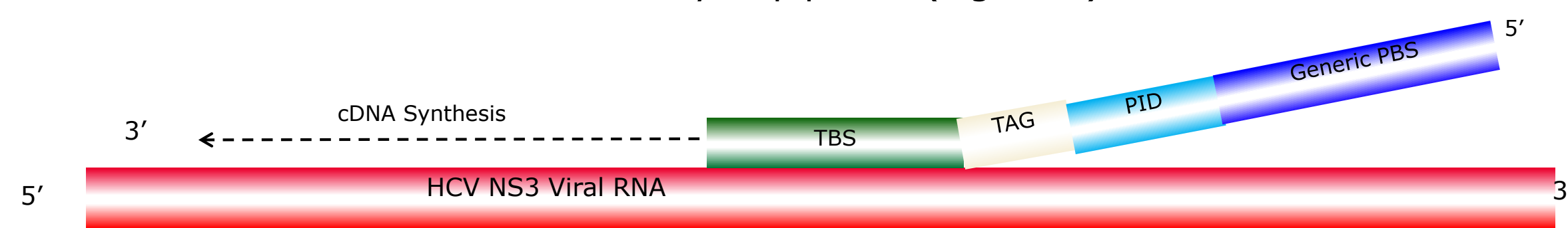
Hepatitis C is a global health issue with approximately 3% of the world's population estimated to be infected with the hepatitis C virus (HCV). Inefficiencies in treatment has led to development of direct-acting antivirals (DAAs) that specifically target HCV proteins involved in the virus's life cycle<sup>1</sup>. One of the major concerns arising from the use of the DAAs is the emergence of resistance-associated variants (RAVs) that affect the efficacy of the drugs. RAVs are generally associated with a fitness cost and the use of ultra-deep pyrosequencing technology has shown that in most treatment naïve subjects low frequency circulating strains carry RAVs<sup>2</sup>. The aim of the study was to investigate i) the clinical relevance of low frequency RAVs; ii) the persistence of RAVs and iii) compensatory mutations in a subset of subjects who had failed boceprevir (SCH 503034; protease inhibitor).

