# **RESEARCH ARTICLE**

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# Helitron distribution in Brassicaceae and whole Genome Helitron density as a character for distinguishing plant species



Kaining Hu, Kai Xu, Jing Wen, Bin Yi, Jinxiong Shen, Chaozhi Ma, Tingdong Fu, Yidan Ouyang\* and Jinxing Tu\*

#### **Abstract**

**Background:** Helitron is a rolling-circle DNA transposon; it plays an important role in plant evolution. However, Helitron distribution and contribution to evolution at the family level have not been previously investigated.

**Results:** We developed the software easy-to-annotate *Helitron* (EAHelitron), a Unix-like command line, and used it to identify *Helitrons* in a wide range of 53 plant genomes (including 13 Brassicaceae species). We determined *Helitron* density (abundance/Mb) and visualized and examined *Helitron* distribution patterns. We identified more than 104,653 *Helitrons*, including many new *Helitrons* not predicted by other software. Whole genome *Helitron* density is independent from genome size and shows stability at the species level. Using linear discriminant analysis, de novo genomes (next-generation sequencing) were successfully classified into *Arabidopsis thaliana* groups. For most Brassicaceae species, *Helitron* density negatively correlated with gene density, and *Helitron* distribution patterns were similar to those of *A. thaliana*. They preferentially inserted into sequence around the centromere and intergenic region. We also associated 13 *Helitron* polymorphism loci with flowering-time phenotypes in 18 *A. thaliana* ecotypes.

**Conclusion:** EAHelitron is a fast and efficient tool to identify new *Helitrons*. Whole genome *Helitron* density can be an informative character for plant classification. *Helitron* insertion polymorphism could be used in association analysis.

Keywords: Transposable element, Plant classification, Multivariate analysis, Genomic evolution, Bioinformatics

#### **Background**

Transposons or transposable elements (TEs) are mobile DNA segments first described by McClintock in 1950 [1]. They are divided into two main classes, Class I TEs (RNA transposons or retrotransposons) that require an RNA intermediate and use a 'copy-and-paste' mechanism to insert their copies into new locations, and Class II elements are DNA transposons which use a 'cut-and-paste' mechanism to mobilize themselves without RNA intermediates [2]. Helitrons transpose by rolling-circle replication (RCR) with only one strand cut and are important DNA transposons (Class II) in diverse eukaryotic genomes. They were discovered by data mining the Arabidopsis thaliana, Oryza sativa, and Caenorhabditis elegans genomes [3]. Canonical Helitrons have conservative 5'-TC, CTRR-3' (mostly CTAG-3') termini and contain a 16–20 nt GC-rich hairpin

Brassicaceae, formerly Cruciferae, is a medium-sized plant family, composed of more than 372 genera and 4060 species [6]. The family includes many important species, such as the model plant *A. thaliana* [7], the crop *Brassica rapa* [8], and *Brassica oleracea* (Cabbage) [9, 10]. Many species in this family have sequenced genomes, which are useful for *Helitron* evolution research at family level. *Helitron* length is highly variable in plants, e.g., *A. thaliana* repeat elements *AthE1* [11], *AtREP* [12], and *Basho* [13] are non-autonomous *Helitrons*, and their length ranges from 0.5–3 kb [14]. Some

<sup>\*</sup> Correspondence: diana1983941@mail.hzau.edu.cn; tujx@mail.hzau.edu.cn National Key Laboratory of Crop Genetic Improvement, Huazhong Agricultural University, Wuhan 430070, People's Republic of China



structure located 10–15 nt upstream of the 3' end [3, 4], which is thought to serve as a stop signal in the transposition process [5]. They have always been inserted into 5'-AT-3' target sites and do not have terminal inverted repeats [4]. *Helitrons* can be classified as either autonomous or non-autonomous based on whether they contain the RepHel sequence, which is a protein domain homologous to the prokaryotic Rep protein involved in PCR and helicases [3].

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autonomous Helitrons have been found to be larger (8-15 kb in A. thaliana, 10-15 kb in O. sativa, and 5-8 kb in C. elegans) [3]. Maize Helitron length has a wide range from 202 bp to 35.9 kb [15]. In addition, some studies have shown that plant genomes have variable Helitron content, approximately 2% in Arabidopsis [3], 6.6% in maize, and 0.1-4.3% in other plants [4]. DNA transposons use a 'cut-and-paste' mechanism unlike the RNA transposons that use a 'copy-and-paste' mechanism, and are usually present in low to moderate numbers [2]. Helitrons are unique DNA transposons transported by RCR, a process that was confirmed by reconstructing the ancient element *Helraiser* from the bat genome [16]. However, it has also been found that Helitrons can excise and leave footprints, an outcome not expected from rolling-circle transposition in maize [17]. Therefore, Helitrons may exhibit both 'copy-and-paste' and 'cutand-paste' modes of transposition. These reports imply that the number of Helitrons in the genome may be lower and steadier than RNA transposons. Therefore, Helitron related data may be more representative of plant genome features than RNA transposons.

Helitrons may express preference in terms of genomic position and have been reported to be more abundant in gene-poor regions of *Arabidopsis* [18], especially around the centromere as with other TEs [19]. However, a less ordered pattern of *Helitron* distribution was reported in rice [18]. Furthermore, it was found that the *Helitrons* of maize mainly exist in the gene-rich region rather than the gene-poor region [20]. This may be because the maize genome is larger; therefore, the density of the maize gene-rich region is similar to that of the *Arabidopsis* gene-poor region. Xiong et al. found in plant *Helitrons* amplified by RCR that the tandemly arrayed replication products mostly accumulated in the centromeres [21]. *Helitron* distribution patterns remain unclear in a wide range of plant genomes and require further research.

Similar to other transposons such as CACTA [22] and MULEs (Mutator-like elements) [23], Helitrons can capture gene fragments and move them around the genome [24]. It is one of the most important agents in gene evolution. Helitrons can change many gene functions and have been found to cause phenotypic differences by insertion into promotors leading to changes in expression patterns. A spontaneous pearly-s mutant of Ipomoea tricolor cv. 'Heavenly Blue' displays stable white flowers and is caused by an 11.5 kb Helitron inserted into the DFR-B gene for anthocyanin pigmentation [25]. In Brassicaceae, a 4.3 kb Helitron inserted into the BrTT8 intron resulted in B. rapa with a yellow seed coat [26]. A 3.6 kb non-autonomous Helitron was inserted into the promoter of the determining gene for self-incompatibility in males BnSP11-1, which led to oilseed rape Brassica napus becoming self-compatible [27]. Locating these *Helitrons* is an important task in plant functional genomic research.

There are two main types of software used for searching Helitrons. Homology comparison software, such as CENSOR [28], RepeatMasker [29], etc., are mainly based on NCBI-BLAST [30], WU-BLAST [31] and other derivatives programs (e.g. RMBlast) comparable with Repbase [32] and other repeat sequences databases. While BLAST is not able to fully identify various Helitrons hairpins, similarity searches alone are not effective in identifying Helitrons. The other type of software, such as HelitronFinder [33] and HelSearch [18] are based on Helitron conserved structures. HelitronScanner identifies Helitron terminal structures based on a motif-extracting algorithm proposed initially in a study of natural languages [4]. It may be able to discover novel Helitrons but results in a high number of false positives when using the default settings [4]. With the development of nextgeneration sequencing (NGS) and 3rd-generation sequencing (3GS), more plant genomes have been sequenced and assembled, and a faster and easier way to annotate Helitrons and present annotation results is required.

In this study, we developed the software easy-to-annotate *Helitron* (EAHelitron), a rapid and easy-to-use program for computationally identifying *Helitrons*. It predicted more than 104,653 *Helitrons* in 53 genomes of different plant species (including 16 genomes from 13 Brassicaceae species) and 18 *A. thaliana* ecotype genomes. We considered whole genome *Helitron* density to be a species-specific characteristic of plants, given its potential for plant classification. We investigated the large plant family Brassicaceae in terms of *Helitron* distribution and insertion patterns. Finally, we attempted to associate flowering-time phenotypes with *Helitron* polymorphisms in 18 different *A. thaliana* ecotypes. The software and results may contribute to our knowledge of *Helitrons* and their role in plant evolution.

#### Results

# **Workflow of EAHelitron**

EAHelitron predicts putative *Helitrons* based on definitive features by scanning for conserved structural traits: 5' end with TC and 3' end with CTAG and a GC-rich hairpin loop 2–10 nt in front of the CTAG end. Using the Perl regular expression engine, the left GC-rich part of hairpin was searched by EAHelitron, followed by the capture of reverse complementary sequence of GC-rich fragment as the right part of hairpin, using our TRSeq function by an embedded-code of Perl regular expression engine. Next, the upstream and downstream sequences of hairpin were searched simultaneously using EAHelitron, to identify possible matched structure of 5' end with TC and 3' end with CTAG. Subsequently, such searching process was repeatedly performed by EAHelitron using the reversed complementary

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chromosome sequences. Finally, all records of putative *Helitrons* were printed in FASTA format including the terminal ends, 3' upstream and downstream sequences, possible full-length *Helitron* sequences, and a general feature format (GFF) annotation file (Fig. 1).

