Exploring Genomic Variations in Nematode-Resistant Mutant Rice Lines

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Rice (Oryza sativa) production is seriously affected by the root-knot nematode Meloidogyne graminicola, which has emerged as a menace in upland and irrigated rice cultivation systems. Previously, activation tagging in rice was utilized to identify candidate gene(s) conferring resistance against M. graminicola. T-DNA insertional mutants were developed in a rice landrace (acc. JBT 36/14), and four mutant lines showed nematode resistance. Whole-genome sequencing of JBT 36/14 was done along with the four nematode resistance mutant lines to identify the structural genetic variations that might be contributing to M. graminicola resistance. Sequencing on Illumina NovaSeq 6000 platform identified 482,234 genetic variations in JBT 36/14 including 448,989 SNPs and 33,245 InDels compared to reference indica genome. In addition, 293,238–553,648 unique SNPs and 32,395–65,572 unique InDels were found in the four mutant lines compared to their JBT 36/14 background, of which 93,224 SNPs and 8,170 InDels were common between all the mutant lines. Functional annotation of genes containing these structural variations showed that the majority of them were involved in metabolism and growth. Trait analysis revealed that most of these genes were involved in morphological traits, physiological traits and stress resistance. Additionally, several families of transcription factors, such as FAR1, bHLH, and NAC, and putative susceptibility (S) genes, showed the presence of SNPs and InDels. Our results indicate that subject to further genetic validations, these structural genetic variations may be involved in conferring nematode resistance to the rice mutant lines.

Keywords: rice, Meloidogyne graminicola, resistance, mutants, SNPs, InDels, genetic variations, genome

INTRODUCTION

Rice (Oryza sativa L.) is the staple food crop for ~3.5 billion people and is one of the essential cereal crops for human nutrition and food security. Global rice demand is estimated to reach 852 million tons by 2035 (Khush, 2013). However, several abiotic and biotic stresses constrain rice production, including a broad range of pathogens and pests. The rice root-knot nematode (RRKN) Meloidogyne graminicola Golden and Birchfield, 1965 is an important pest of rice and is reported to cause up to 80% yield loss (Mantelin et al., 2017), whereas other nematode...
parasites of rice cause a 10%–25% yield loss (Luc et al., 2005; Kyndt et al., 2014). *Meloidogyne graminicola* is reported to be the most damaging plant-parasitic nematode (PPN) in India. Out of the total loss of USD 1.58 billion caused by various PPNs in India, RRKN alone was responsible for ~23% loss (ca. USD 313 million; Kumar et al., 2020). Resistant cultivars play a significant role in the management of RRKN in the absence of ample nematicides and other nematode management strategies (Mantelin et al., 2017). Several RRKN-resistant germplasms have been identified previously (Plowright et al., 1999; Cabasan et al., 2018; Galeng-Lawlao et al., 2018; Zhan et al., 2018; Hatzade et al., 2020). In most instances, the natural resistance needs to be transferred to agronomically desirable backgrounds/cultivars, which is time-consuming. Insertional mutagenesis with either T-DNA or transposons is a new and quick way to generate novel traits in high-yielding cultivars (An et al., 2005). In a previous study, a forward genetic screen for resistance to RRKN in an indica rice landrace JBT 36/14 genetic background identified four activation tagged mutants line-8, line-9, line-11, and line-15 (Hatzade et al., 2019a). These mutant lines showed post-penetration resistance to RRKN and reduced nematode multiplication factor as compared to the wild-type JBT 36/14 and a popular basmati rice cultivar Pusa Basmati 1121 (Hatzade et al., 2019a,b).

The availability of rice genome sequence and advancements in next-generation sequencing (NGS) technologies have enabled rapid identification of the genomic and genetic diversity of various rice germplasm and facilitated their utilization for the genetic enhancement of rice. Genetic polymorphisms cause phenotypic variations in traits in response to environmental stimuli. These variations have been the basis for the development of several molecular markers used in genetic analysis, e.g., restriction fragment length polymorphism (RFLP) and simple sequence repeats SSR (Jones et al., 2009). The detection of sequence polymorphisms, such as single-nucleotide polymorphisms (SNPs) and insertions/deletions (InDels), is one of the most important advantages of NGS technologies (Varshney et al., 2009; Huang et al., 2013). SNPs are being employed in breeding programmes for marker-assisted and genomic selection, association and QTL mapping, positional cloning, haplotype and pedigree analysis, seed purity analysis, and variety identification (McCouch et al., 2010). In addition, InDels have also been successfully used for marker-assisted selection, fine mapping, QTL mapping, varietal testing (Hayashi et al., 2006; Steele et al., 2008; Vasemägi et al., 2010; Liang et al., 2011) and have the potential for map-based cloning of genes (Pan et al., 2008).