## Subjects

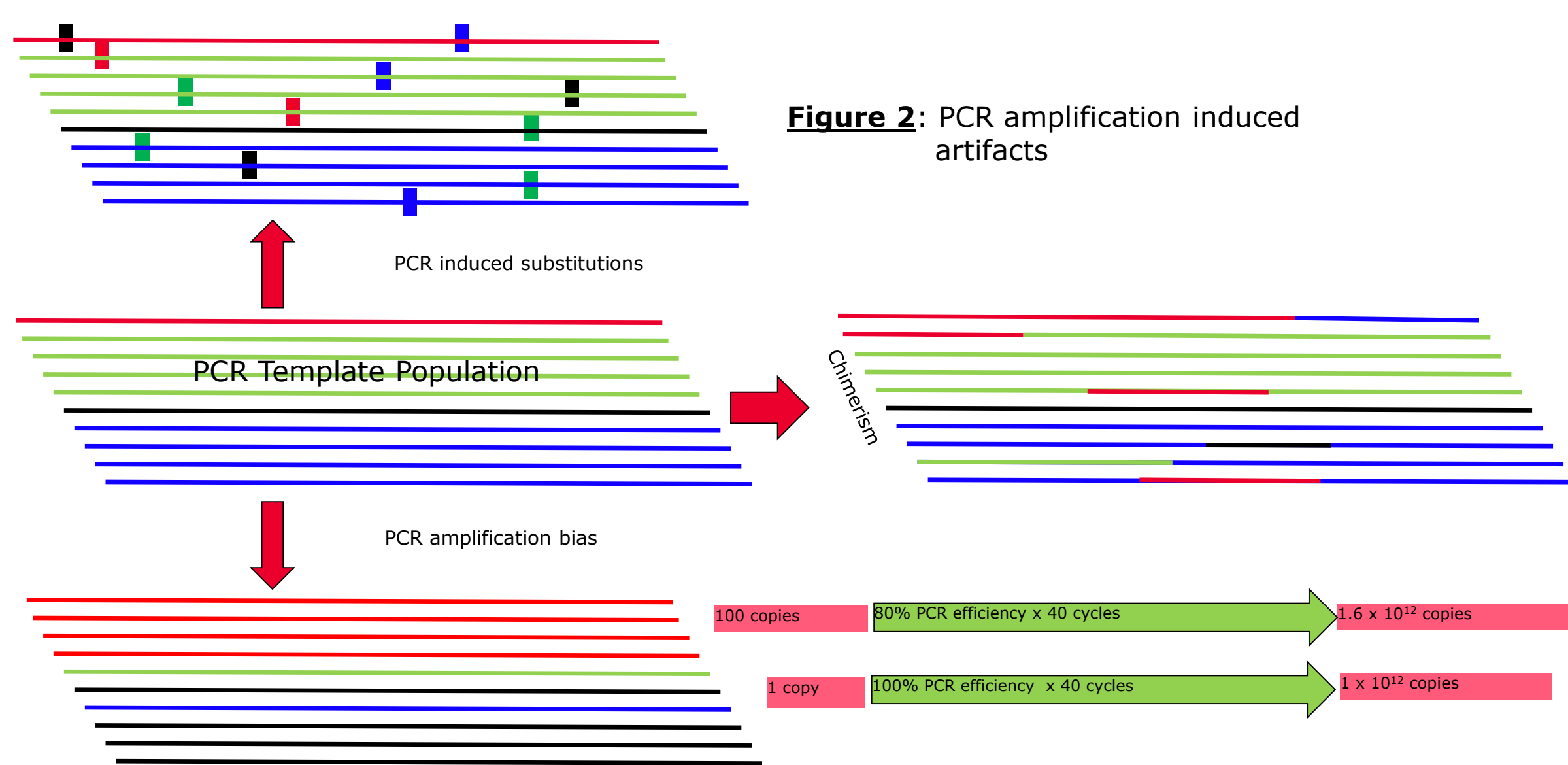
Subjects were enrolled in the long-term follow-up study P-05063 of previous treatment with boceprevir. (ClinicalTrials.gov Identifier: NCT00689390). These subjects all had detectable RAVs at the virologic failure (VF) time-point based on Sanger sequencing. Twelve subjects had three time-points available: at baseline before the commencement of boceprevir treatment; at VF; and follow-up (median 830.5 days from VF).

## Methods

The primer design was based on the Primer ID format as described in Jabara et al. 2011<sup>3</sup>, in which a random eight nucleotide tag ('barcode') is inserted after the target sequence with the 5' addition of a non-specific sequence to allow amplification by PCR (Figure 1). Ideally, each cDNA template should be synthesized with a unique barcode tag, this was facilitated by keeping the starting viral copies (<20,000) much lower than the number of primer ID's (65,536 IDs) allowing an accurate estimation of viral species in the sample pool and the elimination of PCR induced artefacts in the analysis pipeline (Figure 2).