# Comparison of EAHelitron with other software

EAHelitron supports whole genome FASTA sequences and multi-threading. Compare the time cost of *Helitrons* (4 min) searching in *Arabidopsis* TAIR10 with other software (HelitronScanner, Helsearch and RepeatMasker), EAHelitron increases the maximum speed of the prediction process by 99.3 times (38 min for HelitronScanner, 7 h for Helsearch, and 2.5 h for RepeatMasker shown in Table 1).

We ran EAHelitron against genome sequences of TAIR10 at the default 3' terminal fuzzy level and identified 665 *Helitrons*. Comparing these results with those of former programs, we found that 75.0% of the EAHelitron-predicted *Helitrons* (499/665) were supported by HelSearch or HelitronScanner (Fig. 2, Additional file 2: Table S1). In silico verification of EAHelitron-predicted *Helitrons* through the study of in 18 different *A. thaliana* ecotypes showed that at least 508 *Helitrons* were active in transposition in these ecotypes (Additional file 2: Table S2), including at least 41 *Helitron*-insertion polymorphisms of the 166 (24.7%) *Helitrons* uniquely predicted by

EAHelitron in TAIR10 (Additional file 2: Table S1 and S2) . This indicates that EAHelitron has the ability to find genuine new *Helitrons*.

To estimate the false positive rates (FPR) of these programs, we predicted Helitrons in 100 randomly reconstructed genomic sequences of Arabidopsis using EAHelitron, HelSearch and HelitronScanner [18]. HelitronScanner had the highest FPR under the default settings (32.67%, Additional file 2: Table S3), and EAHelitron showed lower FPR of 5.91% (Additional file 2: Table S3). HelSearch operates by only counting those occurrences with more than one copy; therefore, no false positive *Helitrons* were identified in these random genomes (not listed). However, the omission of one-copy Helitrons in this application can be a problem. EAHelitron provides outputs in the form of full length Helitrons, flanking sequences, and support-to-output GFF3 files, similar to RepeatMasker [29], which are easy for presenting Helitrons in genome visualization software (389 of EAHelitron-predicted Helitrons were supported by RepeatMasker, Additional file 1: Figure S1), such as IGV [34], GBrowse [35], and JBrowse [36]. Considering the time cost, support of whole genome automatic annotation, acceptable FPR, convenience of downstream analysis, and visualization, we used EAHelitron to identify Helitrons in subsequent analysis of plant genomes.

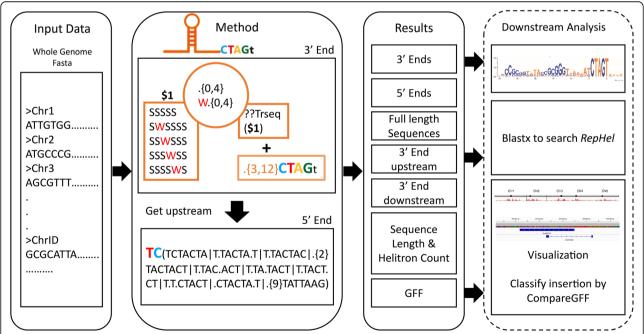


Fig. 1 Overview of EAHelitron workflow. Left: the input data of EAHelitron. EAHelitron supports inputs of separate FASTA files or a whole genome FASTA. Middle: the method of EAHelitron. EAHelitron searches the left part of GC-rich hairpin. Next using Perl regular expressing engine's embedded-code with TRSeq function to get the reverse complementary sequence of left part hairpin, which as the right part to complete the regular expression to continue the full-length hairpin searching. Then get the up and downstream sequences of hairpin to search 5' TC ends and 3' CTAG ends (S means G or C, W means A or T, '.' Means A, T, G or C). Right: outputs of EAHelitron. FASTA files of ends or full length Helitrons, summary of Helitron numbers and GFF annotation

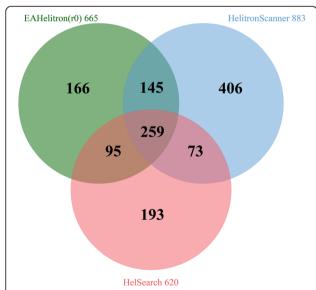
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**Table 1** The running time of four programs for *Helitron* identification in TAIR10

	EAHelitron	HelitronScanner	Helsearch	RepeatMasker
Threads: 1	0:04:16	0:38:15	7:03:40	2:27:34
Threads: 4	0:01:42	0:37:30	-	0:45:15

#### Helitron identification in 53 plant genomes

Using EAHelitron, we identified 104,653 Helitrons in 53 published plant genomes, including a wide range of monocots and eudicots (Additional file 3: Table S4). The 5' terminal ends of Helitrons are less conserved than 3' ends [4]. In addition, a Helitron may have a single 3' end but multiple 5' termini [21], which results in difficulties in predicting Helitron length. It makes genome content of Helitron that, based on Helitron length, would not be accurate to describe a genome character. Here, we used Helitron density, defined by the number of 3' termini of *Helitrons* divided by the genome size, which is potentially a more accurate genomic characteristic than the proportion of Helitron sequence length in the genome. The phylogenetic relationship, based on APG [37] and Phytozome 11, genome sizes, and Helitron numbers, Helitron densities of 53 plant genomes were summarized in Fig. 3 and Table 2. The number of Helitrons varied dramatically among these plant genomes. B. napus contained the largest number of Helitrons (13,968), while in Ostreococcus lucimarinus and Micromonas sp. RCC299,



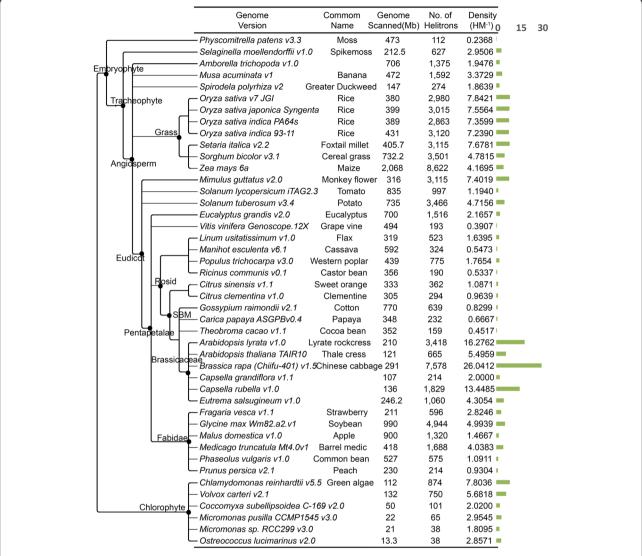
**Fig. 2** Venn diagram of predicted *Helitrons* in TAIR 10 by three programs. Green: EAHelitron predicts 665 *Helitrons*, including 166 uniquely records. Blue: HelitronScanner predicts 883 *Helitrons*, including 406 uniquely records. Red: HelSearch predicts 620 *Helitrons*, including 193 uniquely records. Three software share 259 *Helitron* records. EAHelitron shares 354 and 404 *Helitrons* with HelSearch and HelitronScanner separately. In total, 499 EAHelitron-predicted *Helitrons* (75% of 665) are supported by HelSearch or HelitronScanner

only 38 *Helitrons* were detected in each of the genomes representing the minimum number of *Helitrons*. Notably, sibling species may have divergent *Helitron* densities, even though they belong to the same family (Fig. 3). For example, a 3-fold difference in *Helitron* density between *A. thaliana* and *A. lyrata* (5.5 and 16.3, respectively) was detected, indicating significant variation in either *Helitron* counts or *Helitron* densities in *Arabidopsis* genus. So, either *Helitron* counts or *Helitron* densities (0.2368–26.0412) greatly varied in these plants.

To study the Helitron features in different sequenced genomes from one species, we compared the characteristic of Helitrons in different sequenced genomes of seven species (Oryza sativa japonica, Oryza sativa indica, Eutrema salsugineum or formerly Thellungiella salsuginea, Schrenkiella parvula or formerly Thellungiella parvula, Brassica oleracea, Arabidopsis thaliana and Zea mays, Table 3). The results showed that although the genome size and Helitron numbers varied in different varieties or ecotypes of the same species, the densities of Helitrons remained relatively stable. In rice, the genome size for two indica varieties PA64s and 93-11 were 389 M and 431 M, respectively, with a standard deviation (SD) of 29.70 and coefficient of variation (CV) of 7.24%. Also, the number of *Helitrons* were 2863 for PA64s and 3120 for 93-11 (SD = 181.73, CV = 6.07%). However, the Helitron densities were 7.36 for PA64s and 7.24 for 93-11, which was is a constant value in rice species (SD = 0.086, CV = 1.17%). Similarly, in B. oleracea A2 v1.1 and B. oleracea TO1000 v2.1, their genome size (391 M and 498 M, respectively, SD = 75.66, CV = 17.02%) and *Helitron* number (5392) and 6979, respectively, SD = 1122, CV = 18.14%) were different, but their Helitron densities were similar (~ 13.90 Helitrons per Mb, SD = 0.16, CV = 1.14%). And compression of two version of Thellungiella salsuginea genomes showed that, Thellungiella salsuginea and Eutrema salsugineum (formerly Thellungiella halophila, which finally were determined to be Thellungiella salsuginea) had steadier Helitron density ( $\sim 4.36$  Helitrons per Mb, SD = 0.055, CV = 1.27%) than genome size (233.7 M and 246.2 M, respectively, SD = 6.25, CV = 2.60%). Therefore, *Helitron* density may be regarded as a stable genomic characteristic.