The position of SNPs and InDels within a genome can affect both gene expression and function (Shastry, 2009; Haraksingh and Snyder, 2013; Lin et al., 2017). DNA polymorphisms present within coding regions are critical in this context as they might alter the function of a protein. In addition, genetic variations present in regulatory sequences are also significant, as they can induce/repress gene expression, thus modulating gene function. Therefore, the discovery of polymorphisms related to phenotypes is important for understanding gene functions. In the present study, we performed whole-genome resequencing of four RRKN resistant mutant rice lines (lines 8, 9, 11, and 15) and JBT 36/14 landrace to identify genome-wide structural genetic variations and their possible role in conferring resistance against RRKN.

### MATERIALS AND METHODS

#### Plant Materials, DNA Isolation, and Genome Sequencing

The seeds of rice landrace JBT 36/14 were obtained from NRRI, Cuttack, India. The seeds from activation tagged mutants developed from JBT 36/14 background were provided by Dr. Rohini Sreevaths, ICAR-NIPB, New Delhi. The seeds were germinated, leaf tissue was collected from 21-day old plants, and genomic DNA was isolated using the CTAB method. Qubit 2.0 fluorometer (Thermo Fisher) was used to quantify and NanoDrop 2000 (Thermo Fisher) to assess the quality of the isolated DNA.

For Illumina sequencing, the library was prepared by The NEBNext® Ultra™ II FS DNA Library Prep Kit as per manufacturer's specifications. The quantity and size distribution of the libraries was estimated by Bioanalyzer 2100 (Agilent Technologies). The quantified libraries were subjected to whole-genome sequencing on the Illumina NovaSeq 6000 platform (Illumina Technologies) by paired-end sequencing to generate 150-base pair long reads. Standard Illumina pipeline was used to filter the whole genome sequencing data. To remove low-quality reads and reads containing adaptor/primer contamination, FASTQ files were further subjected to stringent quality control using NGSQC Toolkit v2.3 (Patel and Jain, 2012). Stringent criteria of 70:30 was used to obtain high-quality filtered reads wherein more than 70% HQ bases, each having Phred scores >30, were considered further for downstream analysis.

#### Bioinformatic Analyses

The general flow of bioinformatic analyses is presented in Figure 1. The high-quality filtered reads were mapped against *Oryza sativa* ssp. indica reference genome assembly (GCA_000004655) downloaded from Ensembl Plants (Howe et al., 2020) using BWA-MEM v1 (Li, 2013). The alignments were stored in BAM files. Duplicate read alignments were removed using SAMtools v0.1.16 (Li et al., 2009). Variants in the form of SNPs and small InDels were called using VarScan 2 (Koboldt et al., 2012). SNP annotations were done through SNPEff v5 (Cingolani et al., 2012) and SNPSift (Rudan et al., 2012). Circos was used to visualize the distribution of the SNPs and InDels on rice chromosomes (Krzywinski et al., 2009). All pathways associated with different variations were annotated using rice metabolic pathway database (RiceCyc; Dharmawardhana et al., 2013) and KEGG using default parameters. Gene ontology analysis was performed through DAVID (Huang et al., 2009). QTLs/Genes morphological, physiological and resistance/tolerance traits were downloaded from the Q-TARO database (Yonemaru et al., 2010). *O. sativa* ssp. indica transcription factors were downloaded from PlantTFDB (Jin et al., 2017). Previously characterized S genes
RESULTS

Whole-Genome Sequencing of JBT 36/14

Whole-genome shotgun sequencing of JBT 36/14 genomic DNA on Illumina NovaSeq 6,000 platform yielded 81.57 million paired-end reads of 151 bp, containing 92.54% HQ reads (> reads > Phred quality score Q30; Table 1). These reads provided 30X coverage of the JBT genome. The data have been deposited in the NCBI SRA database (accession number PRJNA721239, SRX10576230). Further, the reads were aligned to the reference Oryza sativa ssp. indica indica genome assembly GCA_000004655 and 98.3% of the total reads could be mapped to the reference genome with an average depth of 29 (Table 2).

