



RESEARCH PAPER

## Viroid quasispecies revealed by deep sequencing

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### ABSTRACT

Viroids are non-coding single-stranded circular RNA molecules that replicate autonomously in infected host plants causing mild to lethal symptoms. Their genomes contain about 250–400 nucleotides, depending on viroid species. Members of the family *Pospiviroidae*, like the *Potato spindle tuber viroid* (PSTVd), replicate via an asymmetric rolling-circle mechanism using the host DNA-dependent RNA-Polymerase II in the nucleus, while members of *Avsunviroidae* are replicated in a symmetric rolling-circle mechanism probably by the nuclear-encoded polymerase in chloroplasts. Viroids induce the production of viroid-specific small RNAs (vsRNA) that can direct (post-)transcriptional gene silencing against host transcripts or genomic sequences. Here, we used deep-sequencing to analyze vsRNAs from plants infected with different PSTVd variants to elucidate the PSTVd quasispecies evolved during infection. We recovered several novel as well as previously known PSTVd variants that were obviously competent in replication and identified common strand-specific mutations. The calculated mean error rate per nucleotide position was less than  $5 \times 10^{-3}$ , quite comparable to the value of  $2.5 \times 10^{-3}$  reported for a member of *Avsunviroidae*. The resulting error threshold allows the synthesis of longer-than-unit-length replication intermediates as required by the asymmetric rolling-circle mechanism of members of *Pospiviroidae*.

**Abbreviations:** NEP, nuclear-encoded polymerase; PolII, DNA-dependent RNA polymerase II; PLMVd, *Peach latent mosaic viroid*; PSTVd, *Potato spindle tuber viroid*; vsRNA, viroid-specific small RNA; C, P, TL, TR, V, central, pathogenicity-related, terminal left, terminal right, variable domain

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## Introduction

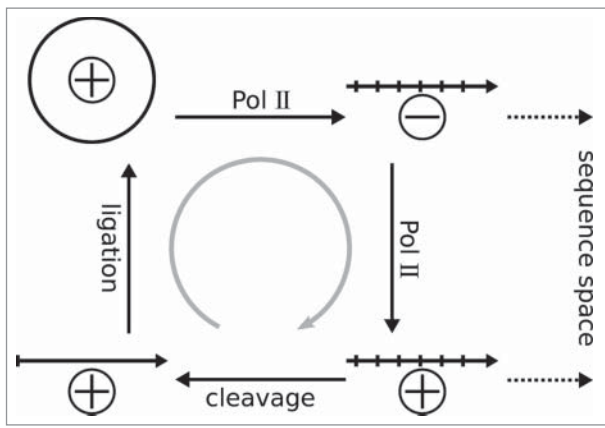
Viroids are single-stranded circular RNA molecules that replicate autonomously in infected host plants. As non-coding RNAs, viroids do not code for any protein but possess the biologic activity and function of a minimal parasite inducing specific diseases in their hosts.<sup>1–3</sup> The severity of viroid-induced symptoms depends on the viroid variant as well as on the host and cultivar susceptibility. Members of the family *Pospiviroidae*, including the type species *Potato spindle tuber viroid* (PSTVd), are transcribed in host cell nuclei in an asymmetric rolling-circle mechanism (Fig. 1) by the host DNA-dependent RNA polymerase II (Pol II); members of the family *Avsunviroidae* are replicated by a nuclear-encoded polymerase (NEP) in chloroplasts.<sup>4</sup> Viroids induce these polymerases to accept RNA instead of DNA as template with a resulting increase in error rates. Indeed, for *Chrysanthemum chlorotic mottle viroid*, a member of *Avsunviroidae*, an error rate of  $2.5 \times 10^{-3}$  has been demonstrated.<sup>5</sup> Consequently, the infecting viroid molecule—the master sequence—gives rise to a sequence ensemble of master and error copies termed a ‘mutant swarm’ or quasispecies.<sup>6–8</sup>

Viroids rely on both thermodynamically stable and metastable secondary structures to recruit host factors for replication, processing, ligation, and systemic trafficking.<sup>9</sup> These structures

mimic host binding motifs and drive selection during replication and quasispecies formation (Fig. 1). Indeed, viroid infections may spontaneously, or in new hosts adaptively, generate new viable and competitive sequences.<sup>10–13</sup> Thus, viroids as minimal biologic entities with high replication and error rates provide a unique opportunity to study such quasispecies.

Viroid infections also induce the production of viroid-specific small RNAs (vsRNA) that appear to be involved in pathogenesis:<sup>14,15</sup> sequence complementarity with host transcripts results in (post-)transcriptional gene silencing and creation of a host environment favoring viroid replication. Thus far, 3 vsRNA-based pathogenic determinants have been described; the first involves a variant of *Peach latent mosaic viroid* (PLMVd),<sup>16</sup> the second *Tomato planta macho viroid*,<sup>17</sup> and a third PSTVd.<sup>18</sup>

In this context, 3 deep-sequencing small RNA data sets isolated from tomato (*Solanum lycopersicum*) infected with PSTVd variants are currently available. The first is from cultivar ‘Heinz 1706’ infected by PSTVd variants QFA, C3, or AS1 that induce mild, severe, and ‘lethal’ symptoms, respectively.<sup>13</sup> The second is from cultivar ‘Rutgers’ infected by PSTVd variants M or I that induce mild and intermediate symptoms, respectively.<sup>19</sup> The third is from 4 tomato cultivars infected with PSTVd variant RG1. RG1 induces intermediate to severe



**Figure 1.** The asymmetric rolling-circle replication of members of the *Pospiviroidae* exploits the host's Pol II. The circular monomeric PSTVd genome, arbitrarily designated as (+)-strand, is transcribed into an oligomeric linear (–)-strand; the latter is template for synthesis of an oligomeric linear (+)-strand. The oligomeric (+)-strand is cleaved into monomers that are ligated to form the mature circular form. Pol II transcription introduces mutations and generates the quasispecies to explore the sequence space; the gray arrow indicate selection acting against non-viable mutations.

symptoms in cultivars ‘Heinz 1706’ and ‘Rutgers’ but only mild symptoms in ‘Moneymaker’ and ‘UC82B’.

