Identification of Viruses and Viroids by Next-Generation Sequencing and Homology-Dependent and Homology-Independent Algorithms

# Qingfa Wu,<sup>1</sup> Shou-Wei Ding,<sup>2</sup> Yongjiang Zhang,<sup>3</sup> and Shuifang Zhu<sup>3</sup>

<sup>1</sup>School of Life Sciences, University of Science and Technology of China, Hefei, Anhui, 230026 China; email: wuqf@ustc.edu.cn

<sup>2</sup>Department of Plant Pathology and Microbiology, University of California, Riverside, California 92521; email: dingsw@ucr.edu

<sup>3</sup>Institute of Plant Quarantine, Chinese Academy of Inspection and Quarantine, Chaoyang District, Beijing, 100123 China; email: zhusf@caiq.gov.cn

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#### Abstract

A fast, accurate, and full indexing of viruses and viroids in a sample for the inspection and quarantine services and disease management is desirable but was unrealistic until recently. This article reviews the rapid and exciting recent progress in the use of next-generation sequencing (NGS) technologies for the identification of viruses and viroids in plants. A total of four viroids/viroid-like RNAs and 49 new plant RNA and DNA viruses from 18 known or unassigned virus families have been identified from plants since 2009. A comparison of enrichment strategies reveals that full indexing of RNA and DNA viruses as well as viroids in a plant sample at single-nucleotide resolution is made possible by one NGS run of total small RNAs, followed by data mining with homology-dependent and homology-independent computational algorithms. Major challenges in the application of NGS technologies to pathogen discovery are discussed.

#### INTRODUCTION

Viruses are ubiquitous pathogens found in all types of cellular organisms. Typically, viral particles or virions range from 30 to 450 nm in size and contain a small genome packaged by capsid proteins with or without a lipid envelope. Whereas cellular organisms store genetic information exclusively in DNA, both DNA and RNA can serve as the genomes of viruses. In addition to viruses, the circular noncoding RNA viroids also cause diseases in plants. Because of their small size and inability to propagate outside living host cells, viruses and viroids remain difficult to detect and identify compared to cellular pathogens. Enzyme-linked immunosorbent assay (ELISA), polymerase chain reaction (PCR), and nucleic acid hybridization techniques (including microarray) developed in the last several decades collectively provide rapid and inexpensive diagnoses for the known viruses and viroids and are widely used in agriculture and medicine (20, 64, 70, 83). However, because these assays depend on the reagents (antibodies, primers, or probes) developed from the characterized viruses and viroids, they are ineffective when the disease is caused by a new pathogen or a mixture of pathogens that share little or no sequence similarity with those described previously.

Major advances in DNA sequencing technology over the last decade have led to the development of new approaches for the identification and detection of viruses and viroids. These new approaches, frequently referred to as metagenomics (64), sequence the total nucleic acid content in disease samples by next-generation sequencing (NGS) technologies for the subsequent identification of pathogens by bioinformatics tools. Unlike existing methods, the metagenomics approach does not require prior knowledge of the pathogens and can potentially identify both the known and new viruses and viroids in a disease sample. For example, use of NGS technologies has played a key role in the identification of Israeli acute paralysis virus associated with colony collapse disorder in honeybees (16) and of a polyomavirus in human Merkel cell carcinoma (30). Rapid development in NGS technologies has dramatically reduced the cost and time for pathogen identification by metagenomics approaches, leading to a recent explosion in metagenomics studies on viruses and viroids in plants (46, 61, 84). After a short introduction of the main NGS platforms currently available, this article reviews recent applications of the homology-dependent and homology-independent metagenomics approaches to the identification and detection of viruses and viroids in plants.

## **NEXT-GENERATION SEQUENCING PLATFORMS**

The meaning of the term high-throughput sequencing (HTS) has changed with the advancement of sequencing technologies. The Sanger technique had been the standard sequencing method since it was first described in 1977. For almost a decade, DNA sequencing was a labor-intensive process that involved determining only a few hundred nucleotides at a time (47). In a typical Sanger sequencing reaction, short DNA fragments made from supersonic or enzyme digestion have to be cloned into plasmids for amplification in *E. coli* before enzymatic dideoxy-sequencing. The sequencing protocol includes the use of radioisotopes and harsh chemicals. Development of capillary array electrophoresis and appropriate detection systems in the early 1990s (44) eventually led to the production of 96-channel capillary HTS sequencers (47). As an example of the modern Sanger capillary sequencing systems, the 3730xl DNA Analyzer from Applied Biosystems, Inc. (ABI) yields 96 or 384 sequences of approximately 600–1,000 nucleotides (nt) in length per run and a maximum of approximately 1.5 Mb of DNA sequence per day (**Table 1**).

