Integrated analyses using RNA-Seq data reveal viral genomes, single nucleotide variations, the phylogenetic relationship, and recombination for Apple stem grooving virus

Yeonhwa Jo¹, Hoseong Choi¹, Sang-Min Kim², Sun-Lim Kim², Bong Choon Lee² and Won Kyong Cho¹,3*

Abstract

Background: Next-generation sequencing (NGS) provides many possibilities for plant virology research. In this study, we performed integrated analyses using plant transcriptome data for plant virus identification using Apple stem grooving virus (ASGV) as an exemplar virus. We used 15 publicly available transcriptome libraries from three different studies, two mRNA-Seq studies and a small RNA-Seq study.

Results: We de novo assembled nearly complete genomes of ASGV isolates Fuji and Cuiguan from apple and pear transcriptomes, respectively, and identified single nucleotide variations (SNVs) of ASGV within the transcriptomes. We demonstrated the application of NGS raw data to confirm viral infections in the plant transcriptomes. In addition, we compared the usability of two de novo assemblers, Trinity and Velvet, for virus identification and genome assembly. A phylogenetic tree revealed that ASGV and Citrus tatter leaf virus (CTLV) are the same virus, which was divided into two clades. Recombination analyses identified six recombination events from 21 viral genomes.

Conclusions: Taken together, our in silico analyses using NGS data provide a successful application of plant transcriptomes to reveal extensive information associated with viral genome assembly, SNVs, phylogenetic relationships, and genetic recombination.

Keywords: Apple stem grooving virus, De novo genome assembly, Recombination, RNA-Seq, Single nucleotide variation, Transcriptome

Background

Apple stem grooving virus (ASGV) is a member of the genus Capillovirus in the family Betaflexiviridae [1, 2]. ASGV has been most commonly identified from apple, European pear, Japanese pear, and Citrus trees [3]. In addition, ASGV has been identified in lily [2] and kiwi [4], and it infects several virus indicator plants, including Chenopodium, Cucumber, Nicotiana, Phaseolus, and Vigna species [4]. ASGV infection in fruit trees is usually latent without disease symptoms [5]; however, ASGV sometimes causes serious viral diseases [6]. In many cases, fruit trees are co-infected by different viruses and viroids. For instance, apple trees showing fruit deformation, leaf deformation, and mosaic, chlorosis, and rusting symptoms in India were co-infected by Apple chlorotic leaf spot virus (ACLSV), Apple mosaic virus (ApMV), ASGV, Apple stem pitting virus (ASPV), and Apple scar skin viroid (ASSVd) [7].

The viral particles of ASGV are flexuous filaments 620–680 nm long and 12 nm wide [4]. ASGV has a single-stranded (ss) positive-sense monopartite RNA
genome containing 5’ capping and a poly(A) tail at the 3’ region [2]. The genome size of ASGV is about 6,495 ~ 6,597 nucleotides (nt), and it encodes two overlapping open reading frames (ORFs), ORF1 (242 kDa) and ORF2 (36 kDa) [1, 2]. ORF1 encodes a polyprotein containing a replicase and coat protein (CP), while ORF2 encodes a movement protein (MP) that is overlapped with the replicase and CP regions [1, 2]. A previous study demonstrated that ASGV mutants with a stop codon between the replicase and CP coding regions were capable of systemic infection with decrease of pathogenicity [8]. This result revealed that expression of ASGV CP via a subgenomic RNA (sgRNA) was sufficient for viability of ASGV. Furthermore, mutational analysis revealed core promoter sequences required for the sgRNA transcription of ASGV and *Potato virus T*, which were conserved among viruses in the families *Alphaflexiviridae* and *Betaflexiviridae* [9].

Next-generation sequencing (NGS) produces huge amounts of sequencing data, which facilitate the identification of known and novel viruses and viroids in a wide range of plant species [10]. In addition, NGS can be applied in plant virus diagnostics [6, 11] and virus ecology [12]. Several types of NGS platforms—including HiSeq systems by Illumina, 454 FLX systems by Roche, and SOLiD systems by AB—have been developed [10]. Each NGS system has advantages and disadvantages [10]. The selection of proper NGS platforms is dependent on the purposes of the study. HiSeq systems produce high throughput with a relatively shorter read length, whereas 454 FLX systems generate low throughput with a relatively longer read length. For example, the identification and diagnostics of known and novel viruses can be conducted by HiSeq systems [13], and viral genome sequencing using extracted viral RNAs can be performed by 454 FLX systems [12].

Moreover, NGS systems are useful for virus–host interaction studies. For instance, sRNA-Seq has been used for virus-derived siRNAs (vsiRNAs) of ASGV from ASGV-infected samples [14]. This study showed an increase in siRNA production towards the 3’ end of ASGV and several tRNA-derived sRNAs were differentially regulated by ASGV infection. A previous study identified 149 conserved and 141 novel miRNAs of pear associated with ASGV infection and found several miRNAs in response to high temperature, which was used to reduce ASGV titers in the shoot meristem tip [15]. Pear transcriptome analysis between ASGV-infected and ASGV-free apple samples has been conducted and identified 184 up-regulated and 136 down-regulated genes in ASGV infected shoot culture as compared to ASGV-free shoot culture [5].

Several approaches to detect ASGV have been developed, such as long-distance PCR (LD PCR) to amplify the complete genome of ASGV [16], multiplex reverse transcriptase (RT)-PCR for major apple viruses [17–19] and pear viruses [20], and immunochromatographic assays by monoclonal antibodies specific for CP [21]. Moreover, using available genome sequences for ASGV, two phylogenetic groups and four recombinants of 16 ASGV isolates have been identified [22], and the molecular evolution of subgenomic RNA of ASGV has been studied [1].

Several recent studies have demonstrated that many plant transcriptomes contain viral sequences that could be applied to studies associated with virus identification and viral genome assembly [23, 24].

In this study, we conducted *in silico* analyses using publicly available transcriptome data for viral genome assembly and identification using ASGV as an exemplar virus. We showed the application of transcriptome data for the analysis of single nucleotide variations (SNVs) on the ASGV genome. Moreover, the two viral genomes obtained were successfully applied in the phylogenetic and recombination analyses of known ASGV genomes.