To further estimate the relationship between genome size, *Helitron* number, and *Helitron* density, we calculated the Pearson's product-moment correlation in 53 plant genomes (Table 4, Additional file 1: Figure S2,). The results suggested that *Helitron* number was significantly positively correlated with genome size and *Helitron* density (r1 = 0.52, p1 = 7.23E-05; r2 = 0.71, p2 = 2.60E-09); however, *Helitron* density may not be correlated with genome size (p = 0.73). Therefore, *Helitrons* contributed to the size changes in plant genomes, whereas *Helitron* density and genome size are independent of each other, we can use *Helitron* density as a genome character together with genome size in the next experiments.

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**Fig. 3** Genome and *Helitron* information of 44 plant genomes. Left phylogenetic tree is constructed based on Phytozome V11 and APG. Right green blocks represent *Helitron* density. A plant family could have a quite different counts of *Helitron* and *Helitron* density, like Brassicaceae

Considering the stability of *Helitron* density at the species level, it might be regarded as a species-specific characteristic for use in classification. To validate the efficacy of using Helitron density to identify species, we performed the LDA using seven genomes with at least two sequence variants (Table 3). In total, 34 genomes (including 18 A. thaliana) were used to train the model in R with Helitron density and genome size. Next, we added the Helitron information from two de novo assembled genomes of A. thaliana mutants, Denovo genome\_L (CS852557, N50: 5064, Scaffolds: 3350) and Denovo\_genome\_X (SALK\_015201, N50: 25,619, Scaffolds: 9888) to these data, and then predicted which species groups they belong to. LDA predicted all of these 36 samples correctly (100%), including successfully identifying the two de novo samples to the A. thaliana group from six other species groups (Table 3, Additional file 1: Figure S3). This result indicated that EAHelitron can count the *Helitrons* of NGS de novo genome drafts successfully, and that *Helitron* density is informative as a species-specific characteristic in plant genomes and could be applied to expediate plant identification.

# Identification of Helitrons in Brassicaceae

Many Brassicaceae species genomes are sequenced and are informative for *Helitron* evolution research. There were 49,213 *Helitrons* were predicted from 16 Brassicaceae genomes, showing a wide range of diversity in genome size, *Helitron* count, and *Helitron* density (Table 2, Additional file 1: Figure S4). Of these genomes, *B. napus* had the largest genome size and *Helitron* counts (864.5 M and 13,968, respectively). *Capsella grandiflora* had

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Table 2 Summrization of related information for Helitrons identified in Brassicaceae

Taxon	Genome Size (M)	Helitron	$HM^{-1}$	Gene zone	CDS	Intron or UTR	Intergenic region
Brassica rapa v1.5	291.7	7578	25.9788	394	41	353	7184
Arabidopsis lyrata	210.2	3418	16.2607	101	24	77	3317
Brassica napus v5	864.5	13,968	16.1573	807	84	723	13,161
Brassica oleracea TO1000 v2.1	498.9	6979	13.9888	262	53	209	6717
Brassica oleracea A2 v1.0	391.4	5392	13.7762	153	25	128	5239
Capsella rubella	134.8	1829	13.5683	65	10	55	1764
Camelina sativa	648.7	5827	8.9826	248	55	193	5579
Arabidopsis thliana	121	665	5.4959	70	18	52	595
Aethionema arabicum	200.2	1028	5.1349	72	37	35	956
Thellungiella salsuginea v2	233.7	1032	4.4159	-	-	-	-
Thellungiella halophila 173 (Esa)	246.2	1060	4.3054	40	20	20	1020
Leavenworthia alabamica	174.4	450	2.5802	55	30	25	395
Sisymbrium irio	260.5	603	2.3148	41	22	19	562
Capsella grandiflora v1.1	112.3	214	1.9056	17	9	8	207
Thellungiella parvula v8	123.6	202	1.6343	45	18	27	157
Schrenkiella parvula	140	223	1.5929	_	-	_	_

<sup>&</sup>quot;-" Lack of GTF

the smallest genome (112.3 M) and T. parvula v8 had the least number of Helitrons (202). The Helitron density reached a maximum of 25.98 in B. rapa, whereas T. parvula had the lowest Helitron density of 1.59. Most of Helitrons in Brassicaceae were non-autonomous, only 1.6–18.49% were autonomous (6.5% in average, Additional file 2: Table S5). Also, RepHel percentage was not correlated with Helitron density or Helitron number (p1 = 0.21, p2 = 0.24, Additional file 2: Table S5), whichmeans autonomous Helitron counts were not correlated with the total Helitron number in host genomes of Brassicaceae. B. napus (genome AnAnCnCn) was formed by recent allopolyploidy (7500 to 12,500 years ago) between ancestors of B. oleracea (CoCo) and B. rapa (ArAr) [38]. We found that the *Helitron* density of subgenomes in *B*. napus decreased relative to the ancestor genomes of B. oleracea and B. rapa. In addition, the subgenome of An had higher Helitron density relative to the Cn subgenome in *B. napus* (An: 7056/314.2 = 22.4570 < Ar: 25.9788, Cn: 6721/525.8 = 12.7824 < Co: 13.9888 or 13.7762, AnCn: 16.1573 < ArCo: 18.4126 or 18.9870). This inferred that allopolyploidy may affect the density of Helitrons during evolution.

#### Helitrons evolution in Brassicaceae

We constructed a dendrogram of 15 *Brassicaceae* genomes based on genome size and *Helitron* density with hierarchical clustering (Additional file 1: Figure S5a). This was compared with known phylogenetic trees, one based on a reconstruction using the ancestral Brassicaceae karyotype genome [39] (Additional file 1: Figure

S5b), and the other based on sequences of nuclear ribosomal ITS-1, 5.8S ribosomal RNA, and ITS-2 region [40] (Additional file 1: Figure S5c). The *Helitron* density related dendrogram had a similar topological structure to these two known phylogenetic trees, indicating that *Helitron* density, which may contain the history of the transposon replications and genome size expanding, e.g. whole genome duplication (WGD), is informative in terms of species evolution.

We investigated the evolutionary process of *Helitrons* in eight sibling genomes in Brassicaceae (Ath, Aly, Cru, Tpa, Bol v1, Bol v2, Bra, and Bna), and upstream 1kbp sequences of 3' termini were chosen to search for conserved sequences showing highly similarity (Additional file 2: Table S6). Although the proportion of conserved *Helitrons* (evalue <1e-5, qcov > 55, s\_end > 950; length of upstream sequences of 3' termini matched larger than 55 bp) was consistent with the phylogenetic relationship between the species, the number of conserved *Helitrons* remained at a rather low level. The divergence time of *A. lyrata* and *A.* thaliana was about 10 to 12 Mya, with approximately 90% of syntenic regions found between the two genomes. It was found that all 32,670 A. lyrata protein-coding genes were homologous to the 27,025 (98.7%) genes in A. thaliana [41]. However, only 12.4 to 22.7% of Helitrons were conserved between the two genomes showing homology with each other (Additional file 2: Table S6). Similarly, B. oleracea and B. rapa diverged about 4.6 Mya. A total of 66.5% (34,237 genes) of B. oleracea genes and 74.9% (34, 324) of *B. rapa* genes were regarded as homologous [9], whereas they only shared 50.05 to 52.60% of homologous

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**Table 3** Linear discriminant analysis (LDA) of 36 plant genome samples

Training label	Genome	Genome Size (M)	Helitron	$HM^{-1}$	LDA predicted
Osa japonica	Oryza sativa japonica IRGSP v7_JGI	380	2980	7.8421	Osa japonica
Osa japonica	Oryza sativa japonica Syngenta	399	3015	7.5564	Osa japonica
Osa indica	Oryza sativa indica PA64s	389	2863	7.3599	Osa indica
Osa indica	Oryza sativa indica 93–11	431	3120	7.239	Osa indica
Ath	A. thaliana Col-0	121	665	5.4959	Ath
Ath	A. thaliana Can-0	119.3	590	4.9455	Ath
Ath	A. thaliana Zu-0	119.7	590	4.929	Ath
Ath	A. thaliana Po-0	120.5	593	4.9212	Ath
Ath	A. thaliana Hi-0	120.3	592	4.921	Ath
Ath	A. thaliana Oy-0	119.5	575	4.8117	Ath
Ath	A. thaliana Wu-0	119.7	572	4.7786	Ath
Ath	A. thaliana Sf-2	119.6	567	4.7408	Ath
Ath	A. thaliana Ct-1	119.6	567	4.7408	Ath
Ath	A. thaliana Mt-0	119.5	565	4.728	Ath
Ath	A. thaliana Edi-0	119.8	564	4.7078	Ath
Ath	A. thaliana Tsu-0	119.6	559	4.6739	Ath
Ath	A. thaliana Bur-0	119.7	556	4.6449	Ath
Ath	A. thaliana Rsch-4	119.8	554	4.6244	Ath
Ath	A. thaliana Ler-0	119.7	552	4.6115	Ath
Ath	A. thaliana Ws-0	119.8	547	4.5659	Ath
Ath	A. thaliana Wil-2	119.5	543	4.5439	Ath
Ath	A. thaliana Kn-0	119.7	542	4.528	Ath
Tsa	Eutrema salsugineum v1.0	246.2	1060	4.3054	Tsa
Tsa	Thellungiella salsuginea v2	233.7	1032	4.4159	Tsa
Тра	Thellungiella parvula v8	123.6	202	1.6343	Тра
Тра	Schrenkiella parvula	140	223	1.5929	Тра
Bol	Brassica oleracea A2 v1.1	391	5392	13.7903	Bol
Bol	Brassica oleracea TO1000 v2.1	498	6979	14.0141	Bol
Zma	Zm B73 V4.0	2134	8274	3.8765	Zma
Zma	Zm CML247 V1.1	2197	8791	3.9996	Zma
Zma	Zm EP1 V1.0	2455	8481	3.4542	Zma
Zma	Zm F7V1.0	2392	8602	3.5949	Zma
Zma	Zm Mo17 V1.0	2182	8602	3.9412	Zma
Zma	Zm W22 V2.0	2133	8132	3.8109	Zma
	Denovo_genome_L	121.1	640	5.2849	Ath
	Denovo_genome_X	120.2	643	5.3494	Ath
Correct Rate					36/36 = 100%