New "massively parallel" DNA sequencing platforms have become available since 2005 to sequence populations of amplified template DNA molecules with a typical "wash-and-scan" technique (47). Because these new sequencing platforms outperform Sanger sequencing technologies

Platform	Principle <sup>a</sup>	Throughput/run	Read length	Time/run	Single-pass error rate
ABI 3730xl	Sanger Sequencing	64 kb	400–900 bp	1 h	0.1–1%
GS FLX+	SBS	700 Mb	700 bp	23 h	1%
HiSeq 2500	SBS	5–1,000 Gb	2 × 125 bp	1–6 days	0.1%
MiSeq	SBS	0.3–15 Gb	2 × 300 bp	5–55 h	0.1%
Ion Torrent	SBS	1.2–2 Gb	400 bp	7.3 h	1%
Ion Proton	SBS	10 Gb	200 bp	2–4 h	1%
SOLiD 5500xl	SBH	95 Gb	$2 \times 60 \text{ bp}$	6 days	5%
PacBio RSII	SMRT	500–1,000 Mb	10–15 kb	0.5–5 h	13%

Table 1 Next-generation sequencing platforms

<sup>a</sup>SBS, sequencing by synthesis; SBH, sequencing by hybridization; SMRT, single molecule, real time.

by a factor of 100–1,000 in daily throughput, they were termed next-generation sequencing (NGS) instead of HTS (47). These NGS approaches (**Table 1**) have different underlying biochemistries and differ in template preparation, sequencing and imaging, and data analysis (63). For sequencing by the 454 platform (e.g., GS FLX+; see **Table 1**), the DNA template is first amplified by emulsion PCR in which a single DNA template is amplified to thousands of copies in each droplet of an oil solution. The amplified DNA templates are incubated with a DNA polymerase, single-strand DNA binding proteins, and the ATP sulfurylases and luciferases; the light emitted during the incorporation is captured for all wells in parallel using a high-resolution charge-coupled device (CCD) camera. After capture of the light intensity, the remaining unincorporated nucleotides are washed away before the next nucleotide is added. The 454 technology is referred to as pyrosequencing because the sequencer generates visible light from inorganic pyrophosphate of deoxynucleotides (dNTPs) released during DNA synthesis by sulfurylase and luciferase. The average number of reads produced per run by the current GS FLX+ sequencer is more than 1 million reads of approximately 700 bases with a run time of approximately 23 h (47, 60).

The strategy of template preparation and sequencing of Illumina instruments is quite different from that of 454 pyrosequencing. Bridge amplification of each DNA template produces a cluster of thousands of original sequences in very close proximity to each other on the flow cell. A typical slide generates hundreds of millions of spatially separated clusters per run. The Illumina platform uses four dNTPs with different reversible dye terminators in the sequencing reaction so that the incorporation reaction is stopped after each base and the incorporated base is easily read out with fluorescent dyes. The fluorescently labeled terminator is imaged and then cleaved from the nascent end of DNA for the next cycle. The Illumina platform supports both single-end and mate-pairedend sequencing. Illumina HiSeq 2500 allows a powerful combination of  $2 \times 125$  base pair (bp) read lengths and up to 1 Tetrabase per run within 6 days, whereas MiSeq generates up to 15 Gb of data in only 55 h (**Table 1**) (59, 63).

In the SOLiD platform of ABI the sequence extension reaction is carried out by ligases, rather than polymerases as in the 454 and Illumina platforms. The single-stranded copies of the DNA library molecules are first hybridized with a sequencing primer before the addition of a mixture of 8-mer probes carrying four distinct fluorescent labels to compete for ligation to the sequencing primer. After the fluorescence determined by the two 3'-most nucleotides of the probe is read out, three bases including the dye are cleaved from the 5' end of the probe to leave a free 5' phosphate for further ligation. After multiple cycles of ligations (typically up to 10 cycles), the synthesized strands are melted, and the ligation product is washed away before a new sequencing primer (shifted by one nucleotide) is annealed. The same process is repeated for the remaining three

primers, facilitating the readout of the dinucleotide encoding for each start position in the DNA sequence. Using specific fluorescent label encoding, the dye readouts (i.e., colors) are converted to a DNA sequence. For parallelization, the sequencing process uses beads covered with multiple copies of the sequence to be determined. These beads are created in a fashion similar to that described above for the 454 platform. The SOLiD 5500xl system currently generates 95 Gb of data per run during 6 days with a typical read length combination of  $2 \times 60$  bp (47, 92).

New sequencing platforms with improved performance continue to be developed and released (**Table 1**). Approaches that sequence single large DNA molecules without the need to halt between read steps are sometimes referred as third-generation sequencing (88). However, Ion Torrent and Proton are between the second and third generation, since they do not completely fulfill the features assigned to either category (9). Advancement of sequencing technology provides unprecedented opportunity for pathogen discovery in plants by unbiased viral metagenomics.

## HOMOLOGY-DEPENDENT PATHOGEN IDENTIFICATION BY NEXT-GENERATION SEQUENCING TECHNOLOGIES

Viral metagenomics is defined as the culture-independent study of the collective set of viral genomes in samples from the environment, as well as from individual plants and animals (74). Encouraged by early success in the discovery of animal viruses (16, 30, 68, 71), at least 66 studies on the metagenomics of plant viruses and viroids have been published since 2009 (**Table 2**). Typically (**Figure 1**), identification of viruses and viroids by the metagenomics approach includes sample preparation, DNA sequencing by an NGS platform, and bioinformatics analysis (114), which are discussed below.

