### **Open Access**

# LncRNA evolution and DNA methylation variation participate in photosynthesis pathways of distinct lineages of *Populus*

Jiaxuan Zhou<sup>1,2,3</sup>, Fangyuan Song<sup>1,2,3</sup>, Yuling He<sup>1,2,3</sup>, Wenke Zhang<sup>1,2,3</sup>, Liang Xiao<sup>1,2,3</sup>, Wenjie Lu<sup>1,2,3</sup>, Peng Li<sup>1,2,3</sup>, Mingyang Quan<sup>1,2,3</sup>, Deqiang Zhang<sup>1,2,3</sup> and Qingzhang Du<sup>1,2,3\*</sup>

<sup>1</sup> State Key Laboratory of Tree Genetics and Breeding, College of Biological Sciences and Technology, Beijing Forestry University, No. 35, Qinghua East Road, Beijing 100083, P. R. China

<sup>2</sup> Key Laboratory of Genetics and Breeding in Forest Trees and Ornamental Plants, Ministry of Education, College of Biological Sciences and Technology, Beijing Forestry University, No. 35, Qinghua East Road, Beijing 100083, P. R. China

\* Corresponding author, E-mail: QingzhangDu@bjfu.edu.cn

#### Abstract

During the independent process of evolution in plants, photosynthesis appears to have been under convergent evolution to adapt to specific selection pressure in their geographical regions. However, it is unclear how lncRNA regulation and DNA methylation are involved in the phenotypic convergence in distinct lineages. Here, we present a large-scale comparative study of lncRNA transcription profile and whole-genome bisulfite sequencing (WGBS) data in two unrelated *Populus* species, selected from three relatively overlapping geographical regions. The results indicated that 39.75% lncRNAs of *Populus tomentosa* were shown to have homologous sequences in the 46.99% lncRNA of *Populus simonii*. Evolutionary analysis revealed that lncRNAs showed a rapid gain rate in the *Populus* lineage. Furthermore, co-expression networks in two *Populus* species identified eight lncRNAs that have the potential to simultaneously *cis*- or *trans*-regulate eight photosynthetic-related genes. These photosynthetic lncRNAs and genes were predominantly expressed in accessions from the southern region, indicating a conserved spatial expression in photosynthetic pathways in *Populus*. We also detected that most lncRNA targeted photosynthetic genes hypomethylated in promoter regions of Southern accessions compared with Northern accessions. Geographical DMRs correlated with genetic SNP variations in photosynthetic genes among *Populus* from the three geographic regions, indicating that DNA methylation coordinated with lncRNAs in convergent evolution of photosynthesis in *Populus*. Our results shed light on the evolutionary forces acting on patterns of lncRNA and DNA methylation, and provide a better understanding of the genetic and epigenetic mechanism in photosynthetic convergence evolution.

Citation: Zhou J, Song F, He Y, Zhang W, Xiao L, et al. 2023. LncRNA evolution and DNA methylation variation participate in photosynthesis pathways of distinct lineages of *Populus. Forestry Research* 3:3 https://doi.org/10.48130/FR-2023-0003

### INTRODUCTION

Convergent evolution has been extensively reported in cases of humans<sup>[1]</sup>, woody plants<sup>[2]</sup>, cereal crops<sup>[3]</sup>, and Orchidaceae plants<sup>[4]</sup>. Many morphological and physiological traits have been undergoing strong convergent selection, especially in plants. Most convergent traits are not linked to core metabolism<sup>[5]</sup>, but photosynthesis is one of the exceptions<sup>[6]</sup>. Biochemical pathways involved in the capture of atmospheric carbon is more variable than sequestration of light energy. Thus, investigation of genetic and epigenetic regulatory mechanisms canalizing the convergent evolution in photosynthetic pathways, such as non-coding RNAs and DNA methylation is critical for plants' growth and development during long-term local environment adaptation.

In recent years, long non-coding RNAs (IncRNAs) was regarded as one of the important regulators of gene expression of multiple biological processes<sup>[7–9]</sup>. Several studies have shown that IncRNAs involved in the photosynthesis process. For example, one *Arabidopsis* IncRNA *HIDDEN TREASURE 1* (*HID1*) acts through *PHYTOCHROMEINTERACTING FACTOR 3* (*PIF3*), which promotes photomorphogenesis in continuous red

light<sup>[10]</sup>. In the anthocyanin-associated coloration pathway, IncRNA *MdLNC610* upregulate the expression level of *MdAC01* by increasing the ethylene production and anthocyanin levels under high-light treatment<sup>[11]</sup>. Moreover, IncRNAs evolve rapidly and are poorly conserved among distantly related species<sup>[12,13]</sup>. LncRNA evolutionary analysis provides great benefit to the understanding of the functions of IncRNAs and the evolution of regulatory networks. The function of ancient IncRNAs may regulate embryonic development and conserved IncRNAs in IncRNA families probably function in many fundamental processes<sup>[14]</sup>. However, how IncRNAs play roles of adaptative evolution in lineage plants, and to what extent can IncRNAs carry similar functions in photosynthetic pathways in plants, remains largely unknown.

The function of lncRNAs in regulating gene expression can be affected by genetic and epigenetic variation<sup>[15–17]</sup>. DNA methylation is one of the vital epigenetic modifications that is widespread in the genome of eukaryotes<sup>[18]</sup>. DNA methylation is heritable during the change of development or affected by environmental conditions. Their adaptive variation may directly evolve through adaptive responses to a changing environment or arise from adaptive genetic variation. Environment-induced

<sup>&</sup>lt;sup>3</sup> The Tree and Ornamental Plant Breeding and Biotechnology Laboratory of National Forestry and Grassland Administration, College of Biological Sciences and Technology, Beijing Forestry University, No. 35, Qinghua East Road, Beijing 100083, P. R. China

epigenetic variation may be limited and restricted to certain regions of the genome during the inheritance<sup>[19]</sup>. The epiallele near the functional gene in the maintainenance of chloroplast structures participate in the regulation of many genes associated with photosynthesis processes<sup>[20]</sup>. Over long timescales, genetic variations affect DNA methylation pattern, and associated with segregating structural variants or with mutations in methyltransferase genes<sup>[21]</sup>. LncRNAs could guide DNA methylation and silence target genes, investigation of the DNA methylation status would enhance the understanding of the regulatory roles of IncRNAs<sup>[22]</sup>. The expression level of IncRNA was also tightly linked with DNA methylation during the plants development and adaptation to the environment<sup>[23]</sup>. Yet, more investigations are still needed to unearth the epigenetic variation underlying photosynthetic pathways to response to local adaptation and its IncRNA relevance in the related species.

In this study, transcriptome analysis was performed to systematically identify IncRNAs and characterize their expression patterns in two unrelated Populus species, P. tomentosa and P. simonii. The convergent emergence or loss of photosynthetic phenotypes may facilitate adaptation to ecologically similar environments. The regulatory roles of the IncRNAs were investigated by co-expression between IncRNAs and their target genes enriched in photosynthetic pathways. Based on the evolutionary analysis of IncRNAs of nine diverse plant species including P. tomentosa, P. simonii, Populus trichocarpa, Salix purpurea, Arabidopsis thaliana, Glycine max, Oryza sativa, Zea mays, and Physcomitrella patens, we identified rapid evolvement even between closely related plants. Also, the potential DNA methylation and adaptive DNA sequences that can be subject to evolutionary divergence as methylation variation correlated with SNP variation. The transcription of IncRNAs target genes is fine-tuned through epigenetic modifications. As a result, photosynthetic genes are representative of adaptive evolution governed by the joint and complementary actions of IncRNAs and epigenetic processes.

### **MATERIAL AND METHODS**

#### Plant materials and phenotypic data measurement

Ten *P. tomentosa* accessions and ten *P. simonii* accessions were collected from their natural population clonal garden in Guan Xian County, Shandong Province, China (36°10' N, 114°35' E). The sampling accessions were selected from the Southern (S), Northwestern (NW), and Northeastern (NE) geographical regions according to their natural distribution<sup>[24,25]</sup>. In 2019, tree seedlings were planted with three replicates in the same location using the root segment technique.