It is well known that the full sequence of the infecting viroid variant (or larger viruses) can be assembled from such small RNA data sets either using the viroid sequence as reference<sup>20</sup> or even without a reference.<sup>21,22</sup> In this study, we have gone a step further; that is, we have used small RNA data to compare the mutational landscapes of different infecting viroid variants. These landscapes reflect a combination of replication efficiency, selection, and sequencing errors. We evaluated the viroids’ sequence space from the deep-sequencing data following methods established for RNA viruses<sup>23–27</sup> and applied the quasispecies theorem<sup>6,28</sup> and associated concepts to viroids to estimate a lower bound for the replication fidelity of their genomes.

## Results

### vsRNA expression

We identified vsRNAs by mapping small RNA reads from deep-sequencing data sets  $D_s$ ,  $D_o$  and  $D_p$  to the respective infecting PSTVd variant with different accuracies (Fig. 2A). In the range from 100 to 90% accuracy, only a very small number of small RNAs from mock-inoculated deep-sequenced samples mapped to the PSTVd variants (Fig. S2). Thus, we continued with vsRNAs mapped with 90% accuracy for the remaining results. That is, we tolerated up to 2 mismatches between a standard read with length < 25 nt and a viroid sequence to ensure sufficient specificity while allowing some variability.

The numbers of vsRNAs from intermediate and severe PSTVd variants were similar and higher than those from mild variants (see Table S2). In data sets  $D_p$  and  $D_o$ , (–)-stranded vsRNAs were less abundant than (+)-stranded vsRNAs. In  $D_s$ , vsRNA levels gradually increased from QFA to C3 to AS1. Notably, the lower pathogenicity-related domain ( $P_{lower}^+$ ; see Fig. S1A) of PSTVd variants AS1 and C3 exhibited vsRNA expression peaks not seen for QFA (Fig. 2A).

In all but one case, the numbers of mapped vsRNAs increased by about 10% (Table S2) as the mapping accuracy was decreased from 100 to 90% (Fig. 2A). The clear exception was the vsRNA profile of variant QFA: here the additional mappings at 90% accuracy revealed sequence variations in the upper central to variable domain ( $(C-V)_{upper}$ ) and—to a minor extent—in the lower P to terminal-left domain ( $(P-TL)_{lower}$ ). These mutations show up more clearly in a plot of differences between nucleotides in vsRNAs and the infecting PSTVd sequence (Fig. 2B). In QFA, mutations at positions 120–125 and 303–316 are up to 10 times more abundant than the original QFA nucleotides and present in both (+)- and (–)-stranded vsRNAs. Other mutations appeared to be present only in vsRNAs derived from the respective (+)-strands; e.g., changes near position 200 visible in all panels.

With this surprising result in mind, we mapped each deep-sequencing data set to all PSTVd variants available in the subviral database.<sup>29</sup> Indeed, the reads from the QFA-infected sample were more consistent with the sequence of variant KF5M5 (AC M93685) than with QFA (see panels marked “QFA → KF5M5” in Fig. 2). Results for C3 and the other variants were not as clear-cut, but this discrepancy between the infecting sequence and that of the resulting progeny assembled from the vsRNA reads in the case of variant QFA prompted us to analyze these deviations in all data sets in detail.