### Sample Preparation: Strategies to Enrich Virus Sequences

Six new plant viruses have been identified by directly sequencing the total RNA from host plants (1, 3, 67, 95, 103, 111) (**Table 2**). To maximize the detection of viruses, however, several strategies have been developed for enrichment of the deep-sequencing reads specific to viruses and/or viroids. Because of the overwhelming abundance of host rRNAs, rRNA depletion from total RNA preparations will increase the proportion of virus and viroid reads relative to those of host and nonhost origin (3). Similarly, rRNA depletion is also achieved by sequencing only the polyadeny-lated transcripts (poly-A RNAs), and enrichment of poly-A RNAs for deep sequencing led to the discovery of seven new RNA viruses and two DNA badnaviruses (34, 107, 113). However, this enrichment strategy will also delete reads from many families of RNA viruses that do not synthesize poly-A RNAs, including, for example, *Tobacco mosaic virus, Cucumber mosaic virus*, and *Turnip yellow mosaic virus*. Thus, enrichment for the following molecules has been more common in metagenomics studies of plant viruses.

**Double-stranded RNAs.** Because double-stranded RNA (dsRNA) is synthesized by RNA viruses and viroids as replicative intermediates (**Figure 1**) and plants do not normally produce dsRNA, sequencing total dsRNA dramatically increases the proportion of reads specific to viruses and viroids (2–4, 13, 15, 76). For example, a study compared deep sequencing of total RNA and dsRNA from the same plant samples and found that virus reads increased from 2% to 53% after dsRNA enrichment (3). Use of CF11 cellulose spin-column or chromatography for the purification of viral dsRNA is a well-established procedure in plant virology (26, 84, 85). Recently, an improved dsRNA purification method based on anion exchange chromatography utilizing convective interaction media (CIM) monolithic columns has been developed, which can be used to obtain highly pure

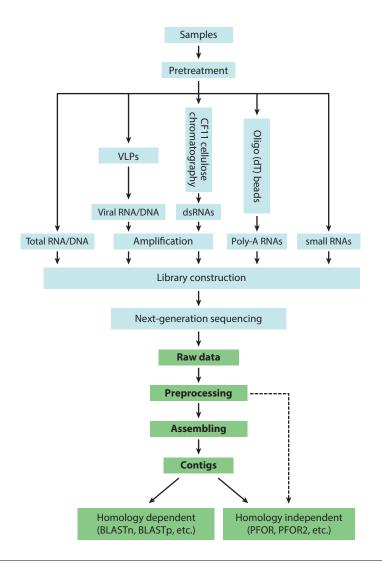
			Viruses			Viroids			
				Ne	w				
	NGS								
Enrichment	platform	Assembly tools	Known	RNA	DNA	Known	New	Host species	Reference
Total RNA	454	CLC	3	1		3		Grapevine	3
	454	CLC	1	1				Tomato/Gomphrena	1
								globosa	
	454	CLC		1				Cassava	67
	454	CLC	1					Canna	66
	Illumina	Geneious	1					Hardenbergia	104
	Illumina	Velvet/Geneious		1				comptoniana H. comptoniana	103
	454	CLC		1				Lettuce	95
	454	CLC	1	-				Iris	43
	Illumina	Geneious/CLC		1				Yellow tailflower	111
	Illumina	Geneious	1	1				Capsicum annuum	99
Poly-A	Illumina	Geneious	1					Passiflora caerula	105
1019 11	Illumina	Geneious/CLC	1	1				Orchid	113
	Illumina	Geneious/CLC	1	1				Iris	44
	Illumina	Geneious/CLC	5					Narcissus and	106
	Inumina	Generous/CEC	5					Hippeastrum	100
	Illumina	Geneious/CLC	4	4				Orchid	107
	Illumina	Edena/Velvet/	11	2	2			Sweet potato	34
		SOAPdenovo/							
		CAP3							
DIT	Illumina	Velvet, Oases	1					Prunus domestica	80
rRNA depletion	Illumina		3			4		Grapevine	75
dsRNA	454	BLAST	3	1		3		Grapevine	3
	Illumina	Velvet	4					Grapevine	15
	454	Newbler	1					Grapevine	4
	Illumina	Velvet/ CodonCode		1				Red raspberry	76
	454	CLC	1					Cherry	13
	Illumina	Velvet		1				Grapevine	6
	454	Newbler	2					Maize	2v
	Illumina	Geneious/CLC		1				Orchid	110
	Illumina	Velvet			1			Grapevine	5
	Illumina	Velvet		2				Japanese persimmon	40
	Illumina	Velvet					PVd2	Diospyros virginiana	41
	Illumina	CLC	1					Citrus	115
	Illumina	Geneious/CLC	10					Garlic	112

## Table 2 Detection of plant viruses and viroids by next-generation sequencing technologies

(Continued)