The measurement for photosynthetic traits were taken on a Li-COR 6400XT portable photosynthesis system (Lincoln, NE, USA). The leaf chamber conditions were: light intensity 1,000  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup> PAR and flow 400  $\mu$ mol·s<sup>-1</sup>. Only mature leaves of each plant were measured. All sampling was measured on clear, sunny days between 09:00 and 11:00 in June, 2019. The measurement was performed using three replications per individual. We measured net photosynthetic rate (Pn,  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup>), conductance to H<sub>2</sub>O (Cond, mol·m<sup>-2</sup>·s<sup>-1</sup>), intercellular CO<sub>2</sub> concentration (Ci,  $\mu$ mol·mol<sup>-1</sup>), and transpiration rate (Trmmol,  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup>). Water use efficiency (WUE) was determined by photosynthetic rate over transpiration<sup>[26]</sup>. All measured leaves for each individual were collected, frozen in liquid nitrogen, and stored at –80 °C until use.

### RNA isolation, RNA-sequencing and expression analysis

Total RNAs were isolated from leaves of both *P. tomentosa* and *P. simonii* samples using the Plant Qiagen RNeasy kit which were used for RNA-seq (Methods S1). The clean reads of *P. tomentosa* were mapped to the *P. tomentosa* reference genome, and the clean reads of *P. simonii* were mapped to *P. trichocarpa* reference genome v4.0 (www.phytozome.net) using Hisat2 version2.1.0<sup>[27]</sup> (Supplemental Table S2). FPKM (fragments per kilobase of transcript per million fragments) values were calculated by Cufflinks v2.1.1<sup>[28]</sup>. The edgeR software package<sup>[29]</sup> was employed to identify differentially expressed genes (DEGs) between pairs of samples from different geographical regions of *P. tomentosa* and *P. simonii*, respectively, with FDR ≤ 0.05 and fold change ≥ 1.

### Identification of IncRNAs and prediction of their target Protein-coding genes (PCGs)

In this study, we integrated RNA-seg data sets of ten P. tomentosa and ten P. simonii, respectively. Each transcriptome was assembled separately by StringTie2<sup>[30]</sup> and merged by affcompare, while the transcript with FPKM > 0.5, length > 200, coverage > 1 was filtered. Coding Potential Calculator2 (CPC2) software<sup>[31]</sup>, Coding Noncoding Index (CNCI) software<sup>[32]</sup>, and PLEK<sup>[33]</sup> were used to evaluate the coding potential of the remaining transcripts. All transcripts with CPC2 labeled as 'coding', or CNCI > 0, or PLEK scores > 0 were discarded. Finally, the class code 'u' refers to the long intergenic noncoding RNAs (lincRNAs), class code 'x' refers to long noncoding natural antisense transcripts (IncNAT), class code 'j' refers to the sense transcripts, and class code 'i' refers to the intronic transcripts. Differentially expressed IncRNAs were calculated in the same way as DEGs above. The GC contents of these IncRNAs were calculated with the GEECEE tool in EMBOSS<sup>[34]</sup>.

Homologous transcription of lncRNA between lncRNAs transcripts of *P. tomentosa* and *P. simonii* was performed using the BLASTN software. Alignments with E-value < 1e-5, coverage > 50%, identity > 80% were identified as Conserved lncRNA. Otherwise, lncRNAs were denoted as species-specific lncRNAs.

#### **Target PCGs prediction of IncRNAs**

The potential target genes of lncRNAs were predicted *via cis* and *trans* analyses. PCGs around lncRNAs within 10 kb upstream or downstream in genome position were pointed as the potential *cis*-target genes<sup>[35,36]</sup>. The potential *trans*-targets in the *Populus* PCGs database was based on PCGs sequence complementarity and RNA duplex energy predictions. First, protein sequences of lncRNAs target PCGs in *P. tomentosa* and *P. simonii* were used as query sequences in BLASTN with E-value < 1e-5 and identity > 80% to identify homologs. Then RNAplex was used to screen lncRNA–PCGs (duplexes RNAplex - E-60) that exhibited complementary base pairing<sup>[37]</sup>.

#### Network construction of co-expressed transcripts

The WGCNA 1.70.3 package in R<sup>[38]</sup> was used to construct the unsigned co-expression network. One-step network construction and module detection method were adopted in both *P. tomentosa* and *P. simonii* with the following parameters: the minModuleSize was 100, and the cut height was 0.25. The soft power was 5 and 12 in *P. tomentosa* and *P. simonii* networks, respectively. To relate traits to the network, we calculated correlations between module eigengenes and the five photosynthetic traits.

#### LncRNA evolution and DNA methylation in Populus

#### Data source

FASTA sequences for the lncRNAs from nine plants were downloaded from CANTATAdb2.0 and NCBI. 2,990 lncRNAs of *Populus trichocarpa* from Ye et al.<sup>[39]</sup>, 2003 lncRNAs from *Physcomitrella patens* NCBI annotation (www.ncbi.nlm.nih.gov/ genome/?term=Physcomitrella+patens), 3,270 lncRNAs from *Oryza sativa* NCBI annotation (www.ncbi.nlm.nih.gov/geno me/?term=Oryza+sativa), 5,355 lncRNAs from *Zea mays* NCBI annotation (www.ncbi.nlm.nih.gov/genome/?term=Zea+ mays), the 4,070 predicted lncRNAs of *Salix purpurea* from CANTATdb 2.0 database, 3,365 lncRNAs from *Glycine max* NCBI annotation (www.ncbi.nlm.nih.gov/genome/?term=Glycine+ max), and 3,480 lncRNAs from *Arabidopsis thaliana* NCBI annotation (www.ncbi.nlm.nih.gov/genome/?term=Arabidop sis+thaliana).

### Phylogenetic tree construction and inference of the birth, death, and age of IncRNA families

To gain insight into lncRNA evolution in plants, nine plants were used for comparisons. First, the phylogenetic tree was obtained *via* OrthoFinder. Single-copy lncRNAs were aligned using nucleotide sequence by MAFFT, and a species tree was built using IQTREE with the default parameters. r8s was performed to establish an ultrametric tree (chronogram) using species tree rooted with *Physcomitrella patens*. The birth, death, age, and ancestral contents of lncRNA families were assessed *via* COUNT software<sup>[40]</sup> using Dollo-Parsimony with default settings.

#### Whole-genome bisulfite sequencing analysis

Total DNA of ten *P. tomentosa* accessions and ten *P. simonii* was extracted from the collected leaves. DNA extraction was performed using a DNase Plant Mini Kit (Qiagen China, Shanghai, China) for whole-genome bisulfite sequencing analysis. The libraries were sequenced on the Illumina HiSeq 4000, and the sequencing reads were filtered using Trimmomatic<sup>[6]</sup>. Paired-end reads of *P. tomentosa* and *P. simonii* genomes were aligned to *P. tomentosa* and *P. trichocarpa* V4.0 genome respectively using Bismark (version 0.16.1)<sup>[41]</sup> with the default parameters. Methylation cytosine sites with less than five methylated reads were removed. Integrative Genomics Viewer software<sup>[42]</sup> was used to visualize the DNA methylation Dataset. MethylKit were used to identified Differentially methylated regions (DMRs)<sup>[43]</sup> (Methods S2).

### SNP genotype calling and positional association analysis with DNA methylation

A total of ten accessions of *P. tomentosa* and *P. simonii* were sequenced on the Illumina GA II platform with an average depth of 15-fold genome coverage. The clean data were collected by removing low-quality reads (< 10% of nucleotides with quality < Q20). The paired-end data were aligned to the *P*. tomentosa and P. trichocarpa V4.0 reference genome using Bowtie 2 software with default parameters<sup>[44]</sup>. Samtools and Genome Analysis Toolkit (GATK) were used to perform single nucleotide polymorphisms (SNPs) calling. Low-quality SNPs that missing data ≥ 20% were filtered. 12,651,394 and 4,996,309 high-quality SNPs were retained for further analysis. To determine the relationship between DMRs and SNPs, we computed a one-sided permutation test between each pair of DMRs and SNPs within 2 kb upstream and downstream of each DMR. A DMR was determined to correlate with SNPs when there are at least three SNPs significant correlates with this DMR (one-sided permutation *p*-value < 0.01).