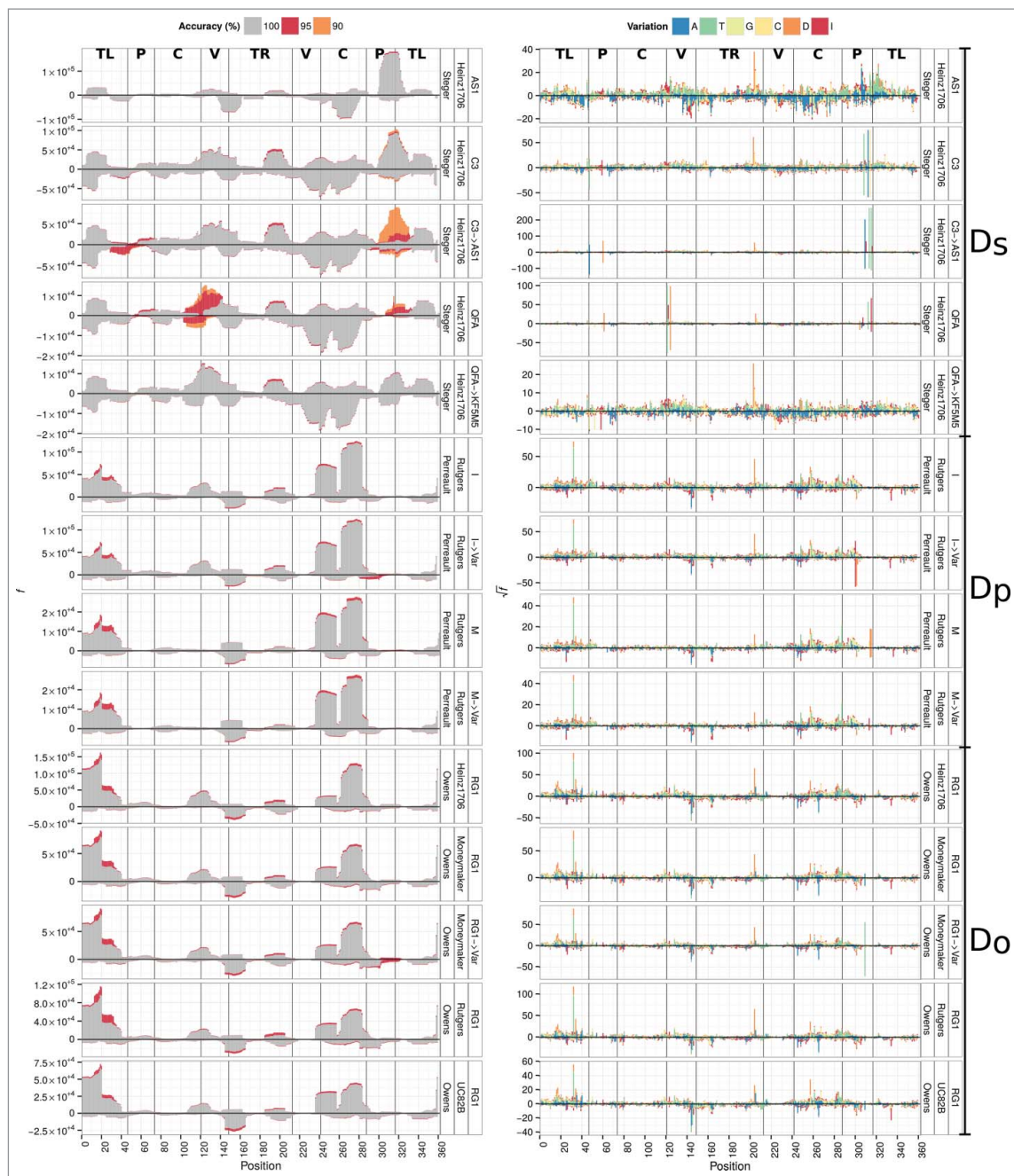
To elucidate the distribution of mismatched nucleotides in vsRNAs, we plotted the locations of these mismatches along the respective PSTVd sequence in Fig. 2B and the log ratio of these mismatches to the corresponding reference nucleotide in Fig. S3. In the latter figure, the few positive values—especially in the QFA mapping—clearly show that a PSTVd variant(s) different in sequence from the originally infecting PSTVd variant was present in excess among the progeny. The same mismatch positions dominate in Fig. 2B where a clear example is again seen at positions 61, 121, and 315 of QFA, or, less obviously, at positions 308–314 of C3.

These mutations with their relative high frequencies emerge from a background of sequence errors, visible in both polarities in all data sets independent of the infecting PSTVd variant, inoculation method, or tomato cultivars. This background makes it difficult to distinguish replication-competent variants containing complementary changes in both strands from the infecting reference sequence. To extract relevant mutations and to detect co-appearing mutations, we developed the method NETMAP.

### Identification of replication-competent PSTVd variants using graph theory

NETMAP extracts viable and connected sequence positions from vsRNA data. We define mutations as viable if they are present in reads of both polarities and thus are likely to originate from replicating viroids. Mutations are connected and originate from the same genome if they are present on a single read. For further program details see Material & Methods. This network analysis revealed the presence of several potentially viable sequence variants that co-existed with the inoculated PSTVd variant.

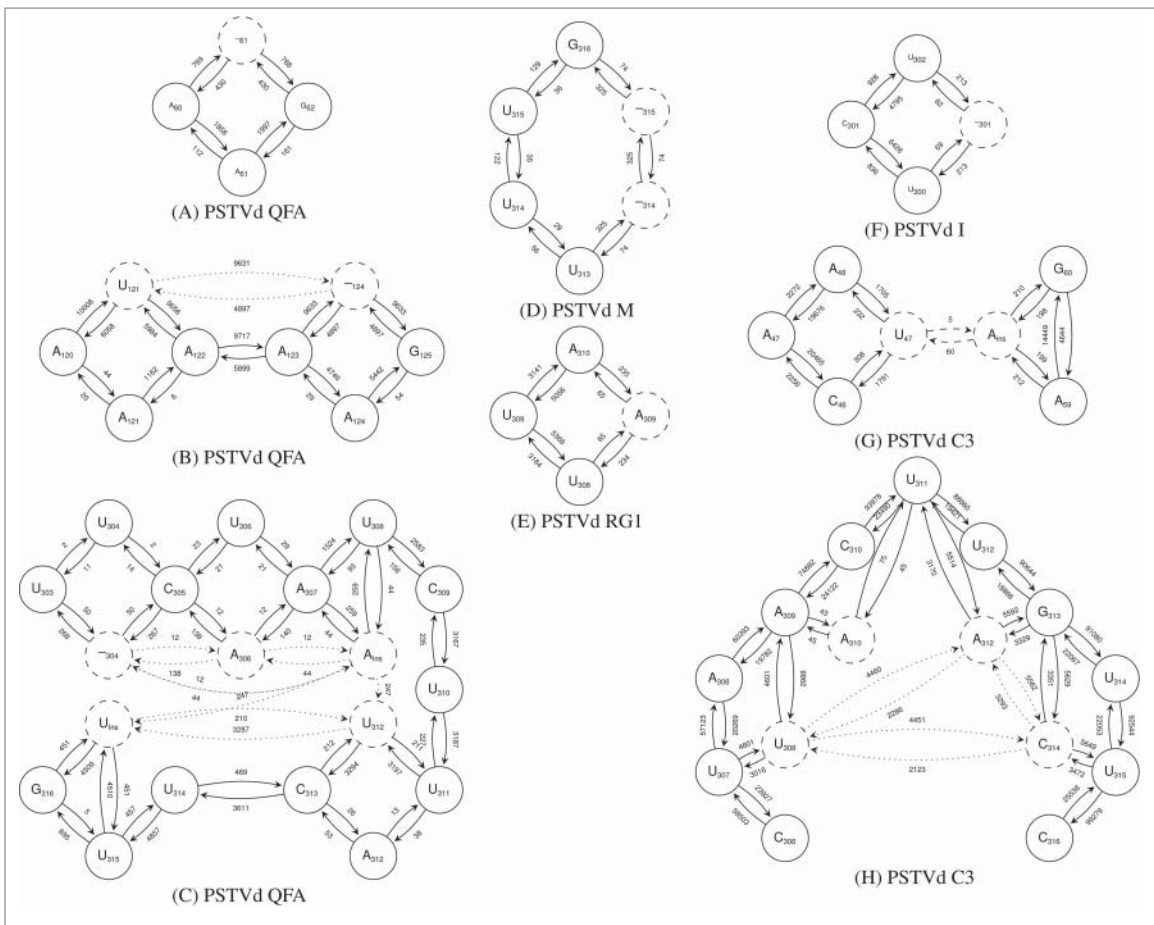
From the reads mapping to PSTVd variant QFA in  $D_s$ , NETMAP identified 3 significantly expressed mutations. Fig. 3A illustrates the deletion of an A in the oligo-A sequence upstream of  $G_{62}$ ;