## Table 2 (Continued)

			Viruses			Viroids			
				Ne	w				
	NGS					1			
Enrichment	platform	Assembly tools	Known	RNA	DNA	Known	New	Host species	Reference
Virus-like	454	Newbler	1					Sweet potato	81
particles	SOLiD	Velvet		1				Eggplant	28
	454	Newbler	1					P. domestica	93
	454	Newbler/CLC	1					Potato	79
	SOLiD	Velvet		1				Pepper	27
	454	CLC	1		1			Sugarcane	12
	454	Newbler			3			Black pepper	36
Small	Illumina	Velvet/VCAKE	2		3			Sweet potato	49
RNAs	454	Velvet	2					Cocksfoot grass	72
	Illumina	Blast	12					Grapevine	73
	Illumina	SSAKE	27		1			Grapevine	117
	Illumina	Velvet	1					Sweet potato	17
	Illumina	Velvet	2					Tomato	35
	Illumina	Velvet	1					Squash	35
	Illumina	Velvet	6					Sweet potato	45
	Illumina	Velvet	1	1		1		Tomato	54
	Illumina	Velvet	3	1		2		Grapevine	32
	Illumina	Velvet		1		2		Citrus	56
	Illumina	Velvet			1			Citrus	57
	Illumina	Velvet		1				Yam bean	31
	Illumina	Velvet	10	1				Arctium tomentosum	10
	Illumina	Velvet	1					Soybean	65
	Illumina	Velvet		1				Sweet potato	19
	Illumina	Velvet	1	1				Potato	48
	Illumina	Velvet		1				Tomato	53
	Illumina	Velvet/Oases		1				Citrus	86
	Illumina	Velvet/Oases		1				Citrus	97
	Illumina	CLC	1		1			Sugarcane	12
	Illumina	CodonCode	1					Papaya	118
	Illumina	Geneious/Velvet/ CLC/Geneious	3	1				Tomato	59
	Illumina	Velvet	19					Sweet potato	62
	Illumina	Velvet	1					Potato	50
	Illumina	Velvet			1	2		Grapevine	91
	Illumina	Velvet	1	3				Cassava	14
	Illumina	Velvet			1			Pagoda	98
	Illumina	Velvet/CAP3	3	1				Rose	39
	Illumina	PFOR				2	1*	Grapevine	102
	Illumina	PFOR2				5	2*	Apple/grapevine	119



#### Figure 1

The key steps in the discovery of viruses and viroids by next-generation sequencing. The experimental part, including the strategies of viral pathogen enrichment, is shown in blue, whereas the informatics process is shown in green. Abbreviations: BLASTn, nucleotide-nucleotide BLAST; BLASTp, protein-protein BLAST; dsRNAs, double-stranded RNAs; dT, thymine deoxyribonucleotide; PFOR, progressive filtering of overlapping small RNAs; VLP, virus-like particle.

dsRNA preparations shorter than 1 kb (82). However, six of the seven new viruses discovered by dsRNA sequencing contain RNA genomes, possibly because plant DNA viruses do not produce sufficiently long dsRNA in their life cycle. We note that the new DNA geminivirus was identified from sequencing a total dsRNA preparation that was not treated with RNase and DNase before library construction (5).

Virus-like particles. Viral genomic RNA or DNA packaged in viral particles is protected from DNase and RNase treatments. Therefore, enrichment of VLPs (Figure 1) by homogenization, filtration, and ultracentrifugation has been widely used for virus discovery in ocean, environmental,

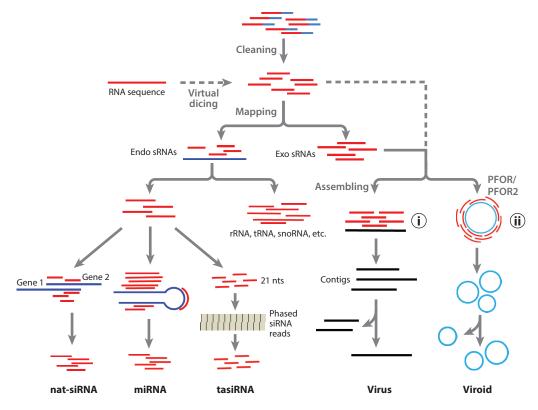
and fecal samples (20, 52, 64, 96) as well as in several studies of plant samples (12, 27, 28, 36, 79, 81, 93). VLP preparations contain contaminating mitochondria and bacteria, so VLPs are often treated with chloroform to disrupt mitochondrial and bacterial membranes before nuclease digestion and the extraction of VLP-associated nucleic acids for deep sequencing (51, 100). Unfortunately, enveloped viruses are also sensitive to chloroform treatment. Moreover, because successful virion purification of many viruses requires development of specific protocols, it is unlikely that all viruses can be captured by a single protocol for VLP enrichment. Nevertheless, deep sequencing of the total nucleic acids from VLPs extracted from plants led to the discovery of four DNA viruses and two RNA viruses (**Table 2**).

Because the total nucleic acid content from both VLP and dsRNA preparations is often very low, an extra step to amplify the extracted nucleic acids by PCR or reverse transcription PCR (RT-PCR) in a sequence-independent manner is necessary before the construction of libraries for deep sequencing (**Figure 1**) (16, 64). An improved rolling-circle amplification technique to amplify circular dsDNA viral genomes is available (89, 94).