De novo plant genomes are bolded

Helitrons. The proportion of conserved Helitrons between Camelineae (Ath, Aly and Cru) and Calepineae (Tpa, Bra, Bol and Bna), which diverged around 27 Mya [39], reduced to less than 1%. These results suggest that Helitrons evolved much quickly than protein-coding genes, and they were likely to originate in the ancestral species but diverge or disappear in some of the lineages during the evolution.

We also found that a large proportion of *Helitrons* in Brassicaceae, from 35.75% in *Tpa* to 80.63% in *Aly*, were multiple copies, with an average ratio of 65.72% being multi-copy *Helitrons* (Additional file 2: Table S6). This suggested that *Helitrons* were inclined to duplicate themselves in host genomes during the evolution, but still have some *Helitrons* remained in single copy.

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**Table 4** Pearson's product-moment correlation with *Helitron* number, *Helitron* density and genome size of 53 plant genomes (1000 bootstrap replicates)

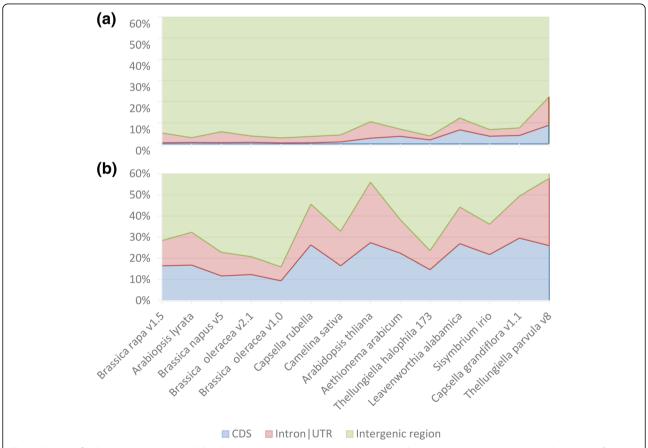
	r	r 95% confidence interval		r bootstrap	r bootstrap 95% BCa		p bootstrap	o 95% BCa
Helitrons vs Genome size	0.5176	0.2875	0.6912	0.2280	0.7429	7.23E-05	0.0000	0.1671
Helitrons vs Helitron Density	0.7102	0.5444	0.8226	0.3215	0.8243	2.60E-09	0.0000	0.0056
Helitron Density vs Genome size	-0.0492	-0.3153	0.2241	-0.1844	0.2528	0.7267	0.2871	0.9980

#### Helitron distributions in Brassicaceae

We further analyzed *Helitron* insertion sites using CompareGFF script. The positions of all *Helitrons* were clustered into three types: in exon, in intron or untranslated regions (UTR), and in intergenic regions (see examples in IGV in Additional file 1: Figure S6). Among these Brassicaceae genomes, *T. parvula* had the highest gene zone (exon, intron and UTR) insertion rate (22.2%), whereas *B. oleracea A2* v1.0 had the lowest *Helitron* insertion rate (2.8%). The average rate was 7% (Table 2, Fig. 4a). The Chi-square test of *Helitron* insertion rate (Fig. 4a) with genome components rate (Fig. 4b) showed that, *Helitrons* were not distributed randomly in all tested genomes (p < 0.0001). Most *Helitrons* were

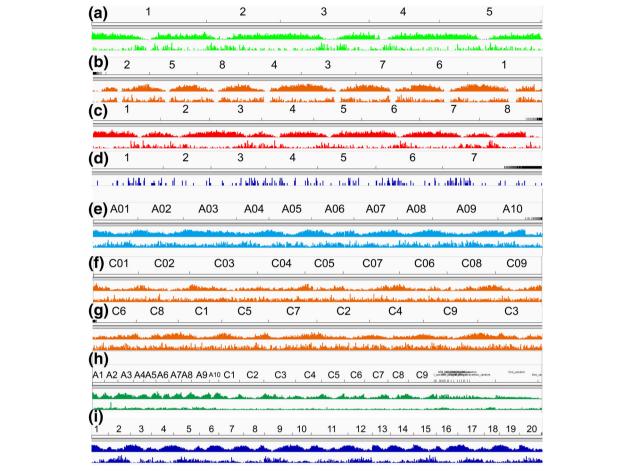
inserted in the intergenic region (77.8 to 97.2%, 93.3% average). In general, those *Helitrons* inserted in the gene zone were mostly found in UTR or introns (4.5%) rather than in CDS (2.6%) (Fig. 4a, Table 2).

The relationship between gene density and *Helitron* density was also investigated, and an overview of the *Helitron* distribution of nine genomes (Ath, Aly, Cru, Tpa, Bra, Bol v1, Bol v2, Bna and Csa) on the chromosome were shown on the IGV (Fig. 5). Sliding window and correlation analyses suggested that in most of these genomes (5/8), local gene densities of windows were highly negatively related to local *Helitron* densities (-0.707 < r < -0.315, p < 0.001, Additional file 2: Table S7). Two species (*A. lyrata* and *B. napus*) were found to be slightly positively correlated (r1 =



**Fig. 4** Percent of *Helitron*-insertion types. Hidden the rest 40% intergenic region percent. (a) *Helitron* insertion percentage accumulation map, (b) percentage accumulation map of CDS, Intron/UTR and intergenic region length with whole genome. *Helitron* insertion are not random (Chi-squared Test, p < 0.0001)

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**Fig. 5** Gene and *Helitron* distribution of nine Brassicaceae genomes. First row is chromosome, middle row is gene distribution, and last row is *Helitron* distribution. (a) Ath, (b) Aly, (c) Cru, (d) Tpa (lack of GTF), (e) Bra, (f) Bol v1, (g) Bol v2, (h) Bna, (i) Csa. Most of Brassicaceae *Helitron*s prefer to locate around centromeres and lack gene region. Sliding window analysis (window = 1 Mbp, step = 500 kbp) and correlation analysis show that, most of these genomes, gene densities are high negatively related with *Helitron* density (-0.707 < r < -0.315, p < 0.001, Table S8, Additional file 2)

0.130, p1 < 0.05, r2 = 0.234, p2 < 0.01, Additional file 2: Table S7). *B. oleracea Helitron* density and gene density were not correlated significantly (p > 0.05) These results suggested that *Helitrons* mostly preferred low-density gene areas in Brassicaceae, and this was in accordance with previously research that suggested that most *Helitrons* were located in low gene density areas especially around the centromeres in *Arabidopsis* [18].

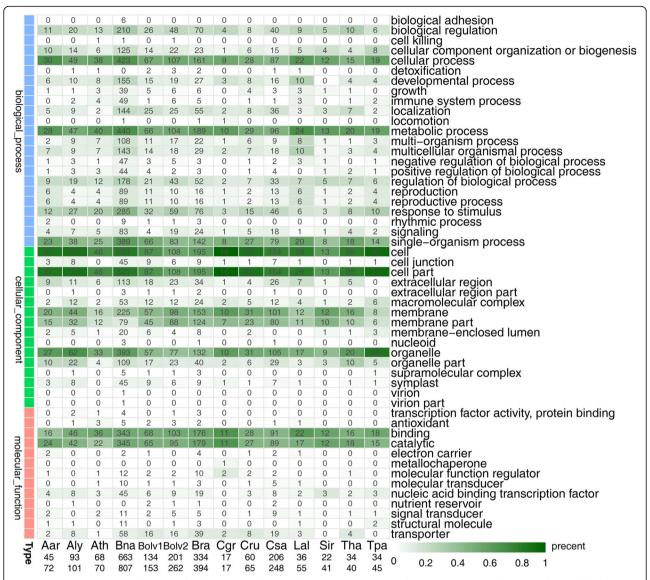
# Analyses of functions of *Helitron*-inserted genes in Brassicaceae

A total of 2370 *Helitron*-inserted genes were identified in Brassicaceae (Additional file 4: Table S8). The GO terms heatmap showed that the functions of these *Helitron*-inserted genes exhibited some similar patterns, such as biological regulation, localization, metabolic process, multicellular organismal process, reproduction, and response to stimulus in biological process categories (BP), binding, catalytic, transporter, and nucleic acid binding

transcription factor in molecular function categories (MF), and cell, membrane, organelle, and symplast in cellular component categories (CC) (Fig. 6).