### RESULTS

### Photosynthetic variation in *P. tomentosa* and *P. simonii* accessions

The shape of leaves were associated with photosynthetic abilities of plants and probably contribute to photosynthetic differences of different species<sup>[45-47]</sup>. P. tomentosa and P. simonii accessions displayed considerable variation in size and shape of leaves (Fig. 1a). As there was considerable macroscopic variation in leaf characteristics, we next investigated whether differences observed in features affected photosynthetic performance. Interestingly, there were statistically significant differences in net photosynthetic rate ( $P = 2.18 \times$ 10<sup>-4</sup>), conductance to H<sub>2</sub>O ( $P = 1.77 \times 10^{-3}$ ), and intercellular  $CO_2$  concentration ( $P = 4.0 \times 10^{-3}$ ) among two Populus. For all accessions, photosynthetic traits varied greatly especially in P. tomentosa, with coefficients of variation (CV) values ranging from 9.48% (Conductance to H2O) to 38.79% (Water use efficiency). Additionally, all five phenotypic traits showed significant differentiation among the geographical regions of both P. tomentosa and P. simonii (P < 0.05, post-test by LSD) (Supplemental Table S1). For example, the net photosynthetic rate of accessions from the Southern region in both Populus was significantly higher than those from the Northern regions (Fig. 1b). This showed that photosynthetic variation between accessions from geographical regions in P. tomentosa and P. simonii may be partly due to the underlying selective pressure in their environments<sup>[48]</sup>. Therefore, differences in transcripts expression and regulatory networks are critical to determining interspecific and intraspecific phenotypic variation.

## Genome-wide identification, characterization, and expression profile of IncRNAs in *P. tomentosa* and *P. simonii* accessions

To obtain a comprehensive profile of IncRNAs in different Populus species, we assembled transcriptome using the strandspecific RNA-seq data from ten P. tomentosa accessions and ten P. simonii accessions. In total, we identified a total of 1,600 and 1,013 high-confidence IncRNAs in P. tomentosa and P. simonii, respectively (Data S1, S2). Four classes of IncRNAs were identified, and the majority of them were long intergenic noncoding RNAs (lincRNAs) and long noncod natural antisense transcripts (IncNATs) in both species (Fig. 2a). We then investigated the characters and expression profile of these IncRNAs between two species. The IncRNAs are unevenly distributed across the 19 chromosomes of both Populus species, and there was no difference in GC content between P. tomentosa (37.13%) and P. simonii (37.35%) for IncRNA (Fig. 2b). According to genomic locations, the IncRNAs of P. tomentosa range in length from 230 to 13,266 nucleotides(nt), with a median length of 2,009 nt that is significantly shorter than the median length (2,255 nt) of P. simonii (Fig. 2c). On average, the IncRNAs of P. simonii contain a significantly fewer exons than the P. tomentosa IncRNAs. As expected, most of the IncRNAs comprised fewer exons (> 50% consist of one exon) than PCGs (Fig. 2d).

### The evolution and expression of IncRNAs with intraspecific variation between *Populus* species

To evaluate lncRNA differences between *Populus* species and intraspecific variation, we analyzed the lncRNAs expression of each accession of both *Populus* species. The expression level of the lncRNAs from both species was lower than for the PCGs<sup>[28]</sup>



**Fig. 1** Morphological and photosynthetic variation of *Populus tomentosa* and *Populus simonii* from different geographical regions. (a) Leaf size and shape of *P. tomentosa* and *P. simonii* from the Southern geographical region (S), the Northwestern geographical region, and the Northeastern geographical region (NE). Numbers represent accession number in its geographical region. Scale bar, 5 cm. (b) Photosynthetic traits of *P. tomentosa* (blue) and *P. simonii* (orange) from three geographical regions. Photosynthetic traits include net photosynthetic rate (Pn), conductance to H<sub>2</sub>O (Cond), intercellular CO<sub>2</sub> (Ci), transpiration rate (Tr), and water use efficiency (WUE). Data represent means  $\pm$  SE. \*, *p* < 0.05; \*\*, *p* < 0.01; \*\*\*, *p* < 0.001.



**Fig. 2** Identification and characterization of IncRNAs in two *Populus* species. (a) Percentage distribution of different classifications of the total IncRNAs in *Populus tomentosa* and *Populus simonii*. (b) The GC content of IncRNAs and protein-coding genes (PCGs) in *P. tomentosa* and *P. simonii*. (c) Length density distributions of IncRNAs and PCGs. The x-axis indicates the log10-transformed sequence length and the y-axis indicates the density value. (d) Percentage distribution of exon numbers for PCGs and IncRNAs.

(Fig. 3a). The overall expression levels of IncRNAs in *P. simonii* were lower than that of *P. tomentosa*. We next identified the differentially expressed IncRNAs and PCGs between geographical regions in both species (Data S3–S6). Intriguingly, differentially expressed IncRNAs from *P. tomentosa* (41.25%–45.06%) and *P. simonii* (10.86%–17.47%) occupied a large proportion in their total IncRNAs, but PCGs had a lower expression variation ratio among geographical regions (*P. tomentosa*, 8.18%–12.20%; *P. simonii*, 3.88%–7.36%) (Fig. 3b).

LncRNAs are highly diverged at the nucleotide level among plant species but may have high sequence conservation at the intraspecies and interspecies levels. IncRNA orthologous pairs were identified through reciprocal best hits, and they were connected using the single-linkage clustering method to construct IncRNA families. The phylogenetic tree revealed that the evolution of the IncRNAs spaned around 277 Myrs (million years). We identified 1,033 IncRNA families with a total of 3,775 conserved InRNAs. We then sought to investigate the birth and death rates and the ancestor IncRNA families during the plant evolution. Among these IncRNA families, the number of IncRNA families increased from 12 ancestral families to 35–557 families in all the plant species (Fig. 3c). Notably, terminal branches gained more families than internal branches, particularly in Salicaceae trees. The highest net gain rates in recent terminal branches in Salicaceae trees ranging from 1.65 to 5.02 families  $Myr^{-1}$ , indicating a high rate of novel lncRNA families in forest trees. In addition, 482 (47.58%), 669 (22.39%), and 746 (18.33%) lncRNAs of *P. tomentosa* were found to be conservation in *P. simonii*, *P. trichocarpa*, and *Salix purpurea*, respectively. These results suggested that most lncRNAs were conserved between *P. tomentosa* and *P. simonii* despite rapid gene fractionation.

To explore whether lncRNAs contribute to evolutionary pressures on plant photosynthesis, we compared conserved lncRNAs with species-specific lncRNAs in two *Populus* species. Using the reciprocal align features of BLASTN, there are 3,305 homoeologous lncRNA pairs between *P. tomentosa* and *P. simonii* (Fig. 3d; Data S7). We found that 39.75% lncRNA of *P. tomentosa* had homologous copies in the 46.99% lncRNAs of *P. simonii*. These results suggested that the vast majority of lncRNAs were species-specific or limited to closely related species.

To identify genes potentially regulated by IncRNAs and the potential effects of IncRNAs, we identified 685 and 452 IncRNA-PCGs pairs in *P. tomentosa* and *P. simonii*, respectively. Expression analysis on the IncRNAs-PCGs pairs showed that 81.46% and 80.09% of them have a positive correlation  $(|\mathbf{r}_p| \ge 0.6, P <$ 



**Fig. 3** Expression profiles and evolution of lncRNAs in *Populus tomentosa* and *Populus simonii*. (a) Box plot of expression levels of lncRNAs and protein-coding genes (PCGs) in *P. tomentosa* and *P. simonii*. Student t-test was used to calculate the *p*-value. \*\*\* p < 0.001. (b) The numbers of differentially expressed (DE) lncRNAs in *P. tomentosa* and *P. simonii* between accessions from the Southern geographical region and the Northwestern geographical region, the Southern geographical region and the Northwestern geographical region. (c) Phylogenetic tree and number of gene families displaying expansion (green) and contraction (red) among nine plant species. Branch lengths reflect evolutionary divergence times in million years (Myrs) inferred from timetrees. Numbers of gained (+) and lost (-) lncRNA families Myr<sup>-1</sup> (in red) are indicated next to each branch. (d) The distribution of chromosomes (outer) and lncRNAs (inner) in *P. tomentosa* (blue) and *P. simonii* (red). The green lines in the inner rings show lnRNAs that were homoeologous in two *Populus* lineages. (e), (f) Scatter plots of Pearson correlation coefficient and *p*-value between the expressions of the lncRNAs and their target PCGs in *P. tomentosa* and *P. simonii*. The lncRNA-mRNA with correlation coefficient  $\ge 0.6$  (red) or  $\le -0.6$  (blue), and *p*-value  $\le 0.05$  are considered positive or n

0.05) in two *Populus* species (Fig. 3e, f). On average, the  $r_p$  between expression of *P. tomentosa* lncRNAs and their targets PCGs (0.48) was higher than that between adjacent PCGs pairs (0.38), which was similar to lncRNA-random PCG pairs (0.39). These correlations were much stronger than those of PCG-random PCG pairs (0.18) (Supplemental Fig. S1a). Moreover, the ratio of extreme expression correlation ( $|r_p| > 0.8$ ) for lncRNA-PCG pairs (25.84%) was higher than those of lncRNA-random PCG pairs (19.09%) and PCG-random PCG pairs (23.54%) (Supplemental Table S2). Similar results were observed in *P. simonii* (Supplemental Fig. S1b).