**Small RNAs.** It is known that plants and invertebrates produce virus-derived small interfering RNAs (siRNAs) in response to infection by both RNA and DNA viruses (**Figure 1**) (22–24). Recent studies have also detected abundant production of viral siRNAs in mammalian cells after infection by two unrelated positive-strand RNA viruses (55, 58). Moreover, dsRNA replicative intermediates of viroids and satellite RNAs are also processed into siRNAs in plants (22–24). The first deep-sequencing study of viral siRNAs has revealed that viral siRNAs in fact overlap each other extensively despite being only 21 to 24 nt long (7). Ubiquitous production in diverse eukaryotic hosts and the overlapping property of viral siRNAs have been utilized independently by two groups to develop a novel strategy for virus discovery (**Figure 2**) by enriching and sequencing small RNAs (49, 101). In this approach, known as virus discovery by deep sequencing and assembly of total small RNAs (vdSAR), small RNAs are enriched from diseased cells/tissues for deep sequencing by NGS platforms and assembled into large sequence contigs/fragments that are then used for virus discovery as those sequences are obtained from dsRNAs and VLPs.

The original protocols to construct a library of small RNAs for sequencing took up to two weeks (7, 8). However, current protocols no longer require gel purification of small RNAs either before or after ligation with 5' and 3' adaptors and may be completed within one day (55). Because the sequence-independent amplification required for dsRNA and VLP preparations is not necessary, sample preparation for small RNA sequencing is less technically demanding and time-consuming than are dsRNA and VLP purification protocols (**Figure 1**).

There are several reasons why more investigators chose to enrich and sequence small RNAs for the identification of plant viruses and viroids over other enrichment strategies (**Table 2**). First, replication of RNA and DNA viruses and replication of subviral agents such as viroids and satellite RNAs in plants all induce extremely abundant accumulation of the pathogen-specific siRNAs, which represent up to 30% of total small RNAs sequenced from diseased plants (22–24). Because both the amount of sequencing and data complexity are greatly reduced, sequencing of multiple samples marked by barcodes in a single lane still provides sufficient depth for pathogen discovery. Thus, vdSAR is cost-effective. Second, unlike dsRNA and VLP preparations, all replicating viruses and viroids in a diseased plant can be detected in principle from the deep sequencing of a single library of small RNAs. This feature is particularly attractive for many disease diagnostic and quarantine applications. Third, viral and subviral siRNAs are the products of an active host immune response to infection and exhibit specific patterns of size distribution in distinct host species due to their biogenesis by specific Dicer proteins (22–24). Therefore, the size distribution pattern of small RNAs may reveal if the identified viral and subviral pathogen actively replicates in plants or



#### Figure 2

The classification principles of endogenous and exogenous small RNAs (sRNAs) sequenced from plants in the discovery of (*i*) viruses by deep sequencing and assembly of total small RNAs (vdSAR) and (*ii*) viroids by progressive filtering of overlapping small RNAs (PFOR). Abbreviations: nat-siRNAs, natural antisense siRNAs; nt, nucleotides; tasiRNAs, trans-acting siRNAs; miRNAs, microRNAs; SLS, splitting longer reads into shorter fragments.

in the associated fungal or insect species (119). Finally, data mining of the same libraries of small RNAs may lead to the discovery of novel pathogens that exhibit no sequence similarity detectable by currently available informatics tools (**Figures 1** and **2**; see also below).

## **Bioinformatics Analysis**

Prior to sequence assembly and pathogen identification, the raw data generated by NGS platforms must be preprocessed to remove adaptors and low-quality sequences (**Figure 1**). The quality control is dependent on the sequencing technology used. Standard parameters and thresholds are usually provided by the manufacturer. It is now a standardized process on "older" technologies like 454/Roche pyrosequencing or Illumina sequencing by synthesis. For multiplex sequencing of mixed libraries in a single lane, an extra step of demultiplexing using barcodes built in the PCR primers is necessary before sequence assembly. When the genome sequence of the host plant is available, in silico subtraction of host-specific sequences (**Figure 2**) before assembly will speed up the downstream bioinformatics analysis (54, 64). It should be pointed out that adaptor removal and computational filtering of host sequences can lead to other artifacts (43, 84).

The assembly of the preprocessed reads can be executed by several mainstream algorithms that are publicly available, including Velvet, Oases, and VCAKE (42, 90, 116). The parameters used

in sequence assembly are similar to those for genome assembly and are defined by the algorithm employed. Subsequently, the assembled contig sequences are queried by homology search tools against previously documented sequences stored either in a local database or in public databases such as GenBank (64). A common approach is to compare the assembled sequences with the nonredundant nucleotide database of GenBank using a BLAST package. BLASTn and BLASTx are the two frequently used programs for nucleotide and amino acid comparison, respectively. New and known viruses are readily identified when contigs show high similarity (>90% similarity and 85% coverage) with a known virus (78, 101). When a contig shows distant homology with a known virus, especially only at the protein level, the contig often represents a new virus that can be taxonomically assigned only at the level of the virus family (78, 101).

A bottleneck in the viral metagenomics approach is the de novo annotation of thousands of the assembled contigs. The computing time required for the annotation is likely to increase as sequence databases continue their exponential growth. The use of dedicated databases or of subsections of GenBank could overcome this problem; however, it will not be possible to identify bacterial, archaeal, and nonhost eukaryotic sequences, leading to an overestimation of the fraction of unknowns (64). To meet the demand of the huge number of sequencing data from NGS, computer programs that are orders of magnitude faster than BLAST have been developed, such as USEARCH and HHbits (29, 77).