Four well-annotated genomes (A. thaliana, B. rapa, B. oleracea v1, and B. napus) in GO terms or KEGG pathways were used for further enrichment analysis (all annotated genes were used as background). The significantly enriched results are listed in Additional file 5: Table S9 (P < 0.001, corrected P < 0.1 and hit genes > 2). In Arabidopsis, Helitron-inserted genes were likely to be enriched in terms of triplet codon-amino acid adaptor activity (GO: 0030533), binding (GO: 0005488), and other items in the MF category. Helitron-inserted genes in B. rapa were significantly enriched in terms of transmembrane transport (GO: 0055085, BP), xanthophyll metabolic process (GO: 0016122, BP), inorganic anion transport (GO: 0015698, BP), water transmembrane transporter activity (GO: 0005372, MF), lipase activity (GO: 0016298, MF), and others. B. oleracea v1 genome Helitron-inserted genes

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**Fig. 6** GO terms percentage heatmap of *Helitron*-inserted genes of Brassicaceae. X-axis number means annotated gene number and all *Helitron*-inserted-gene-zone (5'-UTR to 3'-UTR) number of this genome. Legend of green means gene counts percentage of all annotated genes in the GO term. These Brassicaceae genomes have similar percentage in some dark green GO terms, e.g. biological regulation, reproduction, response to stimulus, membrane, catalytic

were enriched in terms of drug transport (GO: 0015893, BP), sexual reproduction (GO: 0019953, BP), transmembrane transporter activity (GO: 0022857, MF), antiporter activity (GO: 0015297, MF), and others (Additional file 5: Table S9). *B. napus Helitron*-inserted genes were enriched in terms of response to wounding (GO: 0009611, BP), suberin biosynthetic process (GO: 0010345, BP), cell periphery (GO: 0071944, CC), long-chain-fatty-acyl-CoA reductase activity (GO: 0050062, MF), carbon-oxygen lyase activity, acting on phosphates (GO: 0016838, MF), terpene synthase activity (GO: 0010333, MF), and others. The KEGG pathway enrichment showed that *A. thaliana* was enriched in Phenylpropanoid biosynthesis (map00940), and *B. oleracea* 

was enriched in cutin, suberine and wax biosynthesis (map00073) and lipid metabolism. However, *B. rapa* and *B. napus* were not significantly enriched in any pathways in these tests (Additional file 5: Table S9).

# Helitron distributions in different ecotypes of A. thaliana

In *Arabidopsis*, the numbers of *Helitrons* in 18 ecotypes (Additional file 1: Figure S7) varied from 542 to 665 (average 572, SD = 27.7, Table 5), with an average density of 4.77 *Helitrons* per Mb (SD = 0.21, Table 5). Ecotype Kn-0 from Kaunas, Lithuania had the least number of *Helitrons* (542), while the Col-0 ecotype from USA has the largest number of *Helitrons* (665). Of the 665

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Table 5 The information of origin, type of flowering-time and Helitron counts from 18 A. thaliana ecotypes

Rank	Accession	Country	Origin	Stock	Unique LOC	М	Helitrons	$HM^{-1}$	Flowering-time
1	Col-0	USA	Columbia	CS22625	1	121	665	5.4959	intermediate
2	Can-0	Spain	Canary Islands	CS6660	14	119.3	590	4.9455	late
3	Zu-0	Switzerland	Zurich	CS6902	8	119.7	590	4.9290	late
4	Po-0	Germany	Poppelsdorf	CS6839	3	120.5	593	4.9212	intermediate
5	Hi-0	Netherlands	Hilversum	CS6736	3	120.3	592	4.9210	intermediate
6	Oy-0	Norway	Oystese	CS6824	5	119.5	575	4.8117	intermediate
7	Wu-0	Germany	Wurzburg	CS6897	4	119.7	572	4.7786	intermediate
8	Sf-2	Spain	San Feliu	CS6857	11	119.6	567	4.7408	late
9	Ct-1	Italy	Catania	CS6674	5	119.6	567	4.7408	intermediate
10	Mt-0	Libya	Martuba/Cyrenaika	CS1380	4	119.5	565	4.7280	intermediate
11	Edi-0	UK	Edinburgh	CS6688	10	119.8	564	4.7078	late
12	Tsu-0	Japan	Tsushima	CS6874	5	119.6	559	4.6739	intermediate
13	Bur-0	Ireland	Burren	CS6643	6	119.7	556	4.6449	intermediate
14	Rsch-4	Russia	Rschew/Starize	CS6850	3	119.8	554	4.6244	intermediate
15	Ler-0	Poland	Ler	CS20	7	119.7	552	4.6115	intermediate
16	Ws-0	Russia	Wassilewskija	CS6891	9	119.8	547	4.5659	late
17	Wil-2	Russia	Wilna/Litvanian	CS6889	5	119.5	543	4.5439	intermediate
18	Kn-0	Lithuania	Kaunas	CS6762	6	119.7	542	4.5280	intermediate

Flowering-time types obtained from TAIR official annotation are bolded

predicted *Helitrons* in Col-0, 70 *Helitrons* had been inserted in gene regions; 18 of them were located in CDS (Table 6), and 52 were located in introns or UTR (Additional file 2: Table S10). According to the TAIR10 annotation, three *Helitrons* were inserted in CDS genes (AT1G62840, AT4G11700, and AT5G66580) of unknown function (Table 6).

The overview of the *Helitron* distributions of these ecotypes showed that *Helitron* distributions were similar in these genomes, despite the existence of minor variations among different ecotypes (Additional file 1: Figure S8). These 18 ecotypes of *Arabidopsis* genomes are of different lengths; thus, we cannot use their own physical locations for direct comparison. Therefore, the nearest gene downstream of the *Helitron* 3' termini was used as a marker to represent the *Helitron*-inserted loci (Additional file 2: Table S2). A total of 562 loci with markers were found, and 508 of them had polymorphisms (named LOC001–508). All ecotypes sheared 54 loci and owned their unique loci (counted 1 to 14, Table 5), indicating that many active *Helitron* transpose events occurred in these ecotypes (Additional file 2: Table S2).

To investigate whether these *Helitron* distributions informed the relationship between these 18 *A. thaliana* ecotypes, we used the *Helitron* diversity LOCs matrix (Additional file 2: Table S2) and clustered the ecotypes into three main groups (Fig. 7a). Considering their geolocation information (Additional file 2: Table S2), these groups presented some aggregation of geographical

distribution (Fig. 7b). The yellow group (Can-0, Sf-2, and Bur-0) in Fig. 7b, was distributed in Western and Southern Europe, and North Africa (longitude, -13.48 to 3.03); the green group (Ct-1, Po-0, Oy-0, Ler-0, Kn-0, Mt-0, and Wil-2) was distributed in Northern, Central, Southern, and Eastern Europe, and North Africa (longitude, 6.19 to 25; latitude, 32.3 to 60.38); the red group (Ws-0, Zu-0, Hi-0, Wu-0, Rsch-0, Edi-0, except for Tsu-0 of Japan and Col-0 from the USA) were distributed in Western, Central, and Eastern Europe (longitude, - 3.16 to 34; latitude, 47.37 to 56.3). The green group was more widely distributed south-north, whereas the red group was more distributed east-west. The locations of these groups probably indicated the main direction of the spread of A. thaliana subgroups, and the Helitron polymorphism were probably correlated with the adaptation of each ecotypes to its ecological conditions.

To gain insight into the possible effect of *Helitrons*, we performed an associate analysis between the polymorphisms of *Helitrons* and flowering-time type (late type and intermediate type) in 18 ecotypes (Table 5). We found 216 single associating rules (Additional file 2: Table S11) among 13 LOC-paired rules (both 0 and 1) associated with flowing-time type (Table 7, Fig. 7c). Ten genes in upstream and downstream regions of the LOCs were searched with 306 known flowering-time related genes in *Arabidopsis* [42]. We found that two *Helitron* polymorphism loci, LOC006 (near AT1G04425) and LOC458 (near AT5G37230), which belonged to the 13

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Table 6 Predicted CDS-inserted genes by Helitrons in A. thaliana (TAIR10)

Helitron ID	TAIR ID	Descriptions
tr1H72	AT1G12160.1	Flavin-binding monooxygenase family protein
tr1H55	AT1G33520.1	D111/G-patch domain-containing protein; modifier of snc1, 2 (MOS2)
1H74	AT1G62840.1	Protein of unknown function (DUF1442)
tr1H8	AT1G64060.1	respiratory burst oxidase protein F (RBOH F);
2H52	AT2G28840.1	XB3 ortholog 1 in Arabidopsis thaliana (XBAT31)
tr2H6	AT2G40100.1	light harvesting complex photosystem II (LHCB4.3)
2H59	AT2G46770.1	NAC (No Apical Meristem) domain transcriptional regulator superfamily protein; EMBRYO DEFECTIVE 2301 (EMB2301)
tr3H75	AT3G04470.1	Ankyrin repeat family protein
tr3H54	AT3G28740.1	Cytochrome P450 superfamily protein; CYP81D1
tr4H30	AT4G11700.1	Protein of unknown function (DUF626)
tr4H24	AT4G16630.1	DEA(D/H)-box RNA helicase family protein
tr4H8	AT4G33020.1	ZIP metal ion transporter family; ZIP9
tr4H7	AT4G34430.1	DNA-binding family protein; CHB3
tr4H5	AT4G37150.1	methyl esterase 9 (MES9)
tr5H66	AT5G07220.1	BCL-2-associated athanogene 3 (BAG3)
tr5H12	AT5G46530.1	AWPM-19-like family protein
5H74	AT5G66580.1	unknown protein
PtH1	ATCG00700.1	photosystem II reaction center protein N (PSBN)

Bolded genes are unknown function

paired rules, were closely linked with two flowering-related genes Cryptochrome-2 (*CRY2*, AT1G04400) [43] and Circadian 1/Reveille 2 (*CIR1/RVE2*, AT5G37260) [44].