## LncRNA participates in the regulation network of photosynthetic variation between *P. tomentosa* and *P. simonii*

Although photosynthesis is one of the basic biochemical reactions of plants, they exhibit dramatic differences in multiple characteristics. Differences in gene expression and regulatory networks are critical for determining photosynthesis traits. We performed a weighted gene co-expression network analysis

(WGCNA) on PCGs and IncRNAs. Accordingly, we obtained 16 and 13 distinctly expressed modules in P. tomentosa and P. simonii, respectively (Fig. 4a, b). The modules closely related to photosynthetic traits and GO term were of particular interest in this study. 'Photosynthesis, light reaction' (GO:0019684) and 'photosynthesis' (GO:0015979) GO terms were enriched in the subset of PCGs in MEbrown of P. tomentosa network and MEturquoise of P. simonii network (Fig. 4c; Supplemental Fig. S2; Data S8, S9). In P. tomentosa, the module 'Brown' comprised transcripts that were restrained in Northern regions (Fig. 4d). For seven genes enriched in photosynthetic terms, four hub genes including PtoPPL1, PtoLHCA1, PtoPnsb4, and PtoMPH2 were highlighted in the network due to their high eigengene connectivity (Supplemental Table S3). Among those hubgenes, we noted a cis-regulated and three trans-regulated IncRNAs, which were differentially expressed between distinct geographical regions (Fig 4e). In P. simonii, expression of IncRNAs and PCGs in module 'turquoise' was also highly expressed in the Southern geographical region. Three of the nine photosynthe-



Fia. 4 Photosynthetic-associated modules in Populus tomentosa and Populus simonii. Statistical analysis of module-trait correlations in (a) P. tomentosa and (b) P. simonii. The rows and columns indicate the modules and traits, respectively. Cells are colored from blue to red according to the Pearson correlation coefficient in parentheses, and the star-marked cells indicate the highest significant association between the trait and its corresponding module. (c) Circos plot shows the enrichment and differentially expressed genes in each ontology of Module Brown in P. tomentosa. From the outer to the inner circle, is gene ontology (GO) id, number of genes and P -value, number of differentially expressed genes, and enrichment factors. (d) Box plot and beewarm plot of expression levels of IncRNAs and protein-coding genes (PCGs) in Module Brown from P. tomentosa and Module turquoise from P. simonii. Student t-test was used to calculate the p-value. \*\*\* p < 0.001, \*\* p < 0.01. (e) Scatter plots show correlation between the expression of PtoMPH2 and net photosynthetic rate, expression of Pto\_XLOC\_013503 and net photosynthetic rate, and between expression of PtoMPH2 and Pto\_XLOC\_013503. Pto\_XLOC\_013503 positively regulate a chloroplast thylakoid lumen protein, PtoMPH2. r, Pearson correlation coefficient; p, significance of the correlation between trait and gene expression. (e) Scatter plots show correlation between the expression of PtoMPH2 and net photosynthetic rate, expression of Pto\_XLOC\_013503 and net photosynthetic rate, and between expression of PtoMPH2 and Pto\_XLOC\_013503. r, Pearson correlation coefficient; p, significance of the correlation between trait and gene expression. (f) Scatter plots show correlation between the expression of PtoKUP1 and net photosynthetic rate, expression of Pto XLOC 022701 and net photosynthetic rate, and between expression of PtoKUP1 and Pto XLOC 022701. r, Pearson correlation coefficient; P, significance of the correlation between trait and gene expression.

#### LncRNA evolution and DNA methylation in Populus

tic-enriched genes were highlighted as high eigengene connectivity, including *PsiLHCB7*, *PsiPSBR*, and *PsiKUP1* (Supplemental Table S3). Gene *PsiKUP1*, a photosynthetic protein pathway gene that encodes a high-affinity potassium transporter, exhibited the highest expressed level in the S region as compared with NW and NE regions (Fig 4f). Meanwhile, we demonstrated that Psi\_XLOC\_022701 in the S region was more than two times higher expression than those accesions in the N region, indicating that Psi\_XLOC\_022701 may *trans*-regulate *PsiKUP1*.

### Similar expression patterns of homologous IncRNAs in *P. tomentosa* and *P. simonii*

Conserved IncRNAs across species can provide further information to demonstrate their possible functions and the processes<sup>[49,50]</sup>. Combining the results of co-expression analysis and the origination of IncRNAs in two poplars, we were able to update the putative interspecies and intraspecies expression of the IncRNAs involved in the photosynthesis pathway (Data S3). For P. tomentosa, Pto\_XLOC\_026190 was highly expressed in the S region (Fig. 5a) and trans-regulated Ptom.010.01955 (facilitates the assembly of the photosystem II supercomplexes, PtoPPL1) (Fig. 5b). The regional differentiation was potentially similar to the patterns of Psi\_XLOC\_011671 homologous IncRNA (Fig. 5c), which positively regulated Potri.007G061400 (encoding a light stimulus response gene, PsiNIP2) (Fig. 5d). Moreover, another Pto XLOC 001831 that contained two homologous IncRNA pairs in *P. simonii* was predicted to target Ptom.012.00615 (encoding a subunit of the chloroplast NAD(P)H dehydrogenase complex, which involved in PSI cyclic electron transport, PtoPnsB4). We found that PtoPnsB4 was highly expressed in the NE region for P. tomentosa. Additionally, homologous IncRNAs of Pto\_XLOC\_001831 in P.

simonii also targeted two photosynthetic-related genes including *PsiPSBR* and *PsiLHCB7*. This can be inferred that Pto\_XLOC\_001831 showed high similarity with Psi\_XLOC\_022416 and may have functions in the regulatory network of photosynthesis. Both lncRNAs were highly expressed in the S region compared to the NE region. These phenomena indicated that Pto\_XLOC\_001831 was an evolutionarily more important lncRNA than Pto\_XLOC\_026190 in *P. tomentosa* (Fig. 5e). It also suggested that the regulatory module is highly conserved across different poplar species and may be functionally maintained.