**Results**

**Identification and de novo assembly of ASGV genome from ASGV-infected apple mRNA transcriptome**

Of the known viruses, we selected ASGV, which mostly infects fruit trees, including apple (*Malus domestica*) and pear (*Pyrus pyrifolia*). Due to the clonal propagation of fruit trees, the possibility of virus infection is very high. We screened several apple and pear transcriptomes and selected the transcriptomes infected by ASGV for further study (data not shown). Of the several previously reported apple transcriptomes in response to ASGV infection, we selected two studies: one that performed mRNA sequencing (mRNA-Seq) [5] and one that performed sRNA-Seq [25]. Both sets of samples included ASGV-infected and ASGV-free apple plants (Additional file 1).

The first study was conducted to examine the expression profiles of apple trees infected with ASGV without any disease symptoms using mRNA-Seq [5]. Two libraries from ASGV-infected and ASGV-free shoot cultures were constructed. *We de novo* assembled transcriptomes of the two libraries using the Trinity program (Additional file 2). The 15,592 and 12,140 contigs obtained from ASGV-infected and ASGV-free shoot cultures, respectively, were blasted against a viral reference genome database. As a result, we identified 14 and 0 ASGV-associated contigs from ASGV-infected and ASGV-free samples, respectively (Table 1). Interestingly, the 14 identified ASGV-associated contigs mostly covered the complete genome of ASGV. Thus, we assembled a nearly complete ASGV genome with 6,454 nt. The newly assembled ASGV genome was referred to as...
ASGV isolate Fuji with the accession number KU500890. ASGV isolate Fuji contained two genes encoding the 241 kDa polyprotein and 36 kDa protein, respectively (Fig. 1a). The 241 kDa polyprotein is associated with viral methyltransferase, DUF1717, helicase, RNA-dependent RNA polymerase (RdRP), and the CP at the 3′ end, while the 36 kDa protein is known as a viral MP (Fig. 1a). The previous study sequenced the complete genome of ASGV (accession number KF434636) from the ASGV-infected sample by the Sanger sequencing method. To compare the ASGV genome sequences obtained by the Sanger method and de novo assembly, we aligned the two genome sequences by ClustalW. The two genome sequences were almost identical except the 3′ region, which showed many polymorphisms, indicating the presence of ASGV variants in the transcriptomes (Additional file 3).

It is well known that RNA viruses have a quasispecies nature with a high mutation rate within infected hosts. Thus, we analyzed the SNVs of ASGV in the ASGV-infected sample. We mapped raw data on the genome of ASGV isolate Fuji, and interestingly, reads were highly mapped on the regions for CP and MP (Fig. 1b). Using the SAMtools program, we identified 90 SNVs. In particular, many SNVs were identified in the 5′ and 3′ regions of the ASGV genome (Fig. 1c and Additional file 4).

In many previous studies, the assembled contigs or transcripts were frequently used to identify viruses or viroids in the host transcriptome [26]. Although the assembled contigs did not contain any viral sequences in the ASGV-free sample, it is possible that the raw sequence data contained viral sequences. The single- or paired-end mRNA sequencing by HiSeq2000 produces raw sequence data up to 101 bp in size. Therefore, the raw data can also be successfully applied to identify viral sequences in the host transcriptome data. We aligned a raw FASTQ file from the ASGV-free sample on the genome of ASGV isolate Fuji using the BWA program. As shown in Fig. 1d, 41 sequenced reads were mapped on the genome of ASGV isolate Fuji. To confirm the alignment results, we blasted the FASTA converted sequences against the ASGV genome. We found that 30 sequenced reads were aligned along the ASGV genome (Fig. 1e). The mapping and blast results using sequenced raw data clearly demonstrated the presence of ASGV viral sequences in the ASGV-free sample.

### Table 1: Blast results to identify ASGV-associated contigs from ASGV-infected apple mRNA-Seq data

| Query id | Subject Ids | Identity (%) | Alignment length | Mismatches | Gap opens | Query start | Query end | Subject start | Subject end | Evalue | Bit score |
|----------|-------------|--------------|------------------|------------|-----------|-------------|-----------|---------------|-------------|--------|-----------|
| TR9237   | NC_001749.2 | 83.29        | 1532             | 253        | 3         | 3           | 1533      | 12            | 1541        | 0      | 1408      |
| TR10325  | NC_001749.2 | 97.15        | 492              | 14         | 0         | 1           | 492       | 515           | 24          | 0      | 832       |
| TR12482  | NC_001749.2 | 98.1         | 473              | 9          | 0         | 0           | 473       | 945           | 473         | 0      | 824       |
| TR1643   | NC_001749.2 | 97.71        | 1356             | 31         | 0         | 1           | 1356      | 1111          | 2466        | 0      | 2333      |
| TR3149   | NC_001749.2 | 98.28        | 232              | 4          | 0         | 1           | 232       | 1157          | 926         | 9.00E-113 | 407       |
| TR1643   | NC_001749.2 | 98.3         | 766              | 13         | 0         | 1           | 766       | 1701          | 2466        | 0      | 1343      |
| TR9237   | NC_001749.2 | 83.74        | 4705             | 741        | 23        | 1743        | 6435      | 1752          | 6444        | 0      | 4429      |
| TR408    | NC_001749.2 | 97.26        | 2225             | 61         | 0         | 1           | 2225      | 2440          | 4664        | 0      | 3771      |
| TR8087   | NC_001749.2 | 78.45        | 2237             | 452        | 30        | 1           | 2222      | 4660          | 2439        | 0      | 1434      |
| TR2      | NC_001749.2 | 83.26        | 723              | 119        | 2         | 1           | 722       | 5349          | 4628        | 0      | 664       |
| TR9341   | NC_001749.2 | 85.78        | 232              | 33         | 0         | 1           | 232       | 5389          | 5620        | 2.00E-64 | 246       |
| TR5938   | NC_001749.2 | 98.29        | 234              | 4          | 0         | 1           | 234       | 5647          | 5880        | 7.00E-114 | 411       |
| TR12218  | NC_001749.2 | 97.46        | 1065             | 27         | 0         | 1           | 1065      | 5683          | 4619        | 0      | 1818      |
| TR9237   | NC_001749.2 | 95.6         | 432              | 19         | 0         | 1           | 432       | 6013          | 6444        | 0      | 693       |

The MEGABLAST results with the best hits were listed. Subject IDs indicates the identity number of an individual assembled contig. Subject ids indicate the best matched viral genome.