To confirm the *Helitron* LOC diversity of these ecotypes, we cut the LOC006 part of the sequences of all 18 genomes, and the resulting VISTA plot of the LOC005 to LOC006 multiple sequence analysis is presented in Fig. 8. It shows that these two LOCs have different sequence lengths in these ecotypes (same as Fig. 7c and Additional file 2: Table S3) and that the flowering-related gene *CRY2* (AT1G04400) near LOC006 (near AT1G04425) was only two genes away. The analysis might suggest a correlation between *Helitron* insertion and flowering-time phenotypes, and that *Helitron* polymorphisms may be informative for association studies.

# Discussion

Historically, research has focused on the protein-coding genes, and the rest of the genome was considered to be 'junk DNA'. Recently, it has been shown in multiple studies that these 'junk' regions affect biological processes involving miRNA, LncRNA, and TEs [45]. Helitrons are unique rolling-cycle type transposons for which like other transposons, their activation may involve the generation of new genes or regulating existing genes, and potentially affecting phenotype expression [46]. Researching non-coding sequences, such as Helitrons, is an important task as well as studying protein

sequences. Here, we provide another effective toolkit (EAHelitron and related scripts) for researchers to annotate *Helitrons* in sequenced genomes. EAHelitron was found to be fast and was able to find many new *Helitrons* that were not predicted by other programs. With the output GFF files, it was easy to visualize the *Helitron* locations, terminal ends and flanking sequences, and are useful for further study, such as insertion annotation, transposon classification, captured gene identification, model contracture, etc. EAHelitron can expediate the annotation of *Helitrons* in the rapidly increasing number of sequenced plant genomes.

Previous research found that most of *Helitrons* are relatively young with 87% of Basho elements to have originated in the last 5 Myr. This was subsequent to the divergence of *A. thaliana* from its closest relative *A. lyrata* [47], that occurred about 10 Mya [41]. Our *Helitron* homology rate analysis of these two close species also supported a young age of most *Helitrons* (Additional file 2: Table S6). Random sequences analysis for FPR also found that, novel classical terminal ends are not difficult during genome recombination. It suggested that de novo *Helitron* ends near the RepHel motif were probably a source of younger *Helitrons* or lineage-specific *Helitrons* in a species.

Helitrons are important players in the evolution of plant genomes, and therefore genome location information may be useful for future research. Many important species in Brassicaceae have had their whole genome Hu et al. BMC Bioinformatics (2019) 20:354 Page 13 of 20

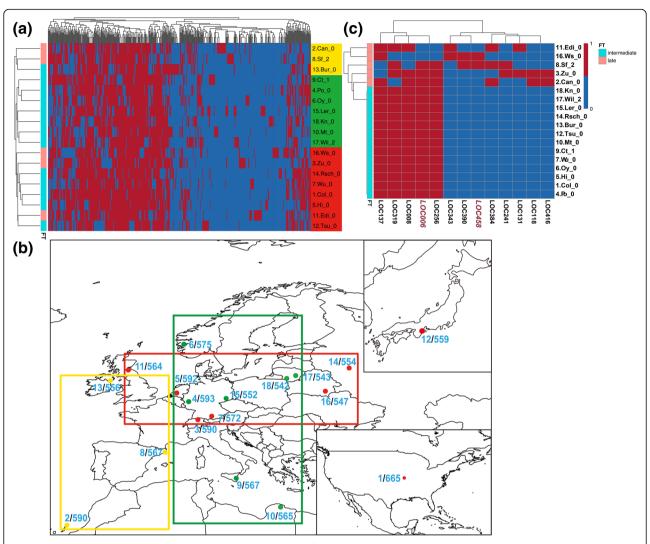
Table 7 Paired rules of Helitron-inserted LOCs that associated with flowering-time types in A. thaliana ecotypes

Left rules	Right rules	support	confidence	lift	ID	Nearest Gene
LOC006 = 0	FT = late	0.111111	1	3.6	LOC006	AT1G04425
LOC006 = 1	FT = intermediate	0.722222	0.8125	1.125	LOC006	AT1G04425
LOC008 = 0	FT = late	0.111111	1	3.6	LOC008	AT1G07450
LOC008 = 1	FT = intermediate	0.722222	0.8125	1.125	LOC008	AT1G07450
LOC118 = 0	FT = intermediate	0.722222	0.8125	1.125	LOC118	AT1G72510
LOC118 = 1	FT = late	0.111111	1	3.6	LOC118	AT1G72510
LOC131 = 0	FT = intermediate	0.722222	0.8125	1.125	LOC131	AT2G01700
LOC131 = 1	FT = late	0.111111	1	3.6	LOC131	AT2G01700
LOC137 = 0	FT = late	0.111111	1	3.6	LOC137	AT2G03990
LOC137 = 1	FT = intermediate	0.722222	0.8125	1.125	LOC137	AT2G03990
LOC241 = 0	FT = intermediate	0.722222	0.8125	1.125	LOC241	AT3G10970
LOC241 = 1	FT = late	0.111111	1	3.6	LOC241	AT3G10970
LOC256 = 0	FT = late	0.111111	1	3.6	LOC256	AT3G27260
LOC256 = 1	FT = intermediate	0.722222	0.8125	1.125	LOC256	AT3G27260
LOC319 = 0	FT = late	0.111111	1	3.6	LOC319	AT3G55970
LOC319 = 1	FT = intermediate	0.722222	0.8125	1.125	LOC319	AT3G55970
LOC343 = 0	FT = intermediate	0.722222	0.8125	1.125	LOC343	AT4G06566
LOC343 = 1	FT = late	0.111111	1	3.6	LOC343	AT4G06566
LOC384 = 0	FT = intermediate	0.722222	0.866667	1.2	LOC384	AT4G17330
LOC384 = 1	FT = late	0.166667	1	3.6	LOC384	AT4G17330
LOC390 = 0	FT = intermediate	0.722222	0.8125	1.125	LOC390	AT4G20510
LOC390 = 1	FT = late	0.111111	1	3.6	LOC390	AT4G20510
LOC416 = 0	FT = intermediate	0.722222	0.8125	1.125	LOC416	AT5G18060
LOC416 = 1	FT = late	0.111111	1	3.6	LOC416	AT5G18060
LOC458 = 0	FT = intermediate	0.722222	0.8125	1.125	LOC458	AT5G37230
LOC458 = 1	FT = late	0.111111	1	3.6	LOC458	AT5G37230

sequenced and are therefore useful for studying the evolution and domestication of these plants. This study noted the distribution and classification of Helitrons predicted in the Brassicaceae genomes. We found that Helitrons like other TEs, accumulate in gene-poor regions [47], and insertions tend not to directly insert into coding regions because most of these events are detrimental to the gene and are therefore selected against. The Brassicaceae Helitrons were concentrated near the centromeres, the regions with low recombination rates, like A. thaliana [18]. Moreover, some Helitrons might be correlated with some domestication traces in genomes. Previous researches showed that, Helitron insertions affect seed coat color of B. rapa [26] and self-compatibility of B. napus [27]. In our study, Helitron-inserted genes in B. rapa were enriched in water transmembrane transport functions, which might explain the high water content of Chinese cabbage (Additional file 5: Table S9). Besides, Helitron-inserted genes in B. napus were enriched in longchain-fatty-acyl-CoA reductase activity (BnaA10g13850D,

BnaC02g09500D, BnaCnng48650D, BnaCnng47950D, and BnaCnng48640D) and other long-chain-fatty-related terms (map00061: Fatty acid biosynthesis, Additional file 5: Table S9), thereby indicating that Helitrons might have contributed to the natural variation of lipid quality during the domestication of B. napus. We took BnaA10g13850D of B. napus Darmor as an example, which was a fatty acid reductase 1 (FAR1, AT5G22500) homologous gene involved in oxidoreductase activity, fatty-acyl-CoA reductase (alcoholforming) activity (Fig. 9a, b). The genomic sequence of BnaA10g13850D was 4768 bp from 5' UTR to 3' UTR (chrA10:11115015-11,119,782, minus strand). An 892-bp Helitron insertion annotated as chrA10H117 in B. napus by EAHelitron, was observed in the first intron (941–1832) of BnaA10g13850D of *B. napus*, compared with its ancestral gene Bra002416 in B. rapa (3884 bp, A10: 9784847-9,788, 730, minus strand). Double low oilseed rape cultivar has long been the objective of domestication. Brassica napus Darmor is a French winter double low oilseed rape cultivar, which lacks detectable erucic acid in the seed oil with low