Comprehensive genome-wide densities of SNPs, insertions, deletions, and intrachromosomal translocations in the JBT 36/14 genome are represented in Figure 2A. A total of 482,234 variations (448,989 SNPs and 33,245 InDels) were identified in JBT 36/14 genome as compared to the reference genome (Table 3; Supplementary File 1). The chromosome wise distribution of SNPs revealed maximum density of variations at the centromere region of chromosomes (Figure 2A). The majority of SNP variations (66.07%) were heterozygous, whereas most of the InDels were homozygous (60.18%; Table 3). For comparing nucleotide substitutions, all SNPs were subdivided into transitions (Ts) and transversions (Tv). Most of the SNP changes observed were of transition type with a Ti/Tv ratio of 2.40. Among transitions, T→C variations (18.07%) were most prominent, whereas T→A variations (4.32%) were the most frequent variation for transversions (Figure 2C). The 33,245 InDels ranged in size from 1 to 48 bp for deletions and 1 to 38 bp for insertions. A majority (90.23%) of the identified changes were short InDels of length 1–2 bp (Figure 2E). Of the total variations, 39,744 (8.24%) mapped to the coding region of the genome (Table 3). Chromosome Chr 1 shows the highest SNP and InDel density, while the lowest SNP density and InDel density were observed in Chr 9 (Supplementary File 1).

The regions in which all polymorphisms were located in JBT 36/14 are summarized in Figure 2B. In JBT 36/14 genome, the majority of the SNP variations span the intergenic region (72%), whereas, among genic variations, the majority are intron variations (~15%) followed by exon variations (~11%) and 3’ UTR variations (~3%). A similar trend was found among the InDel variations, with the majority being in the intergenic region (~69%; Figure 2B). Among the total SNPs, 14.9% of variations pre-existed in reference indica genome 93–11 (from ensembl plant database), whereas 85.1% variations were novel as identified through variant effect predictor tool.1 Of the total variations in coding regions, 23,358 SNPs were missense variations and 7,572 synonymous variations with 1,185 variations being nonsense (stop gained) SNPs (Figure 2D).

Whole-Genome Sequences of JBT 36/14 Mutants

The whole-genome shotgun sequencing of mutant lines (line-8, line-9, line-11, and line-15) yielded 83.54–107.34 million paired reads of 151 bp for each sample (Table 1). The raw reads have been deposited in the NCBI SRA database (BioProject accession number PRJNA721239, SRX10576231—SRX10576234). More than 92.54% of the raw reads for each sample exceeded Phred quality score Q30 and were considered HQ reads. More than 98% HQ reads aligned to the reference Oryza sativa ssp. indica indica genome with an average depth of >29X (Table 2). Comprehensive genome-wide mapping of SNP, insertion, deletion and intrachromosomal translocations in the lines 8, 9, 11 and 15 genomes as compared to JBT 36/14 are presented in Figures 3A–D. As compared to JBT 36/14 genome, 354,340, 553,463, 396,978 and 293,237 SNPs were identified in line 8, 9, 11 and 15 genomes as compared to JBT 36/14 are presented in Figures 3A–D. As compared to JBT 36/14 genome, 354,340, 553,463, 396,978 and 293,237 SNPs were identified in line 8, 9, 11, and 15 respectively. Further, 963, 1,037, 960, and 907 SNPs were unique to lines 8, 9, 11, and 15 compared to JBT 36/14 as well as the reference indica genome. Additionally, 32,885, 65,572, 41,296, and 32,395 InDels were identified in line 8, 9, 11, and 15 respectively. Further, 100, 162, 115, and 102 InDels were unique as compared to JBT 36/14 as well as the reference indica genome (Table 4).

The majority of SNP (>52%) and InDel (>75%) variants

1plants.ensembl.org/Oryza_indica/Tools/VEP
were homozygous in the mutants. Like JBT 36/14, most of the SNP variants observed were of transition type with a Ti/Tv ratio ranging from 2.30 to 2.45 in the lines (Table 4). Transitions, G → A (~18%) and C → T (~18%) were found more frequently than A → G (~17%) and T → A (~17%) in all lines (Figure 4C). For transversions, A → T (~4%) was the most frequent, followed by T → A (~4%), C → A (~4%) and A → C (~4%), which were found at similar frequencies in all lines, while G → C (~3%) was least frequent in all lines (Figure 4C). The identified InDels ranged from 1 to 45 bp in size for deletions and 1–34 bp for insertions. The majority (~90.23%) of the identified variations were short InDels of length 1–2 bp (Figure 4B). Of the total variations, 56,681–90,023 SNPs mapped to the coding region of the genome. In all lines, Chr 1 showed the highest SNP and InDel density, while the lowest SNP density and InDel density were observed in Chr 9 (Supplementary File 1).