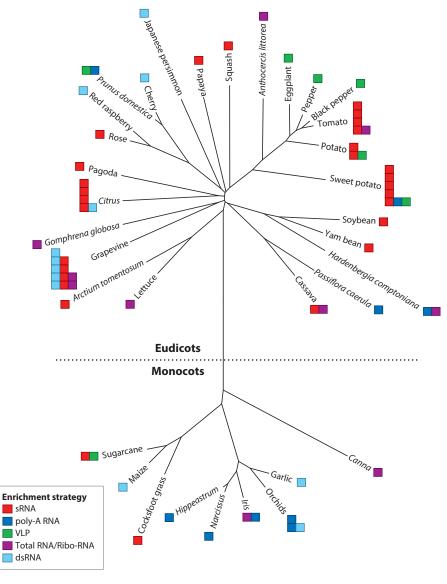
Although software packages used for viral metagenomics are freely accessible, data analysis often requires a trained bioinformaticist, a requirement that hinders the routine application of NGS in the identification of viruses and viroids. Recently, an easy-to-use graphical interface, SearchSmallRNA, became available to reconstruct viral genomes with high reliability using small RNA data from NGS. SearchSmallRNA bypasses the need of line command and basic bioinformatics knowledge (18). Commercial packages such as CLC Genomics Workbench and Geneious or open platforms such as Galaxy also provide user-friendly interfaces and simplify the use and parameterization of these tools. These efforts will facilitate identification of viruses and viroids by NGS technologies.

#### Homology-Dependent Discovery of Viruses and Viroids in Plants

Diverse eudicot and monocot plant species have been selected for the identification of viruses and viroids by metagenomics approaches (Figure 3). These efforts have resulted in the discovery of at least 49 new RNA and DNA viruses in total. Among these new viruses, 36 can be classified into the existing genera of 16 different families, nine may become the founding members of new genera in five different families, and the remaining four viruses cannot be assigned to a known virus family (Table 3). The comparison shown in Table 2 shows that enrichment of small RNAs for deep sequencing is the most effective strategy in terms of both the number and diversity of the new viruses identified. Both RNA and DNA viruses are readily detected by enriching VLPs for sequencing. However, viroids are not found in VLPs as expected. Detection of the known viroids is possible by sequencing small RNAs and total RNAs with or without rRNA depletion (Table 2). A new viroid was identified by total dsRNA sequencing (41). In contrast, new viroids have not been sequenced from many plant samples with the available bioinformatics tools. We note that a majority of investigators chose Illumina as the NGS platform for viral metagenomics studies in plants.

#### HOMOLOGY-INDEPENDENT IDENTIFICATION OF VIROIDS

Although prior knowledge of the pathogens is not necessary to initiate the diagnostic procedure by the metagenomics approach, a pathogen is identified only when it exhibits nucleotide or amino acid



#### Figure 3

The taxonomy of host plant species selected for the identification of viruses and viroids by next-generation sequencing. Also shown are the strategies (*frequencies are marked by colored boxes*) used to enrich virus and/or viroid sequences in each host species. The clustering of host species on a tree may not be strictly consistent with the phylogenetic relationship of these species. Abbreviations: dsRNA, double-stranded RNA; poly-A RNA, polyadenylated transcript; ribo-RNA, ribosomal RNA-depleted RNA; sRNA, small RNA; VLPs, virus-like particles.

sequence homology with a known pathogen in a database. Therefore, the metagenomics approach as described above cannot discover novel pathogens that show little or no sequence homology with known pathogens. In a hypothetical scenario, for example, BLAST searches would not be able to identify NGS reads of geminiviruses as virus-specific in 1977 (33, 38) because geminiviral genomes show no detectable sequence similarity with other viruses (37).