Identification and de novo genome assembly of ASGV from ASGV-infected sRNA transcriptomes

Previous studies have demonstrated that both mRNA-Seq and sRNA-Seq are useful for virus identification [26, 27]. To validate the utility of sRNA-Seq data for the de novo assembly of the ASGV genome, we used sRNA data from a previous study that conducted apple leaf sRNA sequencing using samples from the apple cultivar Golden Delicious (GD) [25]. The data were composed of 12 libraries from ASGV-infected and ASGV-free samples (Additional file 1). Moreover, two different types of libraries were generated according to size fraction [25].

The six libraries from ASGV-infected samples were subjected to de novo transcriptome assembly using the Trinity program followed by a blast search to identify
viral contigs. However, we obtained only 209 contigs with 425 bp of N50 value, and no ASGV-associated contigs were identified by the blast search. It seems that the Trinity program was not optimal for de novo transcriptome assembly using sRNA data. Thus, we used the Velvet program, which is well known for sRNA transcriptome assembly [28]. The Velvet assembler assembled a total of 28,690 contigs, which were blasted against a plant viral database identifying 30 contigs associated with ASGV (Additional file 5). We mapped the identified ASGV-associated contigs on the reference genome of ASGV (NC_001749.2). The 30 contigs covered about 30 % of the ASGV genome and displayed many gaps along the genome. In order to confirm that sRNA reads cannot cover the complete genome of ASGV, we mapped sRNA raw data on the ASGV reference genome (Fig. 1f). We found that several regions of ASGV were not mapped by sRNA sequences. Based on the mapping results, we also identified 69 SNVs from sRNA data by the SAM Toolkit (Fig. 1g and Additional file 6).

Identification and de novo genome assembly of ASGV from pear mRNA transcriptome
We used pear transcriptome data from a previous study that did not include any information on the virus infection. The transcriptome data (accession number SRX532394) was derived from a mixture of nine different fruit developmental stages of the Pyrus pyrifolia cultivar Cuiguan. The transcriptome was initially assembled by SOAPdenovo2; however, we performed de novo transcriptome assembly again using the Trinity program. A total of 33,858 transcripts were assembled (Additional file 7). Assembled sequences were subjected to a blast search against a viral reference database. We found nine contigs associated with ASGV ranging from 222 bp to 6,513 bp (Additional file 8). Of the nine contigs associated with ASGV, a single contig with 6,513 bp was a nearly complete genome sequence of ASGV. After removing poly(A) tails from the contig, we obtained a sequence with 6,488 nt referred to as ASGV isolate Cuiguan (accession number: KR185346).

In order to identify additional viruses infecting pears, all raw data converted to FASTA format were blasted against the viral reference database. Interestingly, we found many additional viruses infecting pears (Table 2). Of 11 viruses, six viruses including Apricot latent virus, Grapevine fleck virus, Rupesstris stem pitting associated virus-1, ACLSV, Grapevine Pinot gris virus, and Zucchini yellow mosaic virus with very small numbers of reads were identified. Based on our knowledge, it seemed that
the six identified viruses were not likely viruses infecting pears. They might have been sequences that were partially homologous to host genes or other viral genomes. In addition, associations of the six viruses with pears have not been reported. The sequence reads associated with *Potato leafroll virus* were identified as sequences from the host. Of four identified viruses infecting pears, ASGV was dominant followed by *Prunus virus T* (PrVT), *Apple green crinkle associated virus* (AGCAV), and ASPV.

We examined SNVs for ASGV isolate Cuiguan within the pear transcriptome after alignment of the raw data on the ASGV isolate Cuiguan (Fig. 1h). We found 28 SNVs in the whole ASGV genome (Additional file 9). Interestingly, SNVs were only identified in the replicase region containing helicase, RdRP (Fig. 1i). However, SNVs were not detected in the region of MP or CP. Of the identified nucleotide changes, C to T (10 SNVs) was dominant followed by T to C (6 SNVs), G to A (6 SNVs), and A to G (6 SNVs).

### Comparison of de novo sequence assemblers for viral genome assembly

In this study, we used two different programs for *de novo* transcriptome assembly, Trinity and Velvet. To find the advantages and disadvantages of the two programs, we compared the number of total contigs and sizes of viral contigs. We first compared the number of contigs of two different mRNA libraries assembled by the two programs (Table 3). The number of contigs assembled by Velvet was more than 5.7 to 23.8 times that assembled by Trinity (Table 3). In addition, the number of identified viral contigs by Velvet was more than four times that identified by Trinity. However, the portion of viral contigs in the transcriptome assembled by Trinity was higher than that assembled by Velvet (Table 3). Moreover, the viral contigs assembled by Trinity were much bigger than those assembled by Velvet (Figs. 2a–2d). As a result, the Velvet assembler assembled large numbers of contigs with relatively short lengths, while the Trinity assembler assembled a few contigs with relatively long lengths. For example, in the transcriptome from the SRR1089477, the longest contigs assembled by Trinity were 4,705 bp, while the longest contigs assembled by Velvet were 646 bp (Figs. 2a and 2b). Furthermore, the Velvet assembler assembled seven contigs associated with ASPV and AGCAV that were not assembled by Trinity (Fig. 2c and 2d).