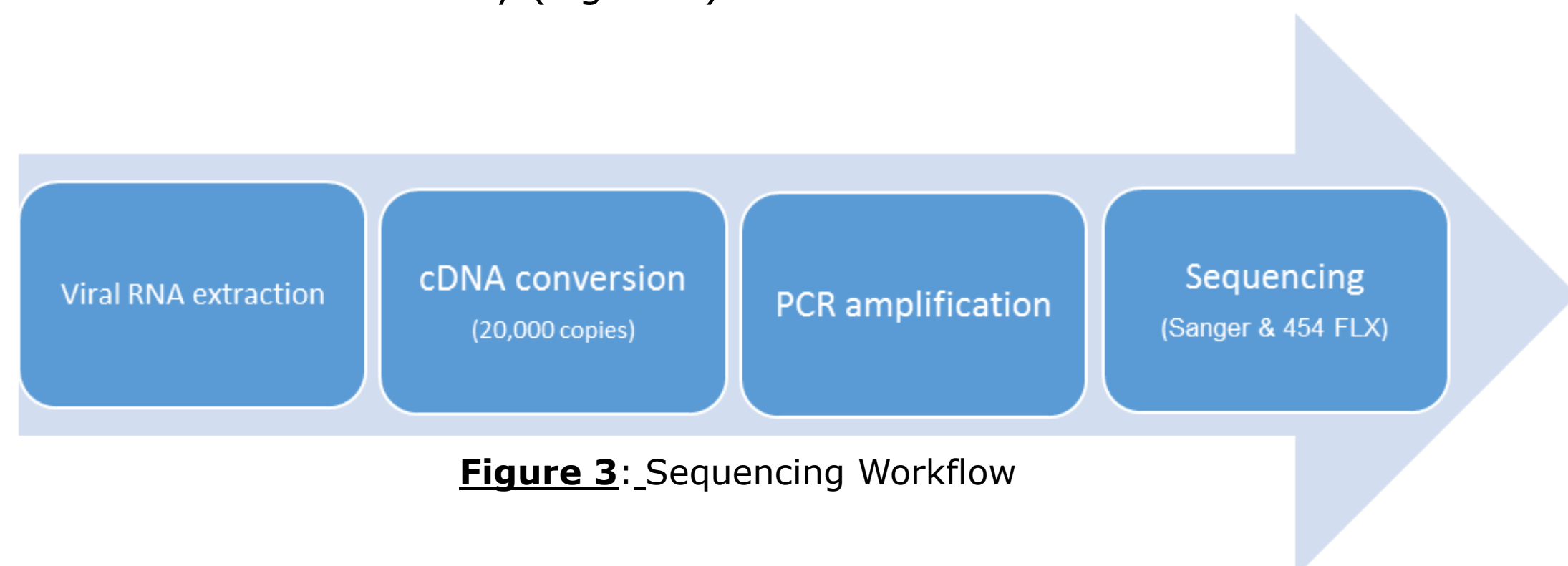
**Figure 1** Reverse transcription with Primer ID. NS3 target binding Site (TBS), TAG 3bp Subject tag, PID=N8 → 65,536 unique primers, Generic PBS 2 x 17 bp primer binding sites



**Figure 2:** PCR amplification induced artifacts

## Workflow

The cDNA template was amplified by nested PCR of the NS3 protease region. Amplicons were sequenced using both Sanger population sequencing and Next generation sequencing on the Roche 454 GS FLX+ Platform with XLR70 Titanium Chemistry (Figure 3).