**Figure 2.** Mapping of small RNA reads to PSTVd variants. (A) Frequency of reads mapping to PSTVd positions with different accuracies (see color code at top). Note the differently scaled y-axes. (B) Sequence variation (see color code at top) at 90% mapping accuracy; stacked bars represent the square root of ratio of a specific variation in relation to all variations (including the reference nucleotide) at one site. All insertions are collapsed into one count regardless of base and length. Viroid domains (see Fig. S1A) are marked close to the top. Deletions (D), insertions (I), and mutations to A, U, G, or C are marked by different colors (see legend at top).

this deletion was present in about 29% of (+)-stranded reads covering this position and in about 76% of (–)-stranded reads. Fig. 3B illustrates 2 connected mutations, an  $A_{121} \rightarrow U$  transversion and an A deletion upstream of  $G_{125}$ ; both mutations dominated the reference sequence in strands of both polarities. Fig. 3C illustrates 5 connected mutations including 2 insertions. These mutations also dominated the reference sequence but at least part of this region (i.e., positions 303–307) was only covered by low read numbers. If all these mutations from regions  $P_{upper}$ ,  $V_{upper}$ , and  $P_{lower}$  were present in the same molecule, the inoculated PSTVd variant QFA would have evolved to variant KF5M5 (AC M93685.1).

For variant C3, NETMAP identified 6 variable sites:  $A_{47} \rightarrow U$  and  $A_{59} \rightarrow AA$  in region  $P_{upper}$  (Fig. 3G), and  $A_{308} \rightarrow U$ ,  $C_{310} \rightarrow A$ ,  $U_{312} \rightarrow A$ , and  $U_{314} \rightarrow C$  in  $P_{lower}$  (Fig. 3H). Mutation  $C_{310} \rightarrow A$  was only weakly supported (below 0.2% reads in both polarities) and was not connected with the neighboring mutations. The other 5 mutations were each supported by 1–15% of reads. If all 5 mutations were present in the same molecule, the sequence of the resulting progeny would be identical to that of variant AS1. Note, however, that C3 was still the dominant sequence at the time of sampling. For plants inoculated with variant AS1, NETMAP detected no sequence variations.



**Figure 3.** Sequence networks extracted by NETMAP from reads mapping with 90% accuracy to the respective infecting PSTVd variant. Nucleotides in solid circles show sequence positions that are identical to the reference sequence; those in dashed circles show mutations. Insertions and deletions are indicated by (N<sub>ins</sub>) and (-<sub>position</sub>), respectively. Solid arrows connect nucleotides; dotted arrows link mutations that are located on the same read. An arrow pointing from position  $x$  to position  $y$  indicates (+)- and (-)-polarity if  $x > y$  and  $x < y$ , respectively. Read numbers (edge weights) label the arrows. Positions of mutations in the secondary structure of PSTVd are shown in Fig. S1D.

In D<sub>p</sub>, network analysis revealed sequence variation in both PSTVd variants M and I. For variant M we identified 2 linked and dominant mutations (deletions of U<sub>314</sub> and U<sub>315</sub> in about 70% of reads; Fig. 3D). For variant I we identified a minor mutation (deletion of C<sub>301</sub> in < 7% of the reads; Fig. 3F). Sequence comparisons revealed no known variants associated with these changes.

For D<sub>o</sub>, NETMAP detected only a single mutation (i.e., U<sub>309</sub> → A) in about 2% of (+)- and 4% of (-)-stranded reads from ‘Moneymaker’ plants (see Fig. 3E). This change is present in several other PSTVd variants (e.g., KF440-2 (X58388.1), X52039.1, X52040.1), but only in combination with additional mutations. No sequence variation of the infecting PSTVd variant RG1 was detected in the other tomato cultivars.