### Phylogenetic analysis of ASGV isolates

Several previous studies have reported that ASGV is closely related to *citrus tatter leaf virus* (CTLV) [29]. To confirm previous results, we blast identified two ASGV genomes in this study against the NCBI nucleotide database. The blast results confirmed that CTLV is closely grouped with ASGV isolates in the genus *Capillovirus*. From the GenBank, we retrieved all ASGV-associated sequences as well as CTLV-associated sequences. After removing partial sequences, we collected a total of 21 genomes of ASGV and CTLV isolates, including two ASGV isolates in this study. The host ranges of CTLV were mostly from *Citrus* species as well as *Lilium* species (Additional file 10). Pear black necrotic leaf spot virus (PBNSLV) isolated from pear was an isolate of ASGV according to the annotation in GenBank [30]. Most ASGV isolates were isolated from apple and pear, and some isolates, such as ASGV isolates Matsuco and Li-23, were identified from *Citrus tamurana* and Lily, respectively. To reveal phylogenetic relationships, we aligned genome sequences displaying high sequence similarity of ASGV and CTLV. Sequence alignment and a phylogenetic tree using genome sequences of ASGV and CTLV identified two largely divided clades (Fig. 2e). The first clade contained 19 genomes, while

### Table 2 Identification of viruses from raw mRNA-Seq data of pear transcriptome by BLAST search

| Name of virus                         | Accession no. | Size of genome (bp) | Read count |
|---------------------------------------|---------------|---------------------|------------|
| Apple stem grooving virus             | NC_001749.2   | 6,495               | 4274       |
| Potato leafroll virus                 | NC_001747.1   | 5,987               | 66         |
| Prunus virus T isolate Aze239         | NC_024686.1   | 6,835               | 52         |
| Apple green crinkle associated virus  | NC_018714.1   | 9,266               | 39         |
| Apple stem pitting virus              | NC_003462.2   | 9,332               | 17         |
| Apricot latent virus                  | NC_014821.1   | 9,311               | 4          |
| Grapevine fleck virus                | NC_003347.1   | 7,564               | 4          |
| Rupestris stem pitting associated virus-1 | NC_001948.1 | 8,744               | 2          |
| Apple chlorotic leaf spot virus       | NC_001409.1   | 7,555               | 1          |
| Grapevine Pinot gris virus           | NC_015782.1   | 7,275               | 1          |

### Table 3 Comparison of de novo transcriptome assemblers for assembly of viral contigs

|                          | Trinity (SRR1089477) | Velvet (SRR1089477) | Trinity (SRR1269627) | Velvet (SRR1269627) |
|--------------------------|----------------------|---------------------|----------------------|---------------------|
| No. of total contigs     | 33,858               | 19,519              | 15,592               | 37,174              |
| No. of viral contigs     | 14                   | 57                  | 9                    | 37                  |
| % of viral contigs       | 0.04                 | 0.03                | 0.06                 | 0.01                |

SRR1089477 and SRR1269627 were data derived from pear and apple samples, respectively.
the second clade included only PBNLSV and ASGV isolate KFP. The first clade could be further divided into three groups. Group A consisted of six CTLV isolates and a single ASGV isolate, while Group B contained only ASGV isolates. Group C was the largest, including seven ASGV isolates and two CTLV isolates.

Recombination analysis for 21 ASGV isolates
We analyzed recombination events among 21 ASGV isolates. The aligned genome sequences were subjected to the RDP4 program, which includes nine different algorithms for recombination detection. The RDP4 program detected a total of 25 recombination events. Of them, we selected six recombination events that were
supported by at least five recombination algorithms (Fig. 3a and Table 4). For example, PBNLSV contains two recombination sequences from ASGV isolate Li-23. Three isolates—ASGV isolate CHN, ASGV isolate HH, and CTLV isolate MTH—include recombination sequences from ASGV isolate Fuji in the 5′ region (Fig. 3a). Recombination Events 1 and 2 were supported by seven algorithms. The major parent of the recombinant sequence for ASGV isolate YTG was ASGV isolate Fuji (Fig. 3b). The major parent of the recombinant sequences for the three isolates—ASGV isolate HH, ASGV isolate CHN, and CTLV isolate MTH—were ASGV isolate Li-23 and CTLV isolate Lily (Fig. 3c).

Discussion
The rapid development of NGS is enabling virologists to find viruses from numerous species [10, 31]. NGS-based approaches have identified not only known viruses but also novel viruses [32, 33]. In fact, many horticultural plants are frequently infected by viruses and viroids [11, 24, 34, 35]. In particular, fruit trees usually propagated by grafting and cuttage are reservoirs of...
various plant viruses and viroids [24, 34]. In addition, the big data produced by NGS techniques has prompted virus identification in silico [23, 24]. Here, we discussed the library types, sequencing methods, and de novo assembler for virus identification and viral genome assembly.

The majority of plant viruses are composed of RNA genomes, and DNA viruses also replicate via an RNA intermediate [36]. Thus, RNA-based transcriptome libraries are preferable to DNA-based genome libraries for virus identification. In the current study, we used published plant transcriptome data. To enrich viral RNAs, ribosome-deleted libraries are usually prepared using extracted total RNAs from virus-infected samples [37]. However, we demonstrated that the mRNA libraries using oligo d(T) were successfully applied for virus identification. Of course, RNA viruses with poly(A) tails such as ASGV are also easily identified by mRNA libraries. Similarly, several polyadenylated RNA viruses have been identified from sweet potato transcriptomes [38]. Several recent studies have also demonstrated that ribosome-deleted RNA libraries as well as plant mRNA libraries are suitable for the identification of viruses without poly(A) tails or viroids [23, 24, 39]. Therefore, it might be ideal to use ribosome-deleted libraries for studies only focused on viruses. In the case of studies of both viruses and host plants, mRNA libraries can be usefully applied [24].

In this study, we used data from two different library types, including mRNA and sRNA libraries that were single-end sequenced by the HiSeq2000 system. According to many recent studies, viral genomes have been de novo assembled from mRNA as well as sRNA data [24, 33]. In our study, we assembled nearly complete genomes of two ASGV isolates from the mRNA data; however, the sRNA data could cover only 30% of the ASGV genome. We compared the numbers of sequencing reads between the mRNA and sRNA data. However, the numbers of sequence reads between mRNA and sRNA were very similar, indicating that the sequencing amount is not an important factor for viral genome assembly. In fact, when the number of sequencing reads is increased, the number of viral-associated reads is increased. Therefore, the quantity of the sequenced data might play an important role in de novo genome assembly. The number of pear (3,524,264,028 bases) transcriptomes was about ten times that of apple transcriptomes (364,090,972 bases). The sequence reads associated with ASGV were 7,668 viral reads out of 7,430,428 reads for the apple sample and 4,274 viral reads out of 97,896,223 reads for the pear sample. Although the number of total sequence reads in the apple sample was much smaller than that in the pear sample, the number of sequence reads associated with ASGV was about 1.8 times higher. This result suggests the amount of viral replication in the host might be also an important factor in de novo viral genome assembly. The portion of viral nucleic acids in the sample infected by virus is often low suggesting enrichment of virions prior to NGS [40]. For example, purification of double-stranded (ds) RNAs from the Prunus species followed by 454 pyrosequencing enabled to assemble four complete genomes of Asian prunus virus 1 (APV1),