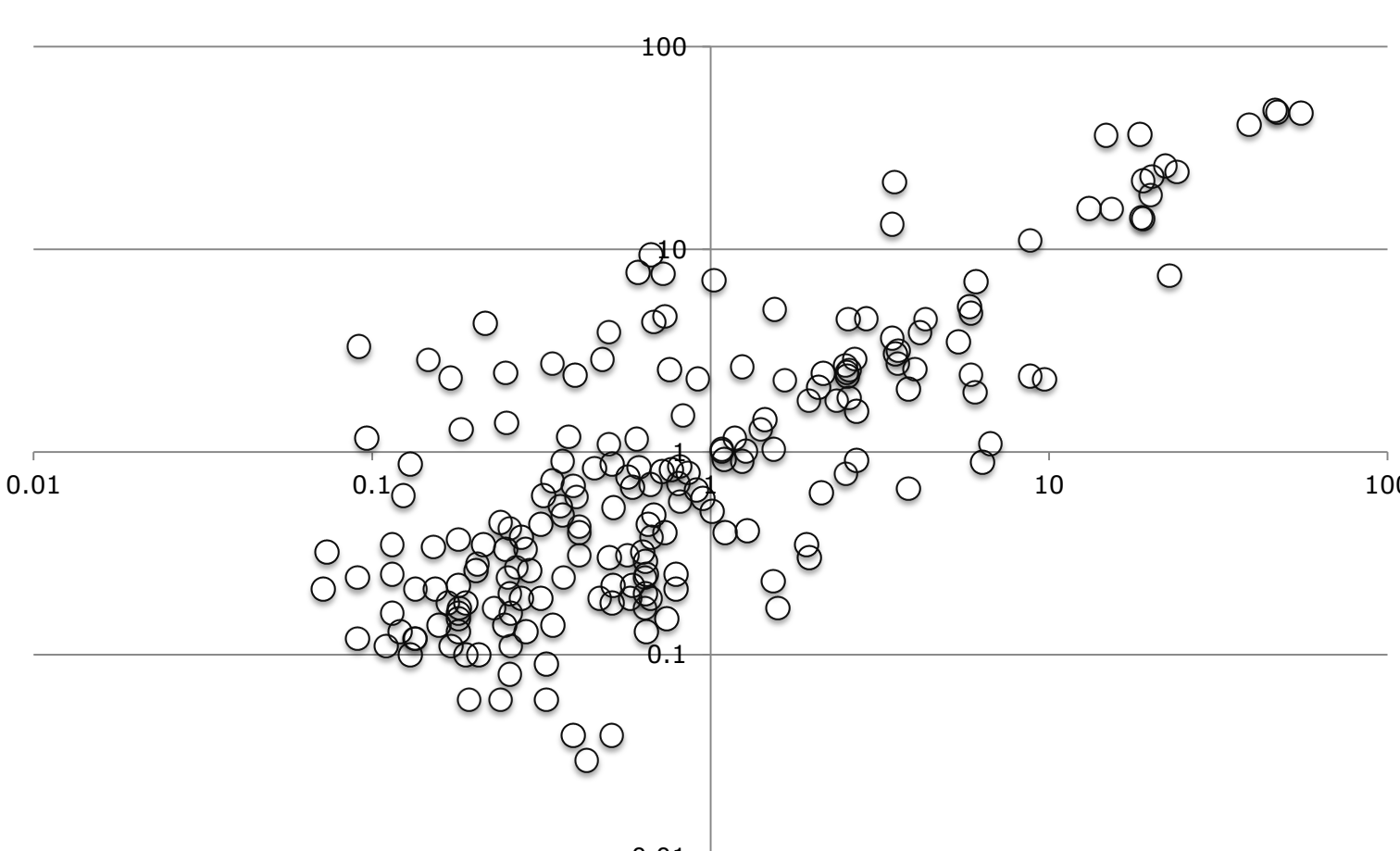


**Figure 3:** Sequencing Workflow

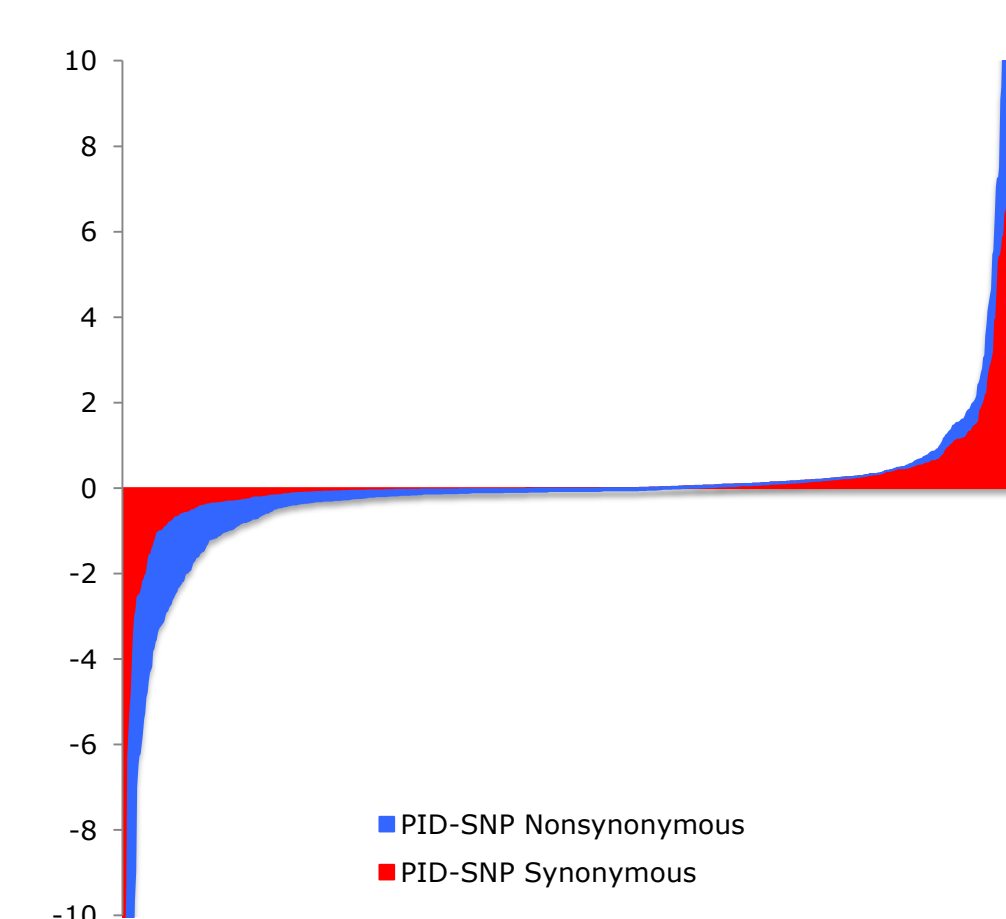
Eleven sites known to be associated with boceprevir drug resistance were screened: V36A/M, R155K/Q/T, Q41R, F43S, T54A/S, V55A, Q80K/R, S138T, A156S/T/V, V158I, D168A/T/V and V170A/T. Each site was studied in order to evaluate the frequency of RAVs within the viral quasispecies.