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**Fig. 7** Helitron inserted LOCs diversity and geographical distribution of 18 A. thaliana ecotypes. **a** Helitron inserted LOCs diversity heatmap and cluster tree, red or blue means that the LOC has a Helitron insertion or not. Left cluster tree is mainly in three groups (yellow, green and red). **b** Geographical distribution of 18 A. thaliana ecotypes painted by rworldmap. Country boundaries are derived from version 1.4.0 of Natural Earth data 1:110 m data (http://www.naturalearthdata.com/downloads/110m-cultural-vectors/110m-admin-0-countries/). The number marks are Helitron density ranking and predicted Helitron numbers. Yellow, green and red points are three clustered groups. **c** Heatmap of 13 paired rules of Helitron LOCs that associated with flowering-time types

seed glucosinolate content [38]. Brassica napus Zhongshang11 (ZS11), an Asian semi-winter oilseed rape cultivar, is also a double low oilseed rape cultivar [48]. This cultivar ZS11 also contained Helitron chrA10H117 in the paralogous gene of BnaA10g13850D (Fig. 9 c, d), suggesting that Helitron insertions may had contributed to the lipid quality to a certain extent in the domestication of B. napus. These Helitron insertions' effects need further research. These results imply that humans probably have selected the genomic variation caused by Helitron insertions. These Helitron insertions of Brassicaceae can be useful for future genetics and molecular breeding selection studies.

Regarding the 18 different ecotype genomes of *A. thaliana*, we found at least 508 active *Helitron* 

suggesting *Helitron*-insertion polymorphisms. Comparing the genomic differences between multiple ecotypes of a species, combined with geographic and environmental information may contribute to the study of species diversity history. And we get similar spread directions of European *A. thaliana* after the ice retreated (east to west, south to north), which previous research reported, starting ~10,000 years ago [49]. This study attempted to use *Helitron* LOC diversity to correlate the phenotypes of the *A. thaliana* ecotypes in terms of flowering time, and we obtained 13 associated locations, including two LOCs near known flowering-related genes. We need further research to determine these *Helitron* insertions'

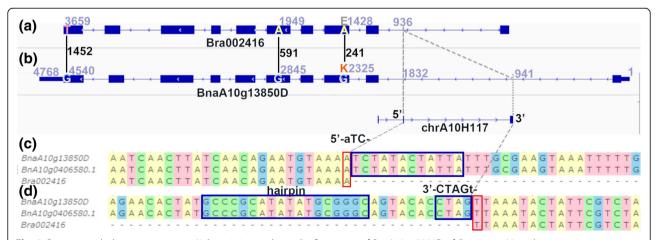
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**Fig. 8** VISTA plot of sequence difference of 18 *A. thaliana* ecotypes (LOC005 to LOC006). The first row is gene annotation of Col-0 as reference. Blue means exon part, light blue means UTR, dark red means conserved sequence. Flowering related gene *CRY2* (AT1G04400) that near the LOC006 is associated with flowering-time phenotype by association analysis

function. It suggested that *Helitron* polymorphisms have the potential applicability in genome wide association studies (GWAS) as a bio-marker, similar to SNP/indel and copy number variation, which will help in improving GWAS maker numbers in samples. In

addition, because of the many single-copy *Helitrons* present in *Arabidopsis*, information regarding the positional variation of single-copy *Helitrons* between different ecotypes is informative for studying the *Helitron* 'cut-and-paste' transposition mechanism.



**Fig. 9** Compare with the ancient gene, a *Helitron* is inserted into the first intron of BnaA10g13850D of *B. napus.* **a** Homologous ancient gene Bra002416 of *B. rapa*, no *Helitron* predicted in the second row. **b** EAHelitron annotated *Helitron* chrA10H117 in the first intron of BnaA10g13850D (second row), form 941 to 1832 (red number using 3'-UTR as start), these homologous genes had three SNPs in CDS, in 241(A/G), 591(A/G) and 145(T/G) (black number using CDS start codon as 1), only the first SNP changes the translation from E (glutamic acid) to K (lysine). **c** *Helitron* 5'-TC terminal. **d** *Helitron* 3' hairpin and CTAG end. The *Helitron* is inserted into an -AT- site

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We annotated thousands of *Helitrons* in the genomes of 53 plants including monocots and eudicots. We did not observe a significant difference between monocots and eudicots, and they both had wide ranges of *Helitron* abundance and genome size. In Xiong's research, they found no sign of correlation between *Helitron* abundance and genome size [4]. In contrast, our study showed that *Helitron* abundance is positively correlated with genome size suggested that *Helitrons*, like other TEs, contribute to changes in genome size [46].

Helitron 5' terminal ends are not as conserved as the 3' ends, and a Helitron may have multiple 5' ends [4], so the predicted full lengths of the Helitrons might not be accurate. The 3' ends with their hairpins played important roles as a transposition terminator [5], thus the number of 3' ends could be a base of a minimum number of total Helitron [18]. Helitron density, calculated using Helitron number and genome size, could be as a more accurate characteristic. We did not find any significant Helitron density related patterns between monocots and eudicots. However, we did find that many closely related species have more changes in Helitron density. As many Helitrons use a 'cut and paste' mechanism, their copy numbers remain low. Genome sequencing and annotation methods might have little effect on the result. For instance, the genome sequence of maize "B73" AGPv3 (6a) was produced by the Maize Genome Sequencing Project, and the alignment of "Mo17" 454 reads to this reference sequence, finally assembled a 2067 Mbp genome (Fig. 3). An entirely new assembly of the maize genome (B73 RefGen\_v4, 2134 Mbp) was further constructed from PacBio Single Molecule Real-Time (SMRT) sequencing, and the genome size of such new version became bigger, but the Helitron number reduced (8622 and 8274, respectively, Table 3, Fig. 3). It was likely the longer reads based on 3GS technology lead to reduce number of repeat sequences in final assembled genomes. In an analysis of seven multiply sequenced genomes, we found that *Helitron* density is probably stable at species level. We also found that Helitron density was not correlated with genome size, which suggested that *Helitron* density is independent from genome size. Based on these results, we consider that Helitron density has potential applicability in species classification. We used de novo assembled scaffolds from NGS data of two A. thaliana T-DNA mutants to determine genome size and Helitron density, then used LDA to identify its species. The two test samples were successfully identified as A. thaliana. Therefore, with the development of new sequencing technology, the Helitron density could be considered as a quick way to identify an unknown plant sample.

The first Angiosperm Phylogeny Group (APG I) classification of the orders and families of flowering plants is a modern molecular-based system of plant taxonomy, which is based on the cladistic analysis of the DNA sequences of two plastid/chloroplast genes (rbcL, atpB) and one gene of ribosomes (18S rDNA) [37]. Although it is based only on molecular evidence, its constituent groups have been further supported by other morphology and chemistry evidence as well. For example, pollen feature supports the split between the eudicots and the rest of the former dicotyledons [50]. The characteristics of Helitrons discussed herein provide genome-scale characteristics which can bolster these classifications. A combination of Helitron density and other plant characters, analyzed with modern machine-learning algorithms, such as artificial neural networks, may be informative for constructing a more accurate phylogenetic tree of plant diversity. We attempted to combine the number of chromosomes with Helitron information. However, the same species may have multiple karyotypes of chromosome numbers, not simply related to genomic features, and so no reliable results were obtained. As further species of plants have their genomes sequenced, Helitron-related features could be employed to study, e.g., the difference between angiosperms and gymnosperms, herbs and woody plants, field and horticultural crops, monocots and eudicots, wild species and domesticated species, adaptation to the environment, etc.

Helitron density may not only represent the tolerance of the host genome to them but may also represent the rate of recombination or self-fertilizing rate of the species. According to previous reports, high self-fertilizing rates reduce the importance of recombination rates on genome structure [19]. In an outcrossing species, new TEs can spread rapidly through a population by recombination via sexual reproduction. In contrast, in self-fertilizing species, recombination is not effective at spreading TEs. New copies are therefore lost by genetic drift and/or purifying selection, and the probability of TE fixation is reduced. This would result in a lower number of new TEs copies in self-fertilizing species [51]. In this study, we compared the *Helitron* density of *B. napus* and its ancestors, B. rapa and B. oleracea, and found that the Helitron density of the B. napus subgenome was lower than that of the ancestral genomes, which may be because the ancestors were both selfincompatible. In this scenario, B. napus have become self-compatible following allopolyploidy in the last 7000 years. Moreover, EAHelitron could probably be applied to animals or other genomes. Also, it can be easily rewritten to search for other genome-wide features, e.g., to find other TEs or tandems, or to

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predict the editable site of the CRISPR/Cas gene editing system, and SSR.

#### **Conclusions**

We developed EAHelitron, which is a fast and efficient tool to identify new *Helitrons*. Whole genome *Helitron* density can be an informative character for plant classification. We predicted thousands of *Helitrons* in Brassicaceae, *Helitron* distribution patterns of most species in this family were similar to *A. thaliana. Helitron* insertion polymorphism could be used in genome wide association studies. This research may contribute to speed up our research of *Helitrons* and understand their role in plant evolution.