### Polarity-specific mutations

Besides the potentially replication-competent mutations detected by NETMAP, several other mutations were identified in reads of only one polarity. All data sets contained a deletion at consensus position 202 in the (+)-strand with mean expression ratios  $v_i^{\text{deletion}} / v_i^{\text{reference}}$  ( $i = 204$  for variants AS1, I, M, and RG1,  $i = 203$  for C3, and  $i = 205$  for QFA) of 0.10, 0.09, and 0.27 in D<sub>s</sub>, D<sub>p</sub>, and D<sub>o</sub>, respectively. This deletion could

disrupt a binding motif for viroid binding protein 1 (VirP1; Fig. S1A and C), thereby resulting in loss of infectivity.<sup>30,31</sup> The D<sub>o</sub> and D<sub>p</sub> data sets also contained a significant level of variation at position 32 in TL<sub>upper</sub><sup>+</sup>. However, because this reflects mainly a A<sub>32</sub> → U change at the end of reads, this variation could be a result of imperfect trimming.

We also identified a deletion at consensus position 256 that is located in the loop E motif (see Fig. S1A) in all data sets except D<sub>o</sub>. Loop E is involved, among other processes, in processing of (+) replication intermediates to circles [for review see ref 9] Such a deletion would destroy the tertiary structure of this loop,<sup>32</sup> which is consistent with its presence only in (+) strands. It should be noted, however, that any change not supported by the corresponding mutation in the opposite strand has a higher chance of originating from either sequencing or mapping errors.

### Error rate, error copies, and error threshold

Using the ratio of sites containing a variant nucleotide to those with the reference nucleotide, we estimated the probability  $q$  for error-free reproduction of a single nucleotide in the master copy of a viroid genome during replication (see equation (1)). As master copy we used the sequence of the originally infecting

**Table 1.** Parameters of vsRNAs mapping to their respective PSTVd genomes in both polarities.

data set	Cultivar <sup>a</sup>	PSTVd <sup>b</sup>	$P_{\text{error}} / 10^{-3c}$		$P_{\text{error-free}}^d$	
			(+)	(-)	(+)	(-)
$D_s$	Heinz1706	AS1	5.6	4.0	0.13	0.24
		C3	4.4	4.4	0.21	0.21
		C3 → AS1	99	71	0.00	0.00
		QFA	196	1170	0.00	0.00
		QFA → KF5M5	4.3	3.5	0.21	0.28
$D_p$	Rutgers	I	7.7	5.8	0.06	0.12
		I → Var	9.9	9.1	0.06	0.12
		M	24	17	0.00	0.00
		M → Var	10.1	6.5	0.03	0.10
$D_o$	Heinz1706	RG1	8.6	10.5	0.05	0.02
	Rutgers		9.9	10.9	0.03	0.02
	UC82B		6.3	6.6	0.10	0.09
	MoneyMaker		8.0	8.6	0.06	0.05
	MoneyMaker		133	65	0.00	0.00

<sup>a</sup>Tomato cultivar used for infection.

<sup>b</sup>vsRNAs were determined by mapping the small reads to the sequence *S* of the respective inoculated PSTVd variant using SEGEMEHL with 90% accuracy; if mutations point to presence of an additional PSTVd variant, the mapping was repeated with this other variant.

<sup>c</sup> $P_{\text{error}} = (\sum_{i=1}^{|S|} v_i^{\text{var}} / v_i^{\text{ref}}) / |S|$ ; mean error rate per nucleotide position.

<sup>d</sup> $P_{\text{error-free}} = (1 - P_{\text{error}})^{|S|} = q^{|S|}$ ; probability for exact reproduction of the respective viroid sequence.

PSTVd variants as well as any suspected new variants that evolved during infection (see Table 1).

The value of the mean error rate per nucleotide  $P_{\text{error}} = 1 - q$  was  $(7.0 \pm 2.4) \times 10^{-3}$  averaged over variants AS1, C3, QFA → KF5M5, I, M → Var, and RG1. In contrast, the calculated error rate for variant QFA was much higher, consistent with the observed accumulation of mutations and its replacement as master copy by variant KF5M5. Similarly, the calculated error rate for variant M would not allow the error-free replication of the originally infecting variant, and this sequence also tended to be overgrown by a variant.

How are these calculated error rates for viroid replication and selection affected by sequencing errors? To estimate the effect of sequencing errors, we determined the apparent error rates for 2 tomato microRNAs (see Table S3). Like viroids, microRNAs are transcribed by Pol II, but from a DNA rather than an RNA template. The calculated error rates for these microRNAs were close to  $6 \times 10^{-4}$  and quite similar for the different data sets. Error rates for Pol II transcription of mRNAs are known to be in the range of  $1 \times 10^{-5} - 1 \times 10^{-6}$ ;<sup>33,34</sup> consequently, our higher-than-expected error rate for microRNA synthesis is due to sequencing error. Note, however, that this rate of sequencing error is lower than the error rate of viroid replication and selection  $((7 \pm 2) \times 10^{-3})$  by about a factor of 10. Our data sets also contained sequences derived from several other small non-coding RNAs (e.g., 5.8S RNA, 7SL RNA, and tRNA), but their synthesis involves polymerases other than RNA Pol II. Furthermore, the number of reads recovered from such RNAs were  $\geq 10$ -fold fewer than those derived from the 2 microRNAs (data not shown).