## Results

- PrimerID removes the effect of primer bias and different PCR efficiencies ( Fig 4 and 5)



**Figure 4:** Correlation between variation observed from PrimerID analysis (X-axis) and normal variant analysis without bar-coding (Y-axis).  $R^2 = 0.8975$



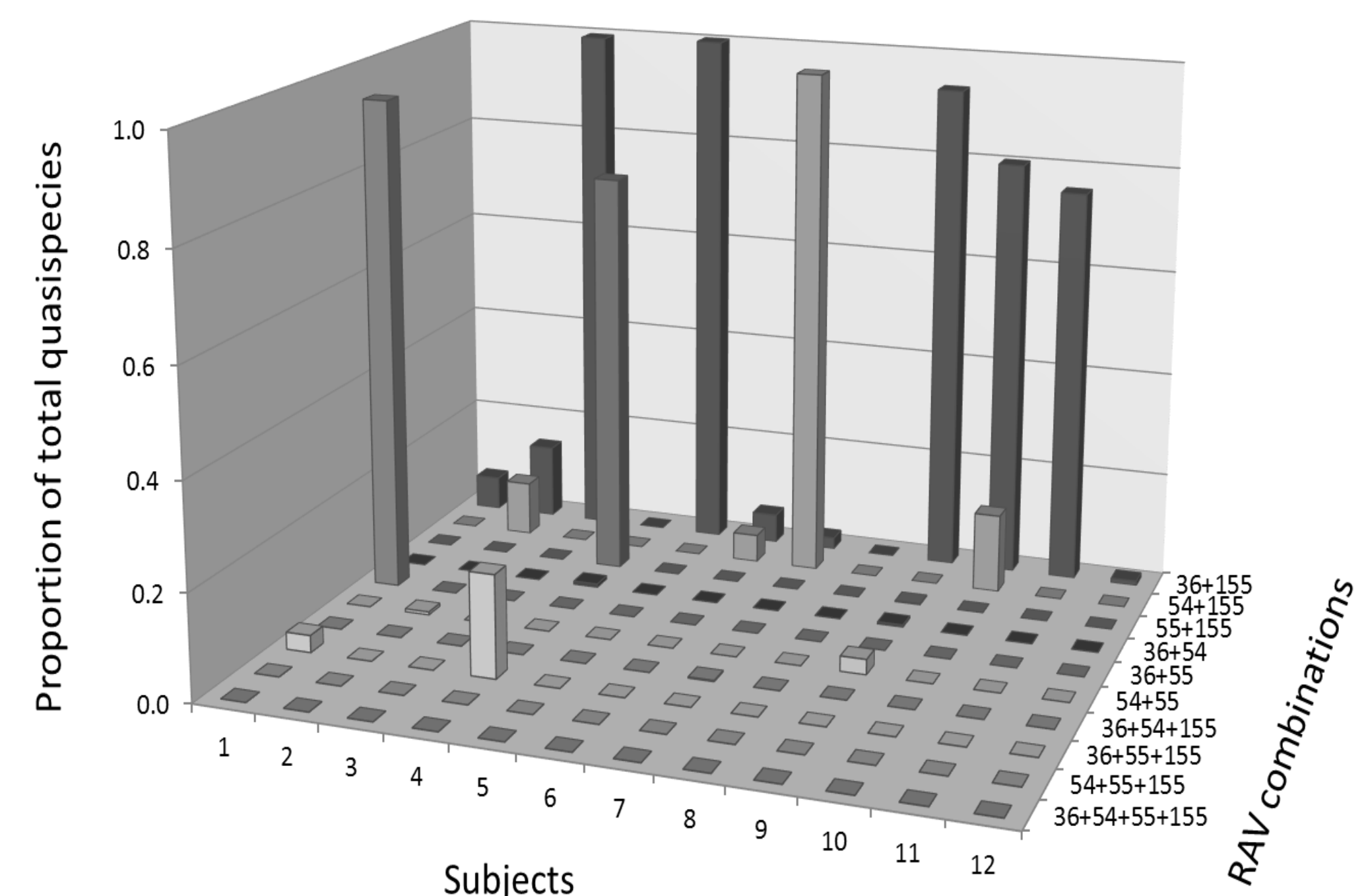
**Figure 5:** Percentage difference between variant detected by bar-coding PrimerID method and without for synonymous and nonsynonymous sites