#### **Methods**

Extraction of plant genome sequences and phylogenetic data Genome sequences of 40 plants were downloaded from Phytozome version 11 (https://phytozome.jgi.doe.gov). Sequences of 16 Brassicaceae species genomes were downloaded from BARD (http://brassicadb.org/brad) and Ensemble Plant (https://plants.ensembl.org). Eighteen ecotypes of *A. thaliana* were analyzed, and their genomes sequences were downloaded from 1001 Genomes Project (http://1001genomes.org) [52]. Detailed source information for all genome sequences is listed in Add-

itional file 3: Table S4. The phylogenetic trees of 45 ge-

nomes were also obtained from Phytozome version 11,

# Genome sequencing and de novo assembly of LDA samples

and they were edited in TreeGraph2 [53].

Whole genome sequencing of two accessions of mutant *A. thaliana* SALK\_015201 and CS852557, were sequenced by Illumina HiSeq 4000, and a total of 5.7 GB and 9 GB 150-bp paired-end reads sequence data were obtained. Sequence Read Archive IDs are SRR5249176 and SRR5249156. Raw data were cleaned by Trimmomatic [54]. These two de novo draft genomes were assembled using SOAPdenovo 2.40 [55], with kmer values of 81 or 85, named Denovo\_genome\_X (120.2 MB, N50: 25,619, scaffolds: 9888) and Denovo\_genome\_L (121.1 MB, N50: 5064, scaffolds: 3350).

#### Performance testing of EAHelitron

The predicted results from EAHelitron are compared with those from other programs including HelSearch, HelitronScanner and RepeatMasker, based on the genome sequence of *A. thaliana* (TAIR10), a model plant of dicot species. Running time cost was also taken into account when assessing software efficacy. Venn diagram of these results were plotted in jvenn [56]. To estimate the false positive rates (FPR), 100 randomized genomes were created by shuffling the genome sequence of *A. thaliana* (TAIR10) using RandomDNA\_rate.pl (A:T:G:C =

0.319414:0.319033:0.179905:0.180095; length = 119,667, 750 bp, counted by CountATGC.pl). *Helitron* predictions on these randomized genomes are regarded as false positives [18]. The basic version and multi-threading version of EAHelitron, manuals and other assistant scripts are available at GitHub (https://github.com/dontkme/EAHelitron).

#### Helitron visualization and annotation

Using the GFF files extracted from EAHelitron, the Helitrons and Helitron inserted genes were exported to an integrative genomic viewer (IGV) [34]. The output files containing the 3' terminal ends (\*.3.txt) were used to count the number of Helitrons, and Helitron density of the whole genome was defined as the number of Helitrons per Mb. To identify the autonomous Helitrons in Brassicaceae, 20 kb upstream sequence of the 3' ends of the Helitrons were aligned with known RepHel protein domains in A. thaliana and O. sativa using BLASTX (evalue <1e-5). The sequences (1 kb) upstream of the 3' end of the Helitrons were cut and filtered by Cutfa script (no N and exactly 1000 bp sequences). Then BLASTN (evalue <1e-5, qcov > 55, s\_end > 950) was used to search for homologous Helitron sequences. Helitron-inserted locations were clustered using the CompareGFF script, and the GFF from EAHelitron was compared with the general transfer format of its official genome. The functions of the inserted genes were annotated by Blast2GO [57], and the results were combined using WEGO [58].

A heatmap of Gene Ontology (GO) terms was plotted using the pheatmap [59] package in R version 3.3.3 [60]. GO and KEGG pathway enrichment analyses were carried out using TBtools (https://github.com/CJ-Chen/TBtools/, P < 0.001, corrected P < 0.1 and hit genes  $\geq 2$ ) [61]. The multiple sequences alignment was carried out in MUSCLE [62] and UGENE [63]. The presence or absence of LOC005 and LOC006 was visualized in VISTA [64].

# Data analysis

Statistical calculations and graph plotting were performed using R version 3.3.3 [60]. We used the cor.test function for Pearson's product-moment correlation, boot [65] package for bootstrapped p values and r (1000 replicates, seed: 1234). Chisq.test function for chi-squared test. Linear discriminant analysis (LDA) was used to estimate the capability of Helitron density as a characteristic in plant system classification. Genome sequences of 34 varieties from seven species groups were trained using lda function of MASS package, and two de novo genomes were added as test samples [66]. For hierarchical clustering, hclust function with 'median' method was used to draw the Brassicaceae dendrogram. Using the SWcount script, sliding window analysis (window = 1

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Mb, step = 500 kb) was carried out to investigate the local scale density of *Helitron* and genes.

To investigate the distribution of *Helitrons* in different ecotypes of A. thaliana, we selected the seeds of 18 ecotypes from different countries in the Arabidopsis Biological Resource Center. After 45 days of growing, the seedlings were photographed and their flowering-time types were recorded (Table 5). To identify the nearest genes of each Helitron as markers, 500 bp sequences downstream of Helitrons were BLASTNed against Arabidopsis TAIR10 (Col-0) coding sequence (CDS) (evalue <1e-5, q\_star < 450). The genes showing similarity obtained from BLASTing and these polymorphisms loci were named LOC001 to LOC508, and were clustered in R. Geographical distribution of 18 A. thaliana ecotypes were painted by rworldmap [67], country boundaries were derived from version 1.4.0 of Natural Earth data 1:110 m data (http://www.naturalearthdata.com/downloads/110mcultural-vectors/110m-admin-0-countries/). analysis between the *Helitron* insertion polymorphisms and flowering-time types in 18 ecotypes was performed, using the apriori function of the arules package (maxlen = 3, support > 0.1, confidence > 0.8, lift > 1.1) [68].

# **Additional files**

Additional file 1: Figure S1. TAIR10 predicted *Helitrons* from RepeatMasker and EAHelitron in IGV. Figure S2. Correlation of genome size, *Helitron* number and *Helitron* density of 51 genomes (exclude maize and *B. napus*). Figure S3. Dot plot of LDA samples. Figure S4. Dot plot of genome size and *Helitron* densities of 16 Brassicaceae genomes. Figure S5. Brassicaceae phylogenetic trees. Figure S6. *Helitron* insertion examples in IGV. Figure S7. The 45 day live plant photos of 18 *A. thaliana* ecotypes. Figure S8. *Helitron* distribution of 18 *A. thaliana* ecotype genomes. (PPTX 6583 kb)

Additional file 2: Table S1. EAHelitron uniquely predicted *Helitrons* and polymorphisms loci. Table S2. All *Helitron* LOCs and nearest TAIR ID of 18 Ath ecotypes with phenotypes. Table S3. False positive rate of *Helitron* programs (100 random sequences). Table S5. RepHel percent of *Helitrons* in Brassicaceae. Table S6. Six Brassicaceae genomes *Helitron* 3' end upstream 1 kbp sequences homology rate. Table S7. Brassicaceae gene density correlation of *Helitron* density (window = 1 Mb, step = 500 kb). Table S10. TAIR10 predict *Helitron* inserted into intron or UTR genes. Table S11. The 216 single rules associated with Flowering-Time types. (XLSX 139 kb)

Additional file 3: Table S4. All Genomes information. (XLSX 34 kb)
Additional file 4: Table S8. Brassicaceae *Helitron* inserted genes.
(XLSX 4171 kb)

**Additional file 5: Table S9.** GO and KEGG pathway enrichment of Brassicaceae *Helitron* inserted genes. (XLSX 33 kb)

#### Abbreviations

Aly: Arabidopsis Iyrata; APG: Angiosperm Phylogeny Group; Ath: Arabidopsis thliana; Bna: Brassica napus; Bol: Brassica olerracea; Bra: Brassica rapa; CDS: coding sequence; Cru: Capsella rubella; Csa: Camelina sativa; FPR: False positive rates; GFF: General feature format; GO: Gene ontology; GTF: General transfer format; GWAS: Genome wide association studies; IGV: Integrative genomic viewer; LDA: Linear discriminant analysis; Mya: Million years ago; NGS: Next-generation sequencing; RCR: Rolling-circle replication; SNP: Single nucleotide polymorphism; TE: Transposable element; Tpa: Thellungiella parvula; Tsa: Thellungiella salsuginea; UTR: Untranslated region

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#### Authors' contributions

JT designed the study. KH developed the program and analyzed the data. KX contributed to sample sequencing. KH and YO wrote the manuscript. JW, BY, CM, JS, and TF supervised the study. All authors read and approved the final manuscript.

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#### Availability of data and materials

The scripts developed as part of the study are available at GitHub (https://github.com/dontkme/EAHelitron). The raw data of two accessions of mutant A. thaliana SALK\_015201 and CS852557, was deposited at NCBI SRA database under accession SRR5249176 and SRR5249156. All A. thaliana seeds are ordered from Arabidopsis Biological Resource Center (ABRC). Other datasets generated or analyzed during this study are included in this published article and its supplementary information files.

#### Ethics approval and consent to participate

Not applicable.

#### Consent for publication

Not applicable.

#### **Competing interests**

No competing interests.

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