| Event Number | In alignment Begin | End | In recombinant sequence Begin | End | Relative to CTLV_Lily Begin | End | Recombinant sequence(s) | Minor parental sequence(s) | Major parental sequence(s) |
|--------------|------------------|-----|-------------------------------|-----|--------------------------|-----|-------------------------|----------------------------|---------------------------|
| 1            | 6492             | 1924| 6487                          | 1924| 6488                      | 1925| ASGV_YTG                | Unknown (ASGV_HH), Unknown (ASGV_CHN) | ASGV_Fuji                  |
| 2            | 6492             | 2488| 6488                          | 2487| 6488                      | 2487| ASGV_HH, ASGV_CHN, CTLV_MTH | ASGV_Fuji, CTLV_MTH         | ASGV_Li-23, CTLV_Lily     |
| 3            | 4112             | 4550| 4110                          | 4550| 4110                      | 4550| PBNLSV                  | ASGV_Li-23, CTLV_Lily      | ASGV_KFP                   |
| 4            | 5844             | 6221| 5842                          | 6221| 5842                      | 6221| PBNLSV                  | ASGV_Li-23, CTLV_Lily      | ASGV_KFP                   |
| 5            | 5819             | 6412a| 5816                          | 6408a| 5817                      | 6409a| ASGV_YTG                | ASGV_HH, ASGV_CHN          | ASGV_P-209, ASGV_T47      |
| 6            | 4412             | 4946| 4409                          | 4943| 4410                      | 4944| CTLV_LCd-NA-1           | CTLV_SO, CTLV_Kumquat1, CTLV_XHC | ASGV_Matsuco               |

Minor Parent: Parent contributing smaller fraction of sequence, Major Parent: Parent contributing larger fraction of sequence, Unknown: Only one parent and a recombinant need be in the alignment for a recombinant event to be detectable. The sequence listed as unknown was used to infer the existence of a missing parental sequence, NS: No significant P-value was recorded for this recombinant event using this method.

The actual breakpoint position is undetermined (it was most likely overwritten by a subsequent recombination event).
APV2, and APV3 [41]. This study demonstrated successful application of dsRNA purification for virus genome assembly using NGS technique.

In the case of sRNA, two different types were prepared based on size fraction [25]. The libraries without size fraction contain a large number of ASGV-associated reads, but the libraries with size fraction contain very few reads associated with ASGV. Of course, the sRNA libraries were targeted for the identification of viral sRNAs. We suppose that the small number of sRNAs might be related to the ability of the RNA silencing machinery in the host. In any case, a sufficient number of viral-associated reads is necessary for viral de novo genome assembly.

In addition, sequencing methods are important for virus identification and viral genome assembly. In this study, all transcriptome data were single-end sequenced by HiSeq2000. As compared to single-end sequencing, paired-end sequencing provides sequences from both ends of a fragment and generates high-quality and alignable sequence data. The advantages of paired-end sequencing have been previously reported [42]. Thus, paired-end sequencing was far superior for the identification and genome assembly of the target virus.

For virus identification, assembled contigs are frequently used. Therefore, the choice of de novo assembler affects the quality and quantity of virus identification. For instance, mRNA data were very efficiently assembled by Trinity; however, few and low-quality contigs were assembled from the sRNA data by Trinity. Our comparative studies between the two de novo assemblers suggest Trinity and Velvet for de novo assembly of mRNA data and sRNA data, respectively. The obtained viral contigs assembled by Trinity from mRNA data were low in number but long in length, while the viral contigs assembled by Velvet were high in number but short in length. For the de novo assembly of a target virus with high-quality mRNA data, Trinity is ideal. Velvet cannot assemble a nearly complete viral genome, but it assembled many contigs, which enabled us to identify additional viruses, for example, viruses in the pear transcriptomes. Recently, several programs IVA, PRICE, and VICUNA for de novo assembly of RNA virus genome have been developed [43–45]. The choice of optimal de novo assembler might be dependent on researchers and purposes.

It is well known that RNA viruses have a quasispecies nature within the host [46]. However, to date, most studies have shown the variants and mutation rates of target viruses using cloning-based Sanger sequencing methods [47]. In this study, we successfully demonstrated the usefulness of plant transcriptome data for revealing the SNVs of ASGV. In fact, it is quite difficult to find virus variants using transcriptome data, while cloning-based approaches require a RT-PCR amplification procedure to amplify full-length viral genomes. Practically, the amplification of full-length viral genomes is not easy even though plant viruses are relatively small. We showed the presence of ASGV variants in the transcriptome by comparing the ASGV genome from the cultivar Fuji derived from the Sanger-sequencing method and de novo assembly. We did not judge which ASGV genome was the dominant ASGV genome; however, it is highly likely that the de novo-assembled ASGV was a consensus genome sequence of ASGV. The mutation rates of identified ASGV genomes were varied: 1.38 % (90 SNVs) in the Fuji, 1 % (69 SNVs) in the GD, and 0.43 % (28 SNVs) in the Cuiguan. We suppose that several factors—including hosts, viral replication, and environmental cues—might affect the mutation rates. The association of viral mutation rate with other factors will be an interesting subject for further study [48].

**Conclusions**

Taken together, our study showed the successful application of plant transcriptome data for virus identification, viral genome assembly, and viral mutation rates. In addition, we discussed several factors, including library preparation, NGS systems, de novo assemblers, and sample conditions for virus identification and genome assembly.