### The differences in DNA methylation between three geographical regions in *P. tomentosa* and *P. simonii*

Many studies have found that DNA methylation level correlated with the expression level of PCGs. The covariation of DNA methylation and other genetic factors causes phenotypic variation during plants' growth and development<sup>[51-53]</sup>. To investigate the divergence of genomic DNA methylation on photosynthetic variation, we analyzed the difference in methylation patterns associated with photosynthetic variations in P. tomentosa and P. simonii accessions. More than 100 million cytosines were sequenced in each sample, a number sufficient for further analysis (Supplemental Table S4). P. tomentosa displayed an average of 66.31%, 46.85%, 3.75% methylation in CG, CHG, and CHH contexts, respectively. Correspondingly, P. simonii presented a mean level of 40.34%, 32.55%, and 4.81% methylation in CG, CHG, and CHH contexts, respectively. We detected distinct differences in CV among three contexts, with the lowest diversity for CG context and the highest for CHH context (Supplemental Table S5). Accessions from the same geographical regions were often closely correlated, especially in CG context (Supplemental Fig. S3a, S3b). These results





**Fig. 5** LncRNAs have positive regulatory roles for photosynthetic genes and working model of Psi\_XLOC\_022416. (a) Pto-XLOC\_026190 and its regulatory gene (b) *PtoPPL1*. The RNA-seq coverage of the genes was extracted from the leaf transcriptomes of *P. tomentosa* accessions from the Southern geographical region (S), the Northwestern geographical region (NW), and the Northeastern geographical region (NE), and the numbers in the panel indicate the mapping read counts of junction reads or exonic reads. (c) Psi-XLOC\_011671 and its regulatory gene (d) *PtoNIP1*. The RNA-seq coverage of the genes was extracted from the leaf transcriptomes of *P. simonii* accessions from the Southern geographical region (S), the Northwestern geographical region (NW), and the Northeastern geographical region (NE), and the numbers in the panel indicate the mapping read counts of junction reads or exonic reads. (e) A proposed working model of Psi\_XLOC\_022416 in regulating *PsiPSBR* and *PsiLHCB7* expression to modulate *Populus* photosynthetic variation in different geographical regions.

indicated that both *Populus* accessions possessed significant methylation variability and could contribute to trait variation.

We identified DMRs to further investigate the differences in DNA methylation between three geographical regions in *P. tomentosa* and *P. simonii*. Our analysis identified 51,892, 61,161, and 28,981 DMRs in S vs. NW, S vs.NE, and NW vs. NE in *P. tomentosa*, respectively (Supplemental Table S6). Hypo-DMRs accounted for 54.82%–82.04% of the total DMRs. Similarly, for *P. simonii*, 23,840 and 34,400 hyper-DMRs were found in NW and NE regions when compared with the accessions from S region, suggesting that the lower methylation in Southern regions in both *P. tomentosa* and *P. simonii* (Fig. 6a). It is noteworthy that, despite DMRs in intergenic regions, 16.05%

and 16.65% of DMRs occurred in promoters, suggesting that geographical regions might affect DNA methylation within promoter regions (Supplemental Fig. S4a).

### Division of *Populus* photosynthesis involved in genomic DNA methylation patterns

Based on the presence of IncRNAs and genes with DMRs (designated as differentially methylated genes, DMGs), we identified IncRNA targets that were related to DNA methylation variation. Abundant DMGs (70.00% and 52.40%) were identified in the total IncRNA target genes in *P. tomentosa* and *P. simonii* (Supplemental Fig. S4b), including 464 and 255 DEGs differentially expressed between geographical regions (Supplemental



**Fig. 6** Geographical variation of DNA methylation and genetic variation affect the function of lncRNA. (a) Count of hyper and hypo differentially methylated regions (DMRs) in *P. tomentosa* and *P. simonii* from three geographical regions in three contexts. (b), (c) Integrative Genomics Viewer plots of WGBS tracks in accessions from the Southern geographical region (S), the Northwestern geographical region (NW), and the Northeastern geographical region (NE), as well as RNA-seq tracks over (b) *PtoPnsB4* and (c) *PtoLHCA1*. The position of the DMRs is indicated by the pink shadow area. (d) Circos plot representing interaction DMR-SNP pairs. The circles show the structure of gene *PtoPnsB4*. Blue, green, purple, white, and yellow arcs represent promoter, untranslated region (UTR), exon, intron, and downstream region, respectively. Interior lines represent the pairwise interactions of DMR-SNP pairwise. Orange, red, and blue lines indicate intra-gene interactions of different DMRs between DMR-SNP pairs. (e) A proposed working model that DNA methylation variation participates in the regulation of Pto\_XLOC\_001831that modulates *Populus* convergence evolution of photosynthesis.

Fig. S4c). To further investigate whether the balance between DNA methylation and lncRNAs is responsible for the natural variation of photosynthetic traits, we investigated the expression and the methylation patterns among different geographical regions of two species. Our study found several lncRNA-targeted DMGs that hypomethylated in the promoter regions of southern accessions (Supplemental Table S7).

To explore the genetic variation and DNA methylation that affect the function of IncRNA in regulating its target genes, we further analyzed the relationship between DMRs and SNP in P. tomentosa and P. simonii (Supplemental Table S8; Data S10, S11). We identified 339 strong correlated pairs (P < 0.01,  $r^2 >$ 0.1) between DMR and SNPs range from 2 to 102 in P. tomentosa (Supplemental Fig. S5a). Among these signals, a large proportion of SNPs 60.5% were identified in flanking regions and intergenic regions, only 24.21% of correlated SNPs were from promoter sequences and 9.47% from exon sequences. In P.simonii, we found one DMR correlated with three SNPs distributed in the intron and promoter (Supplemental Fig. S5b). We detected a regulatory model that showed the function of DNA methylation and genetic variation affecting the effect of IncRNAs on gene expression. For example, Pto\_XLOC\_001831 was higher expression in S regions compared with NE, but was not differentially expressed in NW region. The promoter regions of its target, PtoPnsB4, showed that the accessions from the NE region had higher methylation levels than the accessions from the S. This hypermethylation in NE accessions inhibited the gene expression in PtoPnsB4 (Fig. 6b). Two CG DMRs in promoter and downstream flanking regions of *PtoPnsB4* are strongly associated with one and three SNPs in the exon region (Fig. 6d). Interestingly, SNP-12-7790159 (TT) correlated with hypo-methylated DMR in the promoter region in S and NE geographical regions. In comparison to the accessions from the NW, SNP-12-7790159 caused a missense variant resulted in the substitution of Tyr to His. Missense variant in gene transcript together with promoter DNA methylation inhibited the function of Pto\_XLOC\_001831 of gene and caused a lower expression level in PtoPnsB4 in accessions from NW regions (Fig. 6e). In addition, the homologue of PtoLHCA1 in P. simonii was hypermethylated in the NE region compared with the S region in CHH context (Fig. 6c). This homologue encodes a component of the lightharvesting complex associated with photosystem I. These results indicated a general coherence of interspecific genetic and epigenetic modification in photosynthetic pathways in two Populus species.

### DISCUSSION

### Evolution of IncRNA between two closely related *Populus* species

Increasing numbers of progress have been made in elucidating important roles of plant non-coding RNAs due to their extensive abundance. LncRNA has evolved in multiple molecular mechanisms to survive abiotic stress, such as water stress<sup>[54]</sup>, temperature extremities<sup>[55]</sup>, salinity<sup>[39]</sup>, and heavy metal toxicity<sup>[56]</sup>, etc. This study covered two *Populus* species, *P. tomentosa* and *P. simonii*, representing *Populus* sections white poplar and Tacamahaca Spach, which have similar natural geographical distribution in China. Compared with PCGs, IncRNAs had fewer exons, shorter mean lengths of exons, and

were less abundantly expressed across the conditions in two species (Fig. 2c, d), suggesting a similar characteristic among two *Populus* species. Furthermore, plants evolved different lncRNAs expression abundance in response to distinct geographical climates. PCGs and lncRNA pairs have shown a significant contribution of lncRNA in a strong regulatory manner on gene expression<sup>[49,55]</sup>.

It is long been confusing on the evolutionary conservation of IncRNAs, their high levels of sequence divergence make them hard to study. In stark contrast to PCGs, only a small portion of IncRNA sequences (1.8%–52.6%) is conserved across nine species. LncRNAs in Salicaceae trees lack known orthologs in species outside of monocot plants, indicating poor conservation of IncRNAs<sup>[57,58]</sup>. We use three closely related *Populus* species *P. tomentosa*, *P. simonii*, and *P. tritrocarpa* to minimize the effects of genomic sequence divergence. LncRNAs are more frequently gained than lost, and the highest net gain rate was identified in the recent terminal *Populus* species. These results suggested that IncRNA transcription evolved extremely rapidly between closely related plants. The transience of intergenic IncRNA transcription is mirrored by changes to selective pressures acting on their sequences.