Intra-chromosomal and inter-chromosomal translocations were also observed in these mutant lines when compared to JBT 36/14 genome (Supplementary File 2). The number of inter-chromosomal translocations for lines 8, 9, 11, and 15 (i.e., 2,805, 2,816, 2,728, and 2,553, respectively) were higher than intra-chromosomal translocations in the lines (i.e., 2,200, 2,202, 2,169, and 2,116, respectively). The largest intra-chromosomal translocation was observed in lines 8, 9, and 11 as 45 Mb, whereas the largest intra-chromosomal translocation in line 15 was 31 Mb (Table 5). Among the mutant lines, ~72% of the SNP variations were present in the intergenic region (Figure 4A). In all lines, SNP variations in the introns (~15%) were higher than the exons (~10%).

### Table 1: Raw data statistics of the sequenced rice lines.

| Sample No. | Sample name | Sample description | Total no. of reads (million) | Total no. of bases (Gb) | Total HQ reads (reads >70% HQ bases) | %HQ Reads | % HQ bases* in HQ reads |
|------------|-------------|---------------------|-----------------------------|-------------------------|-------------------------------------|-----------|------------------------|
| 1.         | JBT 36/14-1 | Nematode Susceptible Rice Land Race Forward reads | 40.78 | 6.15 | 37.74 | 92.54 | 93.95 |
| 2.         | JBT 36/14-2 | Nematode Susceptible Rice Land Race Reverse reads | 40.78 | 6.15 | 37.74 | 92.54 | 91.05 |
| 3.         | Line-8-1    | Nematode resistant mutant Forward read | 45.06 | 6.80 | 41.93 | 93.04 | 93.56 |
| 4.         | Line-8-2    | Nematode resistant mutant Reverse Read | 45.06 | 6.80 | 41.93 | 93.04 | 91.59 |
| 5.         | Line-9-1    | Nematode resistant mutant Forward read | 53.67 | 8.10 | 50.07 | 93.29 | 94.07 |
| 6.         | Line-9-2    | Nematode resistant mutant Reverse Read | 53.67 | 8.10 | 50.07 | 93.29 | 91.42 |
| 7.         | Line-11-1   | Nematode resistant mutant Forward read | 47.57 | 7.18 | 44.05 | 92.59 | 93.92 |
| 8.         | Line-11-2   | Nematode resistant mutant Reverse Read | 47.57 | 7.18 | 44.05 | 92.59 | 91.06 |
| 9.         | Line-15-1   | Nematode resistant mutant Forward read | 41.77 | 6.30 | 39.18 | 93.80 | 94.53 |
| 10.        | Line-15-2   | Nematode resistant mutant Reverse Read | 41.77 | 6.30 | 39.18 | 93.80 | 91.59 |

*HQ Bases > 30 Phred score.

### Table 2: Alignment of HQ reads on reference genome and average sequencing depth of each line in this study.

| Genotype name | Alignment % | Average sequencing depth |
|---------------|-------------|-------------------------|
| JBT 36/14     | 98.3        | 29                     |
| Line-8        | 98.3        | 32                     |
| Line-9        | 98.2        | 28                     |
| Line-11       | 98          | 33                     |
| Line-15       | 98          | 30                     |

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Splice site acceptors were affected by 210–365 SNPs in the lines. Up to ~4% of the SNP variations were present in the 3′ UTR region in all lines, whereas ~2.5% of SNPs affected all lines’ 5′ UTR region (Figure 4A). Similarly, InDel variations in the intron (~16%) were higher than the exon (~11%) in all the lines. Splice site acceptors were affected by 25–57 variations in the lines. Up to 4% of the total InDel variations were present in the 3′ UTR region in all lines, whereas ~2% of the InDels affected all lines’ 5′ UTR region (Figure 4A).