### Table 4

Recombination analysis of 21 ASGV genomes using RDP4 program (Continued)

| Event Number | RDP     | GENECONV | Bootscan | Maxchi | Chimaera | SiScan | PhyPro | LARD | 3Seq |
|--------------|---------|----------|----------|--------|----------|--------|--------|------|------|
| 1            | 1.30E-31| 3.39E-09 | 8.78E-30 | 1.16E-10| 9.12E-16 | 9.16E-27| NS     | NS   | 3.17E-17|
| 2            | 3.40E-19| 3.89E-04 | 1.47E-16 | 1.29E-16| 1.83E-10 | 1.06E-27| NS     | NS   | 1.48E-13|
| 3            | 1.20E-12| 2.22E-08 | 8.19E-11 | 2.20E-05| 2.75E-05 | 1.41E-10| NS     | NS   | NS   |
| 4            | 6.90E-07| 1.12E-08 | 1.61E-07 | 6.45E-04| 6.44E-04 | 1.30E-06| NS     | NS   | NS   |
| 5            | 2.42E-08| 2.14E-03 | 1.58E-09 | 2.89E-03| 1.65E-02 | 1.97E-07| NS     | NS   | NS   |
| 6            | 1.20E-02| 2.91E-04 | 1.01E-02 | 4.02E-04| 5.76E-03 | 4.04E-03| NS     | NS   | NS   |
Methods

Plant materials
Detailed information for plant materials can be found in the previous studies [5, 25]. In brief, RNA-Seq data were derived from three different plant materials including *Malus x domestica* cultivar Fuji (SRP034943), *M. x domestica* cv. Golden Delicious seedlings, grafted onto MM.109 rootstocks (SRP035543), and *Pyrus pyrifolia* cultivar Cuiguan (SRP041640).

Raw data processing and de novo transcriptome assembly
In this study, we used RNA-Seq data from three different projects. The first study employed mRNA-Seq data composed of two libraries derived from ASGV-infected and ASGV-free apple samples [5]. The second study employed sRNA-Seq data composed of 12 libraries derived from ASGV-infected and ASGV-free apple samples [25]. The third study employed mRNA-Seq data composed of a single library from pear samples without information on the ASGV infection. Information on the plant materials and library preparation were described in detail in the previous studies. Detailed information on the raw data can be found in Additional file 1: Table S1. All data were single-end sequenced by HiSeq2000. All bioinformatics analyses were performed in the Linux (Linux Mint version 17) installed workstation (four 16-core CPUs and 256 GB ram). We downloaded raw data for 15 libraries with respective accession numbers from the sequence read archive (SRA) database using the SRA toolkit [49]. The raw SRA data were converted to FASTQ files using the SRA toolkit. For the de novo assembly of transcriptomes, we used two different programs, Trinity version 2.0.6 and Velvet version 1.2.10 [28, 50]. De novo transcriptome assembly was performed according to the manuals provided by developers with default parameters.

Sequence mapping and identification of viral contigs
For sequence alignment on the reference viral genome, we used Burrows-Wheeler Aligner (BWA) software with default parameters [51]. Standalone BLAST version 2.1.19 was installed in the Linux system. To identify viral sequences in the assembled contigs, we used MEGABLAST, which is optimized for highly similar sequences against complete reference sequences for viruses and viroids (http://www.ncbi.nlm.nih.gov/genome/viruses/) with Evalue 1e-5 as a cutoff. In addition, all raw data were converted to FASTA files using the SRA toolkit and subjected to a MEGABLAST search against the viral reference database with Evalue 1e-5 as a cutoff.

De novo assembly of ASGV genomes
The viral contigs identified by the BLAST search were retrieved by the BLASTCMD program in the standalone BLAST system. To assemble ASGV genomes, the identified viral contigs were aligned against the ASGV reference genome (NC_001749.2) using ClustalW implemented in the MEGA6 program [52]. The nearly complete genome of ASGV was manually obtained. The poly(A) tail at the 3′ end of ASGV was removed. We obtained nearly complete genomes for ASGV isolate Fuji (accession number KU500890) and ASGV isolate Cuiguan (accession number KR185346) from apple and pear transcriptomes. In the case of ASGV isolate GD, the obtained contigs covered only 30% of the ASGV complete genome. Therefore, ASGV genome isolate GD was not obtained by the in silico approach.

Analysis of SNVs in transcriptomes
In order to analyze SNVs of ASGV genomes, the raw data were aligned on each identified viral genome using the BWA program with default parameters. In the case of ASGV isolate Fuji and ASGV isolate Cuiguan, the de novo-assembled genomes were used. For ASGV isolate GD, the ASGV reference genome sequence was used for alignment. The aligned SAM files by BWA were converted into BAM files by SAMtools [53]. For SNV calling, we sorted the BAM files and then generated the VCF file format using mpileup function of SAMtools [54]. BCFtools implemented in SAMtools was finally used to call SNVs. The positions of identified SNVs on the ASGV genome were visualized by the Tablet program [55].

Phylogenetic and recombination analyses of ASGV genomes
To retrieve the ASGV genome sequences, we first retrieved all sequences related to ASGV from the nucleotide database in GenBank (http://www.ncbi.nlm.nih.gov/genbank/). After eliminating partial sequences, only complete or nearly complete genome sequences for ASGV and CTLV isolates were identified. A total of 21 genome sequences including two isolates in this study were aligned by the ClustalW program with default parameters. After alignment, we deleted unnecessary sequences and poly(A) tails at the 5′ and 3′ regions, respectively. The manually edited aligned sequences were subjected to the construction of a phylogenetic tree using the MEGA6 program. The phylogenetic tree was constructed by the neighbor-joining method with 1,000 bootstrap replicates and Kimura 2-parameter distance. We used Recombination Detection Program (RDP) version 4.66 [31]. To identify recombinants in the 21 ASGV genomes, the sequences aligned by ClustalW were exported into MEGA file format using the MEGA6 program. We searched recombination events by nine different algorithms in the RDP4 program, and only recombination events supported by at least five algorithms were finally identified.
Additional files

**Additional file 1**: Detailed information on RNA-Seq data used in this study. (XLSX 10 kb)

**Additional file 2**: Summary of de novo transcriptome assembly for ASGV-infected and ASGV-free apple samples. We assembled raw data from two different libraries using the Trinity program. The statistics of assembled contigs were calculated by TrinityStats.pl in the Trinity program. (XLSX 8 kb)

**Additional file 3**: Comparison of de novo-assembled genome and Sanger-sequenced genome for ASGV isolate Cuiguan. Genome sequences of ASGV isolate Cuiguan obtained from de novo assembly (KU500890) and Sanger sequencing (KF434636) were compared. The regions for RdRP were highly conserved between the two sequences, and the CP region showed SNVs indicated by red-colored characters. (TIF 782 kb)