### The regulatory network of photosynthetic pattern involving IncRNA and DNA methylation in *Populus*

Forest trees experienced photosynthetic divergence as a direct response to landscape processes and heterogeneity of habitat. The threshold of temperature and limitation of precipitation may vary substantially with local environmental conditions, which leads to heterogeneous responses in tree biological adaptation of tree growth. The convergence of leaf photosynthetic characteristics in distinct lineages may contribute to the persistence of species in the adjacent environment in forests or similar geographical environmental constraints. Insights into photosynthesis and plants' geographical distribution provide valuable information to investigate plant-environment interactions during their long historical evolution<sup>[59,60]</sup>. Molecular genetics studies have shown that IncRNAs involved in the precise control of light-mediated development. MLNC3.2 and MLNC4.6 are predicted as endogenous target mimic for miRNA to regulate the expression of the SPL2-like and SPL33 transcription factors during light-induced anthocyanin biosynthesis and involve photosynthesis<sup>[61]</sup>. Thus, studying photosynthesis-associated modules would be more informative. The coexpression network analysis in P. tomentosa and P. simonii showed that genes involved in 'photosynthesis, light reaction' and 'photosynthesis' were enriched in MEbrown from P. tomentosa co-expression network and MEturquoise from P. simonii co-expression network, respectively. LncRNA expressions from accessions of the south region involving photosynthetic pathways were higher than accessions from the northern region, suggesting a conserved spatial-induced expression of IncRNAs in plants<sup>[62,63]</sup>. For MEbrown module in P. tomentosa, we discovered a IncRNA Pto\_XLOC\_013503 was coexpressed with *PtoMPH2*, and the expression pattern varies among geographical regions. This indicates that the effect of genes and IncRNAs may differ among geographical regions in photosynthetic efficiency and affect growth acclimation under photo-inhibitory light and fluctuating light environments<sup>[64]</sup>. We also found that Psi\_XLOC\_022416 in P. simonii has transcriptional regulatory relationships with PsiLHCB7 which

can be strongly expressed when light harvesting is limiting for plant growth<sup>[65]</sup>. *AtLHCB7* is also associated with the threshold of light-saturated photosynthesis rate and irradiance threshold for induction of photoprotective non-photochemical quenching<sup>[66]</sup>. Intriguingly, functional orthologs were found in homolog pairs Pto\_XLOC\_001831-Psi\_XLOC\_022416. These homologs were not found outside three Salicaceae species but were shown to have similar functions in photosynthetic pathways. We note these homologs as 'functional orthologs', which may have similar functions but have a poor ancestral relationship.

Epigenetic variation is tightly linked to environmental and fitness differences, implying its involvement in adaptive evolution<sup>[67,68]</sup>. In this study, *Populus* samples were well distinguished into three clusters by DNA methylation which were consistent with the origin of accessions. Interestingly, DNA methylation of accessions from the South was lower than those from the Northern accessions in both Populus species (Fig. 6c). Thus, DNA methylation is involved in the variation of Populus from different geographical regions. In photosynthetic genes, we found that PtoLHCA1, PtoPnsB4, and PsiLHCB7 were all hypomethylated in the Southern region, demonstrating that DNA methylation may act as a regulator in plants' light harvesting process. The differentiated expression patterns of these genes across the three geographic regions (Fig. 6d, e) imply that the transcriptional regulation of photosynthetic may also undergo DNA methylation variation creating P. tomentosa ecotypes.

### Characterization of interspecies variation in two *Populus* species and their evolution

LncRNA works as a regulator by recruiting DNA methyltransferases or demethylases to regulate the target gene transcription. Some IncRNAs are involved in chromatin modification and RNA-directed DNA methylation (RdDM)<sup>[69,70]</sup>. Theoretical and empirical data showed that the stress responsiveness to fitness traits is typically an interactive modification process of genetic and epigenetic, in which epigenetic signatures are deeply interwoven with DNA sequence polymorphism<sup>[71,72]</sup>. Drought stress-dependent flowering vigor in the same altitudinal gradient reinforces SNP-DMC associations in adaptive evolution<sup>[73]</sup>. Patterns of correlation between promising selected DMRs and nearby SNPs assign causality DMRs associated with the flowering time traits and are consistent with the idea that many DMRs are the result of genetic changes for maize<sup>[74,75]</sup>. In this study, strong SNP-DMR correlation pairs were found when DMRs were involved in epigenetic variation between geographical regions (Fig. 6d), particularly when the co-varying SNPs were in promoter regions and protein-coding regions. Functional variants of genomic regions may have experienced strong selection pressure responsible for local adaptation within the species' widespread natural distribution<sup>[24,76]</sup>. We reveal distinct types of regulation between IncRNA modulators and target genes that are operative either in one species or across species<sup>[77]</sup>. The deregulation of Pto\_XLOC\_001831 expression in NE was associated with alterations in DNA methylation and genetic variation<sup>[78]</sup>. A missense variant and hypermethylation in the promoter region participate in the regulation of gene expression. On the contrary, the genetic locus can encode a suppressor program that is enforced by the IncRNA independent of the protein product of the locus despite the modification of DNA methylation<sup>[79]</sup>. DNA methylation regulates lncRNA expression to determine the dysregulation of the gene. A lncRNA arising from the *CEBPA* gene locus could compete with DNA methyltransferases, which inhibits *CEBPA* gene methylation and facilitates *CEBPA* expression<sup>[80]</sup>. These results provided valuable candidate allelic genes for regional breeding programs to improve photosynthetic efficiency in *Populus*.

Collectively, using two Populus species that contain accession from three geographical regions, our results suggest a meaningful functional role for IncRNA and DNA methylation variation in the photosynthetic convergent evolution of Populus. The comparison of geographical regions could inform on the adaptive potential of two closely related Populus species in the evolution process. However, further investigation is required to make conclusive statements concerning the evolutionary basis of DNA methylation with genetic variation. Further investigation of the mechanism underlying the recruitment of DNA methylation through IncRNAs to affect genome-wide patterns of gene regulation is warranted. Therefore, the gene editing technology of CRISPR-Cas9<sup>[81]</sup> and the methylation editing technology of CRISPR-dCas9<sup>[82]</sup> will help to determine the trigger for the deep-seated mechanism of naturally occurring IncRNAs and epigenetic variation and may provide a useful source of regulatory variation for tree improvement.

### ACKNOWLEDGMENTS

This work was supported by the Major Science and Technology project of Inner Mongolia Autonomous Region (No. 2021ZD0008), Natural Science Foundation of Beijing Municipality (No. 6212021), National Natural Science Foundation of China (No. 31872707), Key research and development project of Zhejiang Province (No. 2021C02054), Fok Ying Tung Education Foundation of China (No. 171020) and the 111 Project (No. B20050).

### **Conflict of interest**

The authors declare that they have no conflict of interest.

**Supplementary Information** accompanies this paper at (https://www.maxapress.com/article/doi/10.48130/FR-2023-0003)

#### Dates

Received 30 November 2022; Accepted 11 January 2023; Published online 6 February 2023

### REFERENCES

- Adhikari K, Mendoza-Revilla J, Sohail A, Fuentes-Guajardo M, Lampert J, et al. 2019. A GWAS in Latin Americans highlights the convergent evolution of lighter skin pigmentation in Eurasia. *Nature Communications* 10:358
- Fontes CG, Fine PVA, Wittmann F, Bittencourt PRL, Piedade MTF, et al. 2020. Convergent evolution of tree hydraulic traits in Amazonian habitats: implications for community assemblage and vulnerability to drought. *New Phytologist* 228:106–20
- 3. Li B, Förster C, Robert CAM, Züst T, Hu L, et al. 2018. Convergent evolution of a metabolic switch between aphid and caterpillar resistance in cereals. *Science Advances* 4:eaat6797