- 454-Primer ID technology improves the detection of clinically relevant low frequency RAVs compared to sanger sequencing (Table 1).
- Low frequency viral strains harboring RAVs can persist for up to two years post-treatment failure.
- Strains carrying multiple RAVs are common in breakthrough viruses.

Subject #	RAVs detected by population sequencing	RAVs detected by 454-PrimerID sequencing	Baseline		Virologic Failure		Follow-up		Days since Virologic Failure
			Population sequencing	454-PrimerID Sequencing	Population sequencing	454-PrimerID Sequencing	Population sequencing	454-PrimerID Sequencing	
1	V36L	V36L	251	93.6	33	93.9	253	98.4	894
	V55A	V55A	253	93.3	34	91.2	289	77.3	
	R155K	R155K	253	0.0	34	8.8	289	21.2	
	V158I	V158I	253	0.0	34	94.1	272	0.0	
	V36M	V36M	493	0.0	359	42.9	743	0.0	
2	V36M	V36M	493	0.0	359	1.1	743	0.0	982
	V36L	V36L	493	0.0	359	11.7	743	0.0	
	V36A	V36A	493	0.0	388	2.6	746	0.0	
	T64A	T64A	493	0.0	388	10.6	746	0.0	
	T64S	T64S	493	0.0	388	1.5	746	0.0	
3	V55A	V55A	494	0.0	391	53.5	746	0.0	674
	R155K	R155K	494	0.0	391	0.0	746	0.0	
	V36M	V36M	695	0.0	763	100	1038	0.1	
	V55A	V55A	695	0.0	772	99.5	1038	0.0	
	R155K	R155K	705	0.0	772	99.5	1038	0.0	
4	V36L	V36L	526	0.0	471	0.2	809	0.0	528
	V36M	V36M	526	0.0	471	19.7	809	0.0	
	V55A	V55A	526	97.9	484	98.6	809	99.9	
	V55P	V55P	526	1.9	484	0.0	809	0.0	
	R155K	R155K	526	0.0	484	97.1	809	79.9	
5	D168N	D168N	526	0.0	484	0.2	809	79.9	890
	V36M	V36M	526	0.0	40	100	392	0.3	
	T54I	T54I	526	0.0	61	98.0	392	0.3	
	R155K	R155K	526	0.0	61	2.0	392	0.0	
	R155T	R155T	526	0.0	61	2.0	392	0.0	
6	D168N	D168N	526	0.0	52	1.9	392	0.0	555
	V36M	V36M	1392	0.0	377	5.8	556	1.1	
	T64S	T64S	1392	0.0	389	5.4	556	0.0	
	V55A	V55A	1367	0.1	390	0.5	556	0.0	
	R155K	R155K	1392	0.0	399	14.7	556	0.0	
7	R155M	R155M	1398	0.0	389	0.3	556	0.0	895
	R155T	R155T	1398	0.0	389	81.0	556	0.2	
	D168N	D168N	1397	0.0	389	81.2	556	0.2	
	V36L	V36L	533	0.0	1092	0.1	399	0.0	
	V36M	V36M	533	0.0	1092	2.5	399	0.0	
8	T64S	T64S	647	1.1	1101	97.6	305	99.7	847
	R155K	R155K	650	1.3	1105	100	309	99.4	
	V36M	V36M	204	0.0	394	2.5	398	0.0	
	R155K	R155K	213	0.0	395	100	398	0.0	
	V158I	V158I	213	0.0	395	97.5	398	0.0	
9	V36M	V36M	676	0.0	492	93.9	223	0.0	901
	V36L	V36L	676	0.0	492	0.2	223	0.0	
	T64A	T64A	676	0.0	493	0.4	231	0.0	
	T64S	T64S	676	0.0	493	3.0	231	0.0	
	V55A	V55A	680	0.1	492	0.2	231	0.0	
10	R155K	R155K	883	0.0	493	99.2	232	0.0	688
	R155K	R155K	883	0.0	493	0.2	232	0.0	
	R155T	R155T	883	0.0	493	0.2	232	0.0	
	V36M	V36M	564	0.2	284	81.4	249	0.0	
	T54A	T54A	564	0.0	271	14.8	251	0.0	
11	R155I	R155I	586	0.0	274	0.4	252	0.0	651
	R155K	R155K	586	0.3	274	96.0	252	0.0	
	A156V	A156V	586	0.0	274	0.4	252	0.0	
	V36M	V36M	359	0.0	269	76.1	78	1.3	
	R155K	R155K	374	0.0	397	99.2	78	1.3	
12	V36M	V36M	193	0.0	463	1.1	297	0.0	814
	T54A	T54A	193	0.0	492	0.8	297	0.0	
	R155K	R155K	196	2.6	495	81.0	417	4.3	