## Table 3 New plant viruses and viroids discovered by next-generation sequencing

Virus	Family (genus)	Infective?	Reference	
RNA viruses				
Gayfeather mild mottle virus (GMMV)	Bromoviridae (Cucumovirus)	Yes	1	
Grapevine Syrah virus-1 (GSyV-1)	Tymoviridae (Marafivirus)	NA	3	
Cassava brown streak virus (CBSV)	Potyviridae (Ipomovirus)	NA	67	
Hardenbergia virus (HarVA)	Betaflexiviridae	NA	103	
Lettuce necrotic leaf curl virus (LNLCV)	Secoviridae (Torradovirus)	Yes	95	
Yellow tailflower mild mottle virus (YTMMV)	Virgaviridae (Tobamovirus)	Yes	111	
Caladenia virus A (CalVA)	Potyviridae (Poacevirus)	NA	113	
Donkey orchid virus A (DOVA)	Potyviridae (Potyvirus)	NA	107	
Diuris virus A (DiVA)	Betaflexiviridae (Capillovirus)			
Diuris virus B (DiVB)	Betaflexiviridae (Capillovirus)			
Diuris pendunculata cryptic virus (DPCV)	Partitiviridae			
Ipomoea batatas Rhabdovirus N-like sequences (IbRNLS)	Rhabdoviridae	NA	34	
Cymbidium mosaic virus (CymMV)	Alphaflexiviridae (Potexvirus)			
Raspberry latent virus (RpLV)	Reoviridae (Reovirus)	Yes	76	
Grapevine virus F (GVF)	Betaflexiviridae (Vitivirus)	Yes	6	
Donkey orchid symptomless virus (DOSV)	Unassigned	Yes	110	
Persimmon virus A (PeVA)	Rhabdoviridae (Cytorhabdovirus)	Yes	40	
Persimmon latent virus (PeLV)	Unassigned			
Eggplant mild leaf mottle virus (EMLMV)	Potyviridae	Yes	28	
Pepper yellow leaf curl virus (PYLCV)	Luteoviridae (Polerovirus)	Yes	27	
Tomato necrotic stunt virus (ToNSV)	Potyviridae (Potyvirus)	Yes	54	
Grapevine pinot gris virus (GPGV)	Betaflexiviridae (Trichovirus)	NA	32	
Citrus yellow vein clearing virus Y1 (CYVCV-Y1)	Alphaflexiviridae (Mandarivirus)	Yes	56	
Yam bean mosaic virus (YBMV)	Potyviridae (Potyvirus)	Yes	31	
Woolly burdock yellow vein virus (WBYVV)	Unassigned	NA	10	
Sweet potato C6 virus (SPC6V)	Betaflexiviridae (Carlavirus)	Yes	19	
Andean potato mild mosaic virus (APMMV)	Tymoviridae (Tymovirus)	Yes	48	
Tomato mottle mosaic virus (ToMMV)	Virgaviridae (Tobamovirus)	Yes	53	
Citrus leprosis virus cytoplasmic type 2 (CiLV-C2)	Cilevirus	Yes	86	
Citrus vein enation virus (CVEV)	Luteoviridae (Enamovirus)	Yes	97	
Tomato matilda virus (TMaV)	Iflaviridae (Tomavirus)	Yes	59	
Cassava polero-like virus (CsPLV)	Luteoviridae (Polerovirus)	Yes	14	
Cassava new alphaflexivirus (CsNAV)	Alphaflexiviridae (Potexvirus)			
Cassava torrado-like virus (CsTLV)	Secoviridae (Torradovirus)			
Rose leaf rosette-associated virus (RLRaV)	Closteroviridae (Closterovirus)	NA	39	
DNA viruses			•	
Sweet potato badnavirus C1 (SPBV-C1)	Caulimoviridae (Badnavirus)	NA	34	
Sweet potato badnavirus C2 (SPBV-C2)	Caulimoviridae (Badnavirus)			
Grapevine red blotch-associated virus (GRBaV)	Geminiviridae	Yes	5	
Sugarcane white streak virus (SWSV)	Geminiviridae (Mastrevirus)	NA	12	
Piper yellow mottle virus (PYMoV)	Caulimoviridae (Badnavirus)	Yes	36	
Piper DNA virus 1 (PDV-1)	Caulimoviridae	NA		
Piper DNA virus 2 (PDV-2)	Caulimoviridae	NA		

#### Table 3 (Continued)

Virus	Family (genus)	Infective?	Reference
Two badnaviruses	Caulimoviridae (Badnavirus)	NA	49
One mastrevirus	Geminiviridae (Mastrevirus)		
Grapevine vein clearing virus (GVCV)	Caulimoviridae (Madnavirus)	Yes	117
Citrus chlorotic dwarf-associated virus (CCDaV)	Geminiviridae	Yes	57
Grapevine geminivirus (GVGV)	Geminiviridae	NA	91
Pagoda yellow mosaic associated virus (PYMAV)	Caulimoviridae (Badnavirus)	NA	98
Viroids	•	ŀ	-
Persimmon viroid 2 (PVd2)	Apscaviroid	Yes	41
Grapevine hammerhead viroid-like RNA (GHVd RNA)	Avsunviroidae	NA	102
Apple hammerhead viroid-like RNA (AHVd-like RNA)	Avsunviroidae	NA	119
Grapevine latent viroid (GLVd)	Pospiviroidae	Yes	119

Abbreviation: NA, not available.

A novel homology-independent metagenomics approach has been recently developed for the discovery of viroids (102). This approach (**Figure 2**) involves analyzing the sequences of the total small RNAs of the infected plants obtained by NGS with a novel computational algorithm, progressive filtering of overlapping small RNAs (PFOR). Viroid infection triggers production of viroid-derived overlapping siRNAs that cover the entire genome at high densities (11, 21, 69). However, these viroid siRNAs cannot be assembled into complete viroid genomes by conventional genome assembly algorithms such as Velvet because of the high heterogeneity of viroid populations (102). PFOR retains viroid siRNAs for genome assembly by progressively eliminating small RNAs that do not overlap and those that overlap but cannot be assembled into a direct repeat RNA, which is synthesized during the rolling-circle replication of the viroid RNA. Viroids from both of the known viroid families are readily identified and their full-length sequences assembled by PFOR from small RNAs sequenced from infected plants. The recent algorithm update significantly enhances the performance by adopting parallel programming into the filtering step, which takes up more than 90% of the running time (119).