#### LncRNA evolution and DNA methylation in Populus

- 4. Xu Y, Lei Y, Su Z, Zhao M, Zhang J, et al. 2021. A chromosome-scale *Gastrodia elata* genome and large-scale comparative genomic analysis indicate convergent evolution by gene loss in mycoheterotrophic and parasitic plants. *The Plant Journal* 108:1609–23
- Chen WK, Chen L, Zhang X, Yang N, Guo JH, et al. 2022. Convergent selection of a WD40 protein that enhances grain yield in maize and rice. *Science* 375:eabg7985
- 6. Bolger AM, Lohse M, Usadel B. 2014. Trimmomatic: a flexible trimmer for Illumina sequence data. *Bioinformatics* 30:2114–20
- 7. Kim ED, Sung S. 2012. Long noncoding RNA: unveiling hidden layer of gene regulatory networks. *Trends in Plant Science* 17:16–21
- Ariel F, Romero-Barrios N, Jégu T, Benhamed M, Crespi M. 2015. Battles and hijacks: noncoding transcription in plants. *Trends in Plant Science* 20:362–71
- 9. Wierzbicki AT, Blevins T, Swiezewski S. 2021. Long Noncoding RNAs in Plants. *Annual Review of Plant Biology* 72:245–71
- Wang Y, Fan X, Lin F, He G, Terzaghi W, et al. 2014. Arabidopsis noncoding RNA mediates control of photomorphogenesis by red light. PNAS 111:10359–64
- Yu J, Qiu K, Sun W, Yang T, Wu T, et al. 2022. A long noncoding RNA functions in high-light-induced anthocyanin accumulation in apple by activating ethylene synthesis. *Plant Physiology* 189:66–83
- Kutter C, Watt S, Stefflova K, Wilson MD, Goncalves A, et al. 2012. Rapid Turnover of Long Noncoding RNAs and the Evolution of Gene Expression. *Plos Genetics* 8:e1002841
- Liu J, Jung C, Xu J, Wang H, Deng S, et al. 2012. Genome-Wide Analysis Uncovers Regulation of Long Intergenic Noncoding RNAs in Arabidopsis. The Plant Cell 24:4333–45
- Necsulea A, Soumillon M, Warnefors M, Liechti A, Daish T, et al. 2014. The evolution of IncRNA repertoires and expression patterns in tetrapods. *Nature* 505:635–40
- Kulkarni S, Lied A, Kulkarni V, Rucevic M, Martin MP, et al. 2019. CCR5AS IncRNA variation differentially regulates CCR5, influencing HIV disease outcome. *Nature Immunology* 20:824–34
- Xiao S, Cao S, Huang Q, Xia L, Deng M, et al. 2019. The RNA N<sup>6</sup>methyladenosine modification landscape of human fetal tissues. *Nature Cell Biology* 21:651–61
- Fang J, Lutz JA, Wang L, Shugart HH, Yan X. 2020. Using climatedriven leaf phenology and growth to improve predictions of gross primary productivity in North American forests. *Global Change Biology* 26:6974–88
- Zemach A, McDaniel IE, Silva P, Zilberman D. 2010. Genome-wide evolutionary analysis of eukaryotic DNA methylation. *Science* 328:916–19
- Schmid MW, Heichinger C, Coman Schmid D, Guthörl D, Gagliardini V, et al. 2018. Contribution of epigenetic variation to adaptation in Arabidopsis. *Nature Communications* 9:4446
- 20. Wei X, Song X, Wei L, Tang S, Sun J, et al. 2017. An epiallele of rice AK1 affects photosynthetic capacity. *Journal of Integrative Plant Biology* 59:158–63
- 21. Vidalis A, Živković D, Wardenaar R, Roquis D, Tellier A, et al. 2016. Methylome evolution in plants. *Genome Biology* 17:264
- 22. Matzke MA, Mosher RA. 2014. RNA-directed DNA methylation: an epigenetic pathway of increasing complexity. *Nature Reviews Genetics* 15:394–408
- 23. Xu W, Yang T, Wang B, Han B, Zhou H, et al. 2018. Differential expression networks and inheritance patterns of long non-coding RNAs in castor bean seeds. *The Plant Journal* 95:324–40
- 24. Du Q, Yang X, Xie J, Quan M, Xiao L, et al. 2019. Time-specific and pleiotropic quantitative trait loci coordinately modulate stem growth in *Populus*. *Plant Biotechnology Journal* 17:608–24
- 25. Ci D, Song Y, Du Q, Tian M, Han S, et al. 2016. Variation in genomic methylation in natural populations of *Populus simonii* is associated with leaf shape and photosynthetic traits. *Journal of Experimental Botany* 67:723–37

Zhou et al. Forestry Research 2023, 3:3

- McKown AD, Guy RD, Klápště J, Geraldes A, Friedmann M, et al. 2014. Geographical and environmental gradients shape phenotypic trait variation and genetic structure in *Populus trichocarpa*. *New Phytologist* 201:1263–76
- Kim D, Paggi JM, Park C, Bennett C, Salzberg SL. 2019. Graph-based genome alignment and genotyping with HISAT2 and HISATgenotype. *Nature Biotechnology* 37:907–15
- Cabili MN, Trapnell C, Goff L, Koziol M, Tazon-Vega B, et al. 2011. Integrative annotation of human large intergenic noncoding RNAs reveals global properties and specific subclasses. *Genes Develop*ment 25:1915–27
- Robinson MD, McCarthy DJ, Smyth GK. 2010. edgeR: a Bioconductor package for differential expression analysis of digital gene expression data. *Bioinformatics* 26:139–40
- Kovaka S, Zimin AV, Pertea GM, Razaghi R, Salzberg SL, et al. 2019. Transcriptome assembly from long-read RNA-seq alignments with StringTie2. *Genome Biology* 20:278
- Kang Y, Yang D, Kong L, Hou M, Meng Y, et al. 2017. CPC2: a fast and accurate coding potential calculator based on sequence intrinsic features. *Nucleic Acids Research* 45:W12–W16
- 32. Sun L, Zhang Z, Bailey TL, Perkins AC, Tallack MR, et al. 2012. Prediction of novel long non-coding RNAs based on RNA-Seq data of mouse Klf1 knockout study. *BMC Bioinformatics* 13:331
- Li A, Zhang J, Zhou Z. 2014. PLEK: a tool for predicting long noncoding RNAs and messenger RNAs based on an improved k-mer scheme. BMC Bioinformatics 15:311
- 34. Rice P, Longden I, Bleasby A. 2000. EMBOSS: the European molecular biology open software suite. *Trends Genet* 16:276–77
- Jia H, Osak M, Bogu GK, Stanton LW, Johnson R, et al. 2010. Genome-wide computational identification and manual annotation of human long noncoding RNA genes. *RNA* 16:1478–87
- Tian J, Song Y, Du Q, Yang X, Ci D, et al. 2016. Population genomic analysis of gibberellin-responsive long non-coding RNAs in *Populus. Journal of Experimental Botany* 67:2467–82
- Tafer H, Amman F, Eggenhofer F, Stadler PF, Hofacker IL. 2011. Fast accessibility-based prediction of RNA-RNA interactions. *Bioinformatics* 27:1934–40
- Langfelder P, Horvath S. 2007. Eigengene networks for studying the relationships between co-expression modules. *BMC Systems Biology* 1:54
- Ye X, Wang S, Zhao X, Gao N, Wang Y, et al. 2022. Role of IncRNAs in *cis*- and *trans*-regulatory responses to salt in *Populus trichocarpa*. *Plant Journal* 110:978–93
- Csűös M. 2010. Count: evolutionary analysis of phylogenetic profiles with parsimony and likelihood. *Bioinformatics* 26:1910–12
- Krueger F, Andrews SR. 2011. Bismark: a flexible aligner and methylation caller for Bisulfite-Seq applications. *Bioinformatics* 27:1571–72
- 42. Thorvaldsdóttir H, Robinson JT, Mesirov JP. 2013. Integrative Genomics Viewer (IGV): high-performance genomics data visualization and exploration. *Briefings in Bioinformatics* 14:178–92
- 43. Akalin A, Kormaksson M, Li S, Garrett-Bakelman FE, Figueroa ME, et al. 2012. methylKit: a comprehensive R package for the analysis of genome-wide DNA methylation profiles. *Genome Biology* 13:87
- 44. Langmead B, Salzberg SL. 2012. Fast gapped-read alignment with Bowtie 2. *Nature Methods* 9:357–59
- 45. Tang S, Dong Y, Liang D, Zhang Z, Ye C, et al. 2015. Analysis of the drought stress-responsive transcriptome of black cottonwood (*Populus trichocarpa*) using deep RNA sequencing. *Plant Molecular Biology Reporter* 33:424–38
- Scoffoni C, Chatelet DS, Pasquet-kok J, Rawls M, Donoghue MJ, et al. 2016. Hydraulic basis for the evolution of photosynthetic productivity. *Nature Plants* 2–16072
- Lusk CH, Wright I, Reich PB. 2003. Photosynthetic differences contribute to competitive advantage of evergreen angiosperm trees over evergreen conifers in productive habitats. *New Phytologist* 160:329–36