Finally, from the estimated error rates of viroid replication we calculated the probability of error-free unit-length copies  $P_{\text{error-free}} = (1 - P_{\text{error}})^{|S|} = q^{|S|}$ .<sup>6</sup> As shown in Table 1, 20% or less of the PSTVd population per replication cycle corresponds to the original variant genome. We also calculated the error threshold based on the determined error rates to estimate the longest possible error-free viroid genome (Fig. 4). Error rates for the original variants M and QFA were clearly too high to

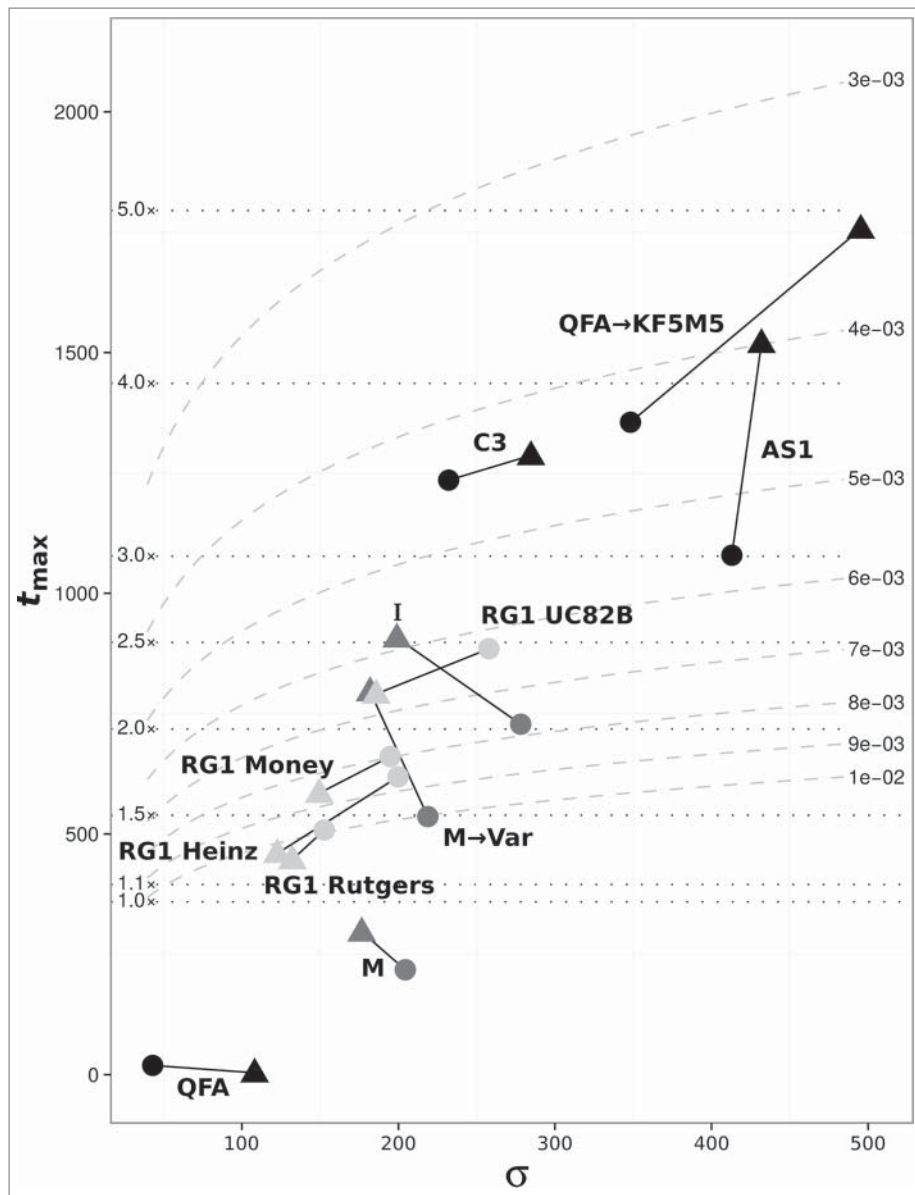
support the size of their genome leading to an error catastrophe.<sup>6</sup> In contrast, the error thresholds for the evolved variants M → Var and QFA → KF5M5 were much higher, thereby allowing these sequences to co-exist with or even outcompete the respective original variants.

## Discussion

We examined 3 sets of small RNA deep-sequencing data derived from PSTVd-infected tomato plants for evidence of viroid sequence evolution/drift. As expected, we were able to reconstruct the sequences of the PSTVd variants used to initiate infection after mapping the reads with SEGEMEHL at 100% accuracy. Reducing the mapping accuracy to 90% revealed the presence of additional reads that allowed us to detect variants of the inoculated PSTVd sequences.

In the data set from plants inoculated with QFA, we detected all 8 mutations by which QFA differs from the known mild variant KF5M5. The use of cloned cDNA as inoculum and a new, viroid-free climate box to maintain the plants after inoculation (see Materials & Methods) allows us to exclude one possible explanation for such a result; i.e., contamination of the QFA inoculum by KF5M5. From the small read data alone we cannot be sure that all the mutations detected were present in the same PSTVd genome. It is highly likely, however, that at least a significant proportion of the progeny did so because only 3 of 266 unique PSTVd variants (see Fig. S4) recovered from GenBank contain all the changes between positions 302 and 312 shown in Figs. 3C and S1D. Each of these variants (i.e., KF5M5 plus the closely related KF5M3 and KF5M4) also contain all the changes detected in the upper portions of the pathogenicity and variable domains. Thus, our analysis captured the *in planta* evolution of a new PSTVd quasispecies.