**Additional file 4**: SNVs of ASGV isolate Fuji in ASGV-infected sample. (XLSX 17 kb)

**Additional file 5**: Blast result to identify ASGV-associated contigs assembled from ASGV-infected sRNA data. (XLSX 10 kb)

**Additional file 6**: SNVs of ASGV isolate GD in ASGV-infected sample. (XLSX 17 kb)

**Additional file 7**: Summary of de novo transcriptome assembly from the pear mRNA data. (XLSX 7 kb)

**Additional file 8**: Blast result to identify ASGV-associated contigs from ASGV-infected pear mRNA-Seq data. (XLSX 8 kb)

**Additional file 9**: SNVs of ASGV isolate Cuiguan in ASGV-infected sample. (XLSX 13 kb)

**Additional file 10**: Detailed information of complete genome sequences for ASGV and CTLV isolates used for phylogenetic and recombination analyses. (XLSX 10 kb)

Acknowledgement

This work is dedicated to the memory of my father, Tae Jin Cho (1946–2015).

Funding

This work was carried out with the support of the “Cooperative Research Program for Agriculture Science & Technology Development (Project No. PJ01186102)” conducted by the Rural Development Administration, Republic of Korea.

Availability of data and materials

Raw sequencing data used in this study are available with following accession numbers in SRA database (SRX525152, SRX525150, SRX39610, SRX39601, SRX39598, SRX39592, SRX39595, SRX39484, SRX393610, SRX393601, SRX393598, SRX393592, SRX393584, SRX393484, and SRX393850). The analyzed data associated with ASGV and supporting information are available in additional files. The nearly complete genome sequences for ASGV isolate Fuji (accession number KU500890) and ASGV isolate Cuiguan (accession number KR185346) from apple and pear transcriptomes were deposited in GenBank with respective accession number.

Authors’ contributions

WKC and YJ designed the research; YJ, HC, SMK, SLK, and BCL performed the research; YJ, HC, SMK, SLK, BCL, and WKC analysed the data; and YJ, HC, SMK, SLK, BCL, and WKC wrote the paper. All authors read and approved the final manuscript.

Competing interests

The authors declare that they have no competing interest.

Consent for publication

Not applicable.

Ethics approval and consent to participate

This study did not include the use of any animals, human or otherwise, so did not require ethical approval.

Author details

1Department of Agricultural Biotechnology, College of Agriculture and Life Sciences, Seoul National University, Seoul 151-921, Republic of Korea. 2Crop Foundation Division, National Institute of Crop Science, RDA, Wanju 53565, South Korea. 3The Taejin Genome Institute, Gadam-gil 61, Hoeongseong 25299, Republic of Korea.

Received: 28 April 2016 Accepted: 3 August 2016
Published online: 09 August 2016

References

1. Liebenberg A, Moursy B, Sabath N, Hell R, Kappis A, Jarausch W, et al. Molecular evolution of the genomic RNA of Apple stem growing Capillivirus. J Mol Evol. 2012;75:92–101.
2. Yoshikawa N, Sasaki E, Kato M, Takahashi T. The nucleotide sequence of apple stem growing capilloivirus genome. Virology. 1992;191:98–105.
3. Magome H, Yoshikawa N, Takahashi T, To T, Miyakawa T. Molecular variability of the genomes of capilloviruses from apple, Japanese pear, European pear, and citrus trees. Phytopathology. 1997;87:389–96.
4. Clover G, Pearson M, Elliott D, Tang Z, Smales T, Alexander B. Characterization of a strain of Apple stem growing virus in Actinidia chinensis from China. Plant Pathol. 2003;52:371–8.
5. Chen S, Ye T, Hao L, Chen H, Wang S, Fan Z, et al. Infection of apple by apple stem growing virus leads to extensive alterations in gene expression patterns but no disease symptoms. PLoS One. 2014;9:e95239.
6. Massart S, Olmos A, Jijakli H, Candesre T. Current impact and future directions of high throughput sequencing in plant virus diagnostics. Virus Res. 2014;188:90–6.
7. Kumar S, Singh RM, Ram R, Badyal J, Hallan V, Zaidi A, et al. Determination of major viral and sub viral pathogens incidence in apple orchards in Himachal Pradesh. Indian J Virol. 2012;23:75–9.
8. Hirata H, Yamaji Y, Komatsu K, Kagiwada S, Oshima K, Okano Y, et al. Pseudo-polyprotein translated from the full-length ORF1 of capilloivirus is important for pathogenicity, but a truncated ORF1 protein without variable and CP regions is sufficient for replication. Virus Res. 2010;152:1–9.
9. Komatsu K, Hirata H, Fukagawa T, Yamaji Y, Okano Y, Ishikawa K, et al. Infection of capilloviruses requires subgenomic RNAs whose transcription is controlled by promoter-like sequences conserved among flexiviruses. Viruses. 2012;167:8–15.
10. Barba M, Czonsek H, Hadidi A. Historical perspective, development and applications of next-generation sequencing in plant virology. Viruses. 2014;6:106–36.
11. Wu Q, Ding S, Zhang Y, Zhu J. Identification of viruses and viroids by Next-Generation Sequencing and homology dependent and homology independent algorithms. Annu Rev Phytopathol. 2015;53:1–20.
12. Roossinck MJ, Saha P, Wiley GB, Quan J, White JD, Lai H, et al. Ecogenomics: using massively parallel pyrosequencing to understand virus ecology. Mol Ecol. 2010;19:81–87.
13. Kehoe MA, Couatts BA, Buichell BJ, Jones RA. Plant virology and next-generation sequencing: experiences with a Potyvirus. PLoS One. 2014;9:e104580.
14. Visser M, Maree HJ, Rees DJ, Burger JT. High-throughput sequencing reveals small RNAs involved in ASGV infection. BMC Genomics. 2014;15:568.
15. Liu J, Zhang X, Zhang F, Hong N, Wang G, Wang A, et al. Identification and characterization of microRNAs from in vitro-grown pear shoots infected with Apple stem grooving virus in response to high temperature using small RNA sequencing. BMC Genomics. 2015;16:945.
16. Dhir S, Wala Y, Zaidi A, Hallan V. A simplified strategy for studying the etiology of viral diseases: Apple stem grooving virus as a case study. J Virol Methods. 2015;213:106–10.
17. Kumar S, Singh L, Ram R, Zaidi AA, Hallan V. Simultaneous detection of major pome fruit viruses and a viroid. Indian J Microbiol. 2014;54:203–6.
18. Dhir S, Wala Y, Zaidi A, Hallan V. Simultaneous detection of major pome fruit viruses by one-tube pentaplex RT-PCR. J Virol Methods. 2015;213:106–10.
19. Hassan M, Myrta A, Polak J. Simultaneous detection and identification of four pome fruit viruses by one-tube multiplex PCR. J Virol Methods. 2014;205:23–9.
21. Kusano N, Iwamizwa T, Narahara K, Tanaka M. Production of monoclonal antibodies specific for the recombinant viral coat protein of Apple stem grooving virus-citrus isolate and their application for a simple, rapid diagnosis by an immunochromatographic assay. J. Virol. Methods. 2014;195:86–91.