**Table 1** Comparison of RAV frequencies in longitudinal samples by population (Sanger) sequencing and 454-PrimerID.

- Evidence for mutation networks within NS3 protease and putative compensatory mutations ( Fig 6)



**Figure 6:** Multiple RAV combinations on single strains at VF.

## Discussion

Despite the emergence of new promising drugs that specifically target HCV, the development of novel effective antiviral therapies for hepatitis C is still facing the challenging issue of the rapid selection of viral variants bearing drug resistance mutations. This study used 454-PrimerID to mitigate RT-PCR errors and issues surrounding re-sampling of template molecules in the PCR process and yielded data to accurately quantify the number of unique viral sequences being studied in subjects that have failed treatment with one of the DAAs, boceprevir. Specifically, the study shows the clinical relevance of RAVs below the detection threshold of Sanger sequencing in clinical outcome. This data supports the previous observation that HCV strains with RAVs at lower than the level detectable by sanger-based sequencing can reduce drug sensitivity<sup>4</sup>. Given the success of this technique in studying viral quasi-species before, during and after VF in these subjects, 454-PrimerID sequencing should become the standard approach by which to perform temporal 454-sequence studies.

## Conclusions

- Ultra-deep sequencing identifies clinically relevant low frequency RAVs in circulating quasispecies at levels not detectable using Sanger sequencing
- PCR amplification induced artefacts are eliminated using the primer ID methodology and analysis pipeline
- Specifically, the study shows the clinical relevance of RAVs below the detection threshold of Sanger sequencing in clinical outcome.
- This data supports the previous observation that HCV strains with RAVs at lower than the level detectable by sanger-based sequencing can reduce drug sensitivity.
- In the majority of subjects, RAVs were detected at high levels at VF but this did not predict which RAVs would be present after 1-2 years of follow-up
- The low prevalence of naturally occurring drug-resistance mutants suggests that resistant variants are not as fit as wild type viruses. However, some strains that harbor RAVs can overcome that replication deficiency most likely via the support of compensatory mutations.

## References

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