A new viroid, Grapevine latent viroid (GLVd), was identified by the homology-independent metagenomics approach (119). GLVd was proposed as a new species of *Apscaviroid* because it contains the typical structural elements found in this group and independently infects grapevine seedlings (119). PFOR/PFOR2 also enabled the discovery of two putative viroids designated grapevine hammerhead viroid-like RNA (GHVd RNA) and apple hammerhead viroid-like RNA (AHVd RNA), neither of which exhibits sequence similarity with any of the known molecules detectable by the available algorithms. Assembly of AHVd and GHVd RNA repeats by PFOR from siRNAs, with their 21-nt/22-nt ratio characteristic of the viral siRNAs targeting plant RNA viruses known to replicate in the cytoplasm, indicates that both circular RNAs replicate via the rolling-circle mechanism. Both AHVd and GHVd RNAs also encode a biologically active hammerhead ribozyme in each polarity that is structurally conserved in viroids from the *Avsunviroidae*. Moreover, AHVd RNA was not specifically associated with any of the viruses found in apple plants by deep sequencing. Although independent infectivity has yet to be demonstrated, the available lines of evidence suggest that AHVd and GHVd RNAs may represent novel viroids.

A simple computational program known as SLS (for splitting longer reads into shorter fragments) was recently developed as part of PFOR2 to discover biologically active circular RNAs via the deep sequencing of long RNAs instead of small RNAs (119). The program (**Figure 2**) cuts the sequenced long RNAs into 21-nt virtual small RNAs of 20-nt overlap with their 5' and 3' neighboring small RNAs before PFOR2 analysis to retain only those that could be assembled into direct repeat RNAs. SLS-PFOR2 was validated by successful assembly of the full-length PSTVd genome from the total RNAs deep sequenced from the infected potato plants after rRNA depletion or RNase R treatment to enrich circular RNAs (119). The development of SLS-PFOR2 allows the discovery of viroids that infect a host species but do not trigger Dicer-dependent biogenesis of viroid siRNAs, which may lead to the identification of novel viroids.

### **CONCLUDING REMARKS**

Determination of the total nucleic acid content in a biological sample by NGS technologies provides a powerful tool for plant pathologists in the diagnosis and identification of viruses and viroids. NGS technologies will also likely transform the inspection and quarantine services required to provide a fast, accurate, and full indexing of viruses and viroids in plant samples. In contrast to the current techniques such as ELISA, PCR, and microarray, the metagenomics approaches do not require prior knowledge of the pathogens. Successful detection of diverse viruses and viroids by the metagenomics approaches has been described in plants since 2009. Available data show that among the strategies developed to enrich NGS reads specific to viruses and/or viroids, targeting the total small RNAs for deep sequencing has been the most effective to identify RNA and DNA viruses as well as viroids (25). Analyses of plant samples by NGS and homology-dependent computational algorithms have identified two new viroids and 49 new viruses from 20 known or assigned virus families in the last six years. Notably, development of the algorithm PFOR allows the discovery of viroids independent of not only the tedious purification of the naked circular RNAs but also any sequence similarity to a known viroid. Despite widespread distribution in potato, horticultural species, and fruit trees, viroids have so far not been found in many major monocot or small fruit crops, or in animals. The recent algorithm update SLS-POFR2 further expands the range of host species for viroid discovery to include those that may not produce overlapping siRNAs targeting the replicating circular RNAs.

Many challenges remain in the application of NGS technologies to pathogen discovery. First, there is a critical need for the development of new computational algorithms capable of discovering novel viruses from NGS datasets in a homology-independent manner, as illustrated by PFOR in viroid discovery. These algorithms may also help identify the origins of the large volume of unknown sequences present in any deep-sequencing project that are not homologous to any entry in GenBank. Second, development of user-friendly software interfaces such as SearchSmallRNA that are accessible to the public and require little informatics training will facilitate more widespread applications of NGS technologies to the diagnosis and identification of viruses and viroids. Third, Koch's postulates have not been fulfilled for many viruses and viroids discovered by the metagenomics approaches. However, because production of virus- and viroid-specific siRNAs reveals induction of the host immune response to an active infection, identification of viruses and viroids by small RNA sequencing also provides evidence for their replication in the host.

#### SUMMARY POINTS

1. The power of next-generation sequencing (NGS) technologies to allow rapid determination of the total nucleic acid content in a biological sample has transformed the diagnosis and identification of viruses and viroids.

- 2. All viruses and viroids identical or similar to those described previously can be identified in a plant sample by a single NGS run and homology-dependent algorithms.
- 3. A total of 49 new viruses and one new viroid have been identified by NGS and homologydependent algorithms since 2009. Twelve of these viruses may become the founding members of new virus genera or families.
- 4. Common strategies to enrich viruses and/or viroids for deep sequencing include the purification of dsRNAs, virus-like particles, or small RNAs. However, identification of RNA and DNA viruses as well as viroids in a single NGS run is possible only by sequencing total small RNAs.
- 5. The recent development of the homology-independent algorithm PFOR/PFOR2 makes it possible to discover novel viroids by deep sequencing of small RNAs and total RNAs either deleted of rRNA or enriched for circular RNAs. It is likely that PFOR will facilitate discovery of previously uncharacterized viroids in diverse plant and animal species in both agriculture and the environment.

# **DISCLOSURE STATEMENT**

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