This uncertainty could be overcome by the analysis of quite large RNA-Seq libraries of circular PSTVd variants; to our knowledge, however, such an analysis has only been performed for PLMVd.<sup>35</sup> The uneven distribution of short reads along the PSTVd genome (“hotspots”) should not create major problems



**Figure 4.** Dependence of the calculated error thresholds ( $t_{\max}$ ; see equation (3)) on selective advantage ( $\sigma$ ; see equation (2)) of the master copy for individual PSTVd variants based on the  $P_{\text{error}}$  values calculated from analysis of the respective vsRNA populations (see Table 1). Solid lines connect thresholds for (+)– (circles) and (–)–strands (triangles) of the same sample. Dotted horizontal lines indicate the mean PSTVd genome length (359 nt) times the number given on the left end of lines. Dashed curved lines indicate mean error rate per nucleotide  $P_{\text{error}}$  given on the right end of lines.

for our type of quasispecies analysis because all calculations are only based on relative count numbers  $v^{\text{var}}/v^{\text{ref}}$  (see (1) and (2)).

In data sets from ‘Moneymaker’ plants inoculated with RG1 or ‘Heinz 1706’ plants inoculated with AS1, C3, or I, only minor levels of mutations were detected; that is, the inoculated variant remained the master sequence at the time of sampling. In contrast to the closing remarks in ref. 37 where the authors recommend the use of cloned cDNA as inoculum rather than the inherently more heterogeneous RNA transcripts, the type of inoculum used in our studies appears to have had little or no effect on sequence evolution *in vivo*.

PSTVd variants I and M share 97% sequence homology, and a previous comparison of cloned RT-PCR products suggested that both variants replicate stably when inoculated to tomato.<sup>36</sup> Our analysis of small RNAs extracted from an independent set

of plants infected with these 2 variants indicates that this conclusion may need to be reexamined. In data set D<sub>p</sub> a novel variant differing from PSTVd-M by a 2-nucleotide deletion in the lower P region was present at levels comparable to the inoculated variant. PSTVd-I appeared to be more stable than PSTVd-M, and the low levels (<7%) of a novel variant in the progeny could well have escaped detection by cDNA cloning.

Taken together our results fit quite well with quasispecies theory; i.e., the viroid quasispecies serves as a source of adaptation to new hosts, and changes in selective pressures are able to induce the rapid emergence of new variants.<sup>11,38–43</sup> The fitness landscape of PSTVd seems to contain a limited number of peaks,<sup>12</sup> many of which coincide with known variants. In addition to replication-competent mutants, mutations that are present in only one polarity might also be advantageous for viroid evolution. Such mutations may allow fast adaptation to new

environments, as shown for example for ribozyme selection,<sup>44</sup> and may also increase the spectrum of host targets susceptible to post-transcriptional gene silencing. Thus, a PLMVd variant that contains a specific hairpin insertion sequence and induces a loss of pigmentation known as ‘peach calico’, expresses a vsRNA that targets the mRNA of chloroplastic heat-shock protein 90 leading to chloroplast malformation.<sup>16</sup> Also, PSTVd variants M and I express a scarce vsRNA from  $P_{upper}^+$  that pairs a tomato CalS11-like mRNA.<sup>18</sup> vsRNAs encoded by the mutant swarm rather than the master sequence could allow the viroid to attack additional targets, thereby creating a cellular environment more favorable for viroid replication.

The concept of an error threshold<sup>6</sup> limits the length of a self-replicating molecule to the inverse of the error rate of its replicase. This concept also holds for viroids that utilize a host polymerase for replication. Because the host polymerase, either Pol II for members of *Pospiviroidae* or NEP for members of *Avsunviroidae*, has to act on a foreign RNA rather than its normal DNA template, it is often assumed that the error rates could well be higher than those observed with DNA templates. Indeed, the error rate of a member of *Avsunviroidae* has been shown to be  $2.5 \times 10^{-3}$ ,<sup>5</sup> resulting in  $\sim 1$  mutation per genome replication. Considering the higher structural constraints imposed by the rod-shaped structure of members of *Pospiviroidae* in comparison to the branched structure of most members of *Avsunviroidae*, Duràn-Vila et al. have proposed that the error rate of *Pospiviroidae* should be 10-fold lower than that of *Avsunviroidae*.<sup>45</sup> Our data for PSTVd indicates, however, an upper limit of  $5 \times 10^{-3}$  for the error rate, a value which is quite similar to that for a member of *Avsunviroidae*. Additional measurements using other viroid-host combinations are needed before a firm conclusion can be drawn.

The studies described here used a collection of vsRNA samples isolated from a single host species at just one time point comparatively late in the PSTVd infection process. Despite these limitations, we have shown that vsRNA analysis can distinguish mutations that block PSTVd replication and/or movement from those that allow continued systemic infection. Future studies of carefully selected combinations of viroid variant and host plant growing under controlled conditions and repeatedly sampled throughout the course of infection should provide new insights into several aspects of viroid-host interaction.

## Materials and methods

### Deep-sequencing data sets of small RNAs

We analyzed 3 published sets of small RNA sequence data, which are abbreviated as  $D_s$ ,  $D_p$  and  $D_o$ , respectively. In the following we summarize the small RNA preparation and sequencing to point out some experimental differences and commonalities between these data sets.

$D_s$ <sup>13</sup> is from *S. lycopersicum* ‘Heinz 1706’ plants infected with PSTVd variants QFA (mild, GenBank AC U23059.1), C3 (severe, HE575349.1), or AS1 (“lethal,” AY518939.1). Plants containing 3 true leaves were biolistically inoculated<sup>42</sup> with *StyI*-cleaved full-length cloned cDNA,<sup>41</sup> and plants were maintained in climate boxes at 28°C under a mixture of fluorescent and incandescent illumination (10,000 lx for a 16 h-day

period). Samples of leaf and stem tissue were collected 30 d post infection (dpi); total RNA was prepared by phenol/chloroform extraction and ethanol precipitation, and small RNAs were enriched by denaturing gel-electrophoresis and gel-elution. Ligation of 3’ and 5’ adapters and cDNA synthesis was performed by vertis Biotechnologie (Freising, Germany); Illumina sequencing of the cDNA was done by GATC Biotech (Konstanz, Germany) on a HiSeq 2000 system.