- Wang HV, Chekanova JA. 2017. Long Noncoding RNAs in Plants. In Long Non Coding RNA Biology. Advances in Experimental Medicine and Biology, ed. Rao M. vol 1008. Singapore: Springer. pp. 133–54. https://doi.org/10.1007/978-981-10-5203-3\_5
- 49. Wang H, Niu QW, Wu HW, Liu J, Ye J, et al. 2015. Analysis of noncoding transcriptome in rice and maize uncovers roles of conserved IncRNAs associated with agriculture traits. *The Plant Journal* 84:404–16
- Golicz AA, Singh MB, Bhalla PL. 2018. The Long Intergenic Noncoding RNA (LincRNA) Landscape of the Soybean Genome. *Plant Physiology* 176:2133–47
- Ganguly DR, Crisp PA, Eichten SR, Pogson BJ. 2017. The Arabidopsis DNA Methylome Is Stable under Transgenerational Drought Stress. *Plant Physiology* 175:1893–912
- 52. Shen Y, Zhang J, Liu Y, Liu S, Liu Z, et al. 2018. DNA methylation footprints during soybean domestication and improvement. *Genome Biology* 19:128
- 53. Shi Y, Zhang X, Chang X, Yan M, Zhao H, et al. 2021. Integrated analysis of DNA methylome and transcriptome reveals epigenetic regulation of CAM photosynthesis in pineapple. *BMC Plant Biology* 21:14
- 54. Ramírez Gonzales L, Shi L, Bergonzi SB, Oortwijn M, Franco-Zorrilla JM, et al. 2021. Potato CYCLING DOF FACTOR 1 and its IncRNA counterpart *StFLORE* link tuber development and drought response. *The Plant Journal* 105:855–69
- 55. Yuan J, Li J, Yang Y, Tan C, Zhu Y, et al. 2018. Stress-responsive regulation of long non-coding RNA polyadenylation in *Oryza* sativa. The Plant Journal 93:814–27
- Quan M, Liu X, Xiao L, Chen P, Song F, et al. 2021. Transcriptome analysis and association mapping reveal the genetic regulatory network response to cadmium stress in *Populus tomentosa*. *Journal* of *Experimental Botany* 72:576–91
- Hezroni H, Ben-Tov Perry R, Meir Z, Housman G, Lubelsky Y, et al. 2017. A subset of conserved mammalian long non-coding RNAs are fossils of ancestral protein-coding genes. *Genome Biology* 18:15
- Deng J, Kong W, Mou X, Wang S, Zeng W. 2018. Identifying novel candidate biomarkers of RCC based on WGCNA analysis. *Personalized Medicine* 15:381–94
- 59. Ishii H, Yoshimura KI, Mori A. 2009. Convergence of leaf display and photosynthetic characteristics of understory *Abies amabilis* and *Tsuga heterophylla* in an old-growth forest in southwestern Washington State, USA. *Tree Physiology* 29:989–98
- 60. van Bezouw RFHM, Keurentjes JJB, Harbinson J, Aarts MGM. 2019. Converging phenomics and genomics to study natural variation in plant photosynthetic efficiency. *The Plant Journal* 97:112–33
- Yang T, Ma H, Zhang J, Wu T, Song T, et al. 2019. Systematic identification of long noncoding RNAs expressed during lightinduced anthocyanin accumulation in apple fruit. *The Plant Journal* 100:572–90
- 62. Washietl S, Kellis M, Garber M. 2014. Evolutionary dynamics and tissue specificity of human long noncoding RNAs in six mammals. *Genome Research* 24:616–28
- 63. Tao X, Li M, Zhao T, Feng S, Zhang H, et al. 2021. Neofunctionalization of a polyploidization-activated cotton long intergenic non-coding RNA *DAN1* during drought stress regulation. *Plant Physiology* 186:2152–68
- 64. Liu J, Last RL. 2017. A chloroplast thylakoid lumen protein is required for proper photosynthetic acclimation of plants under fluctuating light environments. *PNAS* 114:E8110–E8117
- Klimmek F, Sjödin A, Noutsos C, Leister D, Jansson S. 2006. Abundantly and rarely expressed *Lhc* protein genes exhibit distinct regulation patterns in plants. *Plant Physiology* 140:793–804

- 66. Peterson RB, Schultes NP. 2014. Light-harvesting complex B7 shifts the irradiance response of photosynthetic light-harvesting regulation in leaves of *Arabidopsis thaliana*. *Journal of Plant Physiology* 171:311–18
- Kawakatsu T, Huang SC, Jupe F, Sasaki E, Schmitz RJ, et al. 2016. Epigenomic diversity in a global collection of *Arabidopsis thaliana Accessions*. *Cell* 166:492–505
- De Kort H, Panis B, Deforce D, Van Nieuwerburgh F, Honnay O. 2020. Ecological divergence of wild strawberry DNA methylation patterns at distinct spatial scales. *Molecular Ecology* 29:4871–81
- Ariel F, Jegu T, Latrasse D, Romero-Barrios N, Christ A, et al. 2014. Noncoding transcription by alternative RNA polymerases dynamically regulates an auxin-driven chromatin loop. *Molecular Cell* 55:383–96
- Wang M, Yuan D, Tu L, Gao W, He Y, et al. 2015. Long noncoding RNAs and their proposed functions in fibre development of cotton (*Gossypium* spp.). *New Phytologist* 207:1181–97
- Rakyan VK, Down TA, Balding DJ, Beck S. 2011. Epigenome-wide association studies for common human diseases. *Nature Reviews Genetics* 12:529–41
- 72. Lu W, Xiao L, Quan M, Wang Q, El-Kassaby YA, et al. 2020. Linkagelinkage disequilibrium dissection of the epigenetic quantitative trait loci (epiQTLs) underlying growth and wood properties in Populus. *New Phytologist* 225:1218–33
- 73. De Kort H, Toivainen T, Van Nieuwerburgh F, Andrés J, Hytönen TP, et al. 2022. Signatures of polygenic adaptation align with genomewide methylation patterns in wild strawberry plants. *New Phytologist* 235:1501–14
- Eichten SR, Briskine R, Song J, Li Q, Swanson-Wagner R, et al. 2013. Epigenetic and genetic influences on DNA methylation variation in maize populations. *The Plant Cell* 25:2783–97
- 75. Xu G, Lyu J, Li Q, Liu H, Wang D, et al. 2020. Evolutionary and functional genomics of DNA methylation in maize domestication and improvement. *Nature Communications* 11:12
- Xiao L, Du Q, Fang Y, Quan M, Lu W, et al. 2021. Genetic architecture of the metabolic pathway of salicylic acid biosynthesis in Populus. *Tree Physiology* 41:2198–215
- 77. Yang Z, Xu F, Wang H, Teschendorff AE, Xie F, et al. 2021. Pancancer characterization of long non-coding RNA and DNA methylation mediated transcriptional dysregulation. *EBioMedicine* 68:103399
- 78. Yang Y, Chen L, Gu J, Zhang H, Yuan J, et al. 2017. Recurrently deregulated IncRNAs in hepatocellular carcinoma. *Nature Communications* 8:14421
- 79. Marney CB, Anderson ES, Adnan M, Peng KL, Hu Y, et al. 2021. p53intact cancers escape tumor suppression through loss of long noncoding RNA *Dino. Cell Reports* 35:109329
- Di Ruscio A, Ebralidze AK, Benoukraf T, Amabile G, Goff LA, et al. 2013. DNMT1-interacting RNAs block gene-specific DNA methylation. *Nature* 503:371–76
- Zhou X, Jacobs TB, Xue LJ, Harding SA, Tsai CJ. 2015. Exploiting SNPs for biallelic CRISPR mutations in the outcrossing woody perennial Populus reveals 4-coumarate: CoA ligase specificity and redundancy. *New Phytologist* 208:298–301
- Vojta A, Dobrinic P, Tadic V, Bockor L, Korac P, et al. 2016. Repurposing the CRISPR-Cas9 system for targeted DNA methylation. Nucleic Acids Research 44:5615–28