22. Chen H, Chen S, Li Y, Ye T, Hao L, Fan Z, et al. Phylogenetic analysis and recombination events in full genome sequences of Apple stem grooving virus. Acta Virolog. 2013;58:309–16.

23. Jo Y, Choi H, Yoon J-Y, Choi S-K, Cho WK. In silicon identification of Bell pepper endomavirus from pepper transcripts and their phylogenetic and recombination analyses. Gene. 2016;575:712–7.

24. Jo Y, Choi H, Cho JK, Yoon J-Y, Choi S-K, Cho WK. In silicon approach to reveal viral populations in grapevine cultivar Tannat using transcriptome data. Sci Rep. 2015;5:15841.

25. Visser V, Van der Walt AP, Maree HJ, Rees DJS, Burger JT. Extending the sRNAome of apple by next-generation sequencing. PLoS One. 2014;9:e95782.

26. Li R, Gao S, Hernandez AG, Wechter WP, Fei Z, Ling K-S. Deep sequencing of small RNAs in tomato for virus and viroid identification and strain differentiation. PLoS One. 2012;7:e37127.

27. Seguin J, Rajeswaran R, Malpica-Lopez N, Martin RR, Kaschkau K, Dolja VV, et al. De novo reconstruction of consensus master genomes of plant RNA and DNA viruses from sRNAs. PLoS One. 2014;9:e88513.

28. Zerbino DR, Birney E. Velvet: algorithms for de novo short read assembly using de Brujin graphs. Genome Res. 2008;18:821–9.

29. Yoshikawa N, Imazumi M, Takahashi T, Inouye N. Studying similarities between the nucleotide sequence and genome organization of citrus tatter leaf and Apple stem grooving capilloviruses. J Gen Virol. 1993;74:2743–8.

30. Shim H, Min Y, Hong S, Kwon M, Kim D, Kim H, et al. Nucleotide sequences of nucleocapsid genes from four isolates of Asian citrus psyllid with significant diversity. J Med Virol. 2004;73:274–85.

31. Roossinck MJ, Martin DP, Roumagnac P. Plant virus metagenomics: Advances in virus discovery. Phytopathology. 2015;105:716–27.

32. Al Rwahnih M, Daubert S, Golino D, Islas CM, Rowhani A. Comparison of next generation sequencing versus biological indexing for the optimal detection of viral pathogens in Grapevine. Phytopathology. 2015;105:758–63.

33. Kreuze JF, Perez A, Untiveros M, Quispe D, Fuentes S, Barker I, et al. Complete viral genome sequence and discovery of novel viruses by deep sequencing of small RNAs: a generic method for diagnosis, discovery and sequencing of viruses. Virology. 2009;388:1–7.

34. Pallas V, Aparicio F, Herranz M, Arnaiz K, Sanchez-Pina M, Myrta A, et al. ILLaviruses of Prunus spp.: A continued concern for fruit trees. Phytopathology. 2012;102:1108–20.

35. Koh KW, Lu H-C, Chan M-T. Virus resistance in orchids. Plant Sci. 2014;228:26–38.

36. SCHOLTHOF KBG, Adkins S, Czosnek H, Palukaitis P, Jacquot E, Hohn T, et al. Virophage WRV is a gypsy-like retrotransposon with rubella-like antigenic determinants. Proc Natl Acad Sci U S A. 2008;105:14477–82.

37. Marston DA, McElhinney LM, Ellis RJ, Horton DL, Wise EL, Leech SL, et al. Next generation sequencing of viral RNA genomes. BMC Genomics. 2013;14:444.

38. Gui Y-H, Tao X, Lai X-J, Wang H-Y, Zhang Y-Z. Exploring the polyadenylated RNA virome of sweet potato through high-throughput sequencing. PLoS One. 2014;9:e98884.

39. Jo Y, Choi H, Yoon J-Y, Choi S-K, Cho WK. De novo genome assembly of grapevine yellow speckle virus 1 from a grapevine transcriptome. Genome Announc. 2015;3:e00496–15.

40. Jensen RH, Mollerup S, Moutier T, Hansen TA, Fridholm N, Nielsen LP, et al. Target-dependent enrichment of virions determines the reduction of high-throughput sequencing in virus discovery. PLoS One. 2015;10:e0122636.

41. Marais A, Faure C, Candresse T. New insights into Asian prunus viruses in the light of NGS-based full genome sequencing. PLoS One. 2016;11:e0164620.

42. Fullwood MJ, Wei C-L, Liu ET, Ruan Y. Next-generation DNA sequencing of paired-end tags (PET) for transcriptome and genome analyses. Genome Res. 2009;19:521–32.

43. Hunt M, Gaff A, Ong SH, Brener J, Ferns B, Goulder P, et al. iRA: accurate de novo assembly of RNA virus genomes. Bioinformatics. 2015;31:2374–6.

44. Ruby JG, Bellare P, Delsuili JL. PRICE: software for the targeted assembly of components of (Meta) genomic sequence data. G3 (Bethesda). 2013;3:865–80.

45. Yang X, Charlebois P, Gnerre S, Coole MG, Lennon NJ, Levin JZ, et al. De novo assembly of highly diverse viral populations. BMC Genomics. 2012;13:475.