$D_p$ <sup>19</sup> is from *S. lycopersicum* ‘Rutgers’ plants infected with the PSTVd variants Intermediate (I, AY937179.1) or PSTVd Dahlia (M(ild), AB623143.1), respectively. Plants having only a single true leaf were inoculated with dimeric RNA transcribed with T7 polymerase from cloned cDNA;<sup>46</sup> plants were grown in a growth chamber controlled at 25°C, with a 16-h day and high light intensity (fluorescent, 40 W  $\times$  4). Leaf samples were collected 21 dpi; total RNA was prepared by phenol/chloroform extraction and DNase I treatment; small RNAs were enriched by denaturing gel-electrophoresis and gel-elution. Ligation of adapters, cDNA synthesis and deep-sequencing was performed by Hokkaido System Science Co. (Sapporo, Japan) using a Genetic Analyzer IIX platform.  $D_o$  is from 4 different tomato cultivars infected with monomeric T7 RNA transcripts<sup>47</sup> having the sequence of the PSTVd variant RG1 (intermediate-severe, U23058.1). Cultivars ‘Heinz 1706’ and ‘Rutgers’ are PSTVd-sensitive, and the PSTVd-insensitive ‘Moneymaker’ and ‘UC82B’ are nearly asymptomatic. Plants having 3 true leaves were mechanically inoculated with T7-RNA transcripts; samples of young leaf tissue were collected 27 dpi and small RNAs were extracted using Trizol reagent (Life Technologies, Carlsbad, CA, USA) and enriched *mirVana*<sup>TM</sup> kit (Life Technologies). Ligation of adapters, cDNA synthesis and deep-sequencing was performed by Expression Analysis/Q<sup>2</sup> Solutions (Durham, NC, USA).

For  $D_s$ , we used PrinSeq<sup>48</sup> for entropy-based removal of uninformative poly-A tails derived from the sequencing procedure. Illumina adapters were removed using TRIMMOMATIC.<sup>49</sup> We used SEGEMEHL v. 0.2.0<sup>50,51</sup> to map deep-sequenced vsRNAs to their infecting PSTVd variant reference. Parameters for use of these programs are listed in Table S1.

### Sequence evolution

We followed Eigen’s formalism for the evolution of sequences.<sup>6</sup> In brief, read mappings with 90% accuracy resulted in positions  $i$  deviating from the reference sequence  $S$ ; consecutive insertions were handled as a single mutation at the corresponding first position. The read count with the reference nucleotide at position  $i$  is  $v_i^{\text{ref}}$ , the sum of all reads with nucleotide changes (substitutions, insertions, or deletions) at position  $i$  is denoted as  $v_i^{\text{var}}$ . Then the probability  $q$  for exact reproduction of a nucleotide was estimated by the mean error rate  $P_{\text{error}}$  over all sites:

$$q(S) = 1 - \left( \sum_{i=1}^{|S|} \frac{v_i^{\text{var}}}{v_i^{\text{ref}}} \right) / |S| = 1 - P_{\text{error}} \quad (1)$$

Under the assumption that master and error copies exhibit the same decay rate, we estimated the average selective

advantage  $\sigma$  of the master copy over the error copies under 90% accuracy mapping<sup>52</sup>

$$\sigma(S) = \sum_{i=1}^{|S|} \frac{v_i^{\text{ref}}}{v_i^{\text{var}}} \quad (2)$$

and the error threshold

$$t_{\max} < \ln(\sigma)/(1 - q). \quad (3)$$

### Sequence network mapping with NETMAP

We developed a graph-orientated method named NETMAP, a PERL script based on SAMTOOLS<sup>53</sup> and Bio::DB::Sam, to assemble the PSTVd sequence space from mapped deep-sequenced small RNA reads. A PSTVd sequence of length  $l$  is represented by  $|v|^l$  vertices with  $v \in \{A, C, G, U, D(\text{elation}), I(\text{nsertion})\}$  connected by weighted directed edges  $e$ . A weight  $w$  is the count of 2 adjacent vertices located in any single read; the edge direction represents (+) and (−) strandedness of reads. The graph  $G = (V, E)$  is constructed from short reads mapped by SEGEMEHL with 90% accuracy to a reference sequence, which is the PSTVd variant used for infection.

We applied the following filter steps to vsRNA reads to reduce noise based mainly on sequencing errors:

1. Two neighboring sequence positions ( $u, v$ ) are only connected by an edge  $e(u, v)$  if they are in the same read with read counts  $w(e(u, v)) \geq 20$  and relative counts  $w(e(u, v)) / w(e(u^{\text{ref}}, v^{\text{ref}})) \geq 0.01$ .
2. Mismatching bases at the 5' or 3' end of a read are considered as adaptor contamination or sequencing error if no other reads embed these variations.
3. Only variants present in both polarities are considered competent for replication.
4. Two (or more) sequence variations are only considered as connected (i.e., derived from one genome) if a read includes both; that is, variations further apart than the length of a read might originate from different PSTVd genomes. If 2 variants are present on both polarities but are only connected in one polarity, we still considered them as connected.

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No potential conflict of interest were disclosed.

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