The comparison of variants in the four lines showed that 93,224 SNPs and 8,170 InDels were found at common positions in all the lines. After that, the effects of variants on protein function were predicted and divided into four types (high, moderate, low, and modifier) based on the predicted severity of each effect (Supplementary File 3). Most variants belonged to the modifier category (70,609), such as intergenic region variants (26,088), upstream (24,490) and downstream gene variants (10,883), 3′ UTR (2,390), 5′ UTR (1,075) and intron variants (3,445). Variants that were inferred to have a low or weak impact (3,100 in number) mainly comprised synonymous variants (2,587), splice region variants, intron variants (243) and 5′ UTR premature start codon gain variants (167). The moderate effect group contained 3,410 SNP variants comprising mainly of missense variants (3,352). Notably, 316 SNP variants were predicted

**FIGURE 2** | Genetic variation in JBT 36/14 compared to reference indica genome; (A) Circos diagram of genome wide variations depicting InDel density, SNP density and intrachromosomal translocations; (B) Annotation of SNPs and InDels by location; (C) Type of SNP variants by base substitution in JBT 36/14 genome; (D) Functional annotation of SNP variants; and (E) Size distribution of identified InDels in JBT 36/14 genome.
TABLE 3 | Summary statistics of various identified structural variations in JBT 36/14 compared to reference genome Oryza sativa ssp. indica 93-11.

|                         |       |       |       |       |
|-------------------------|-------|-------|-------|-------|
|                         | SNPs  |       |       |       |
| Total SNPs              | 448,989 | 36,777 | 152,347 | 296,652 |
| Coding region variants  |       |       |       |       |
| Homozygous variants     |       |       |       |       |
| Heterozygous variants   |       |       |       |       |
| Ti/Tv ratio             |       |       |       | 2.409 |

|                         |       |       |       |       |
|-------------------------|-------|-------|-------|-------|
|                         | InDels|       |       |       |
| Total InDels            | 33,245 | 3,967 | 20,007 | 13,238 |
| Coding region variants  |       |       |       |       |
| Homozygous variants     |       |       |       |       |
| Heterozygous variants   |       |       |       |       |

TABLE 4 | Summary of unique structural variations in mutant rice lines as compared to reference genome Oryza sativa ssp. indica 93-11 and JBT 36/14.

| Mutants         | Line-8 | Line-9 | Line-11 | Line-15 |
|-----------------|--------|--------|---------|---------|
| Unique SNPs     | 354,340 | 553,463 | 396,978 | 293,237 |
| compared to JBT |        |        |         |         |
| 36/14            |        |        |         |         |
| Unique SNPs     | 963    | 1,037  | 960     | 907     |
| compared to JBT |        |        |         |         |
| 36/14 and       |        |        |         |         |
| reference 93-11 |        |        |         |         |
| Coding region   | 56,681 | 90,023 | 61,970  | 46,526  |
| Variants        |        |        |         |         |
| Homozygous      | 186,608 | 370,392 | 226,235 | 155,792 |
| variants        |        |        |         |         |
| Heterozygous    | 167,732 | 183,071 | 170,743 | 137,445 |
| variants        |        |        |         |         |
| Ti/Tv ratio     | 2.45   | 2.33   | 2.38    | 2.30    |
|                  |        |        |         |         |
| Unique InDels   | 32,884 | 65,571 | 41,295  | 32,394  |
| Unic InDels     |        |        |         |         |
| compared to JBT | 100    | 162    | 115     | 102     |
| 36/14 and       |        |        |         |         |
| reference 93-11 |        |        |         |         |
| Coding region   | 6,531  | 12,300 | 7,540   | 6,183   |
| Variants        |        |        |         |         |
| Homozygous      | 24,963 | 54,979 | 32,638  | 24,983  |
| variants        |        |        |         |         |
| Heterozygous    | 7,931  | 10,594 | 8,657   | 7,411   |
| variants        |        |        |         |         |

Functional Annotation and Classification of Variations Common Between Mutant Lines

GO annotation, KEGG pathway, RiceCyc and Q-TARO analyses were carried out to annotate the genes affected with variations. Between the mutant lines, 6,948 genes contained SNPs, whereas 1,901 genes contained InDels (Figures 5A,B). Clubbed together, 7,331 genes common to all mutants showed SNPs or InDels compared to JBT 36/14, out of which 4,974 genes contained either SNPs or InDels at the same genomic location in all the mutants.

KEGG pathway analysis of the common genes affected with genetic variations showed that metabolic pathways (osa01100) were the most affected with SNP affected genes followed by biosynthesis of secondary metabolites (osa01110) and biosynthesis of antibiotics pathway (osa01130). Biosynthesis of secondary metabolites (osa01110) was also highly enriched in InDel affected genes in all mutants, followed by biosynthesis of antibiotics (osa01130) and carbon metabolism pathway genes (osa01200; Figure 6A). Gene ontology enrichment analysis showed that SNP-affected genes were highly enriched in the biological process such as protein phosphorylation (GO:0006468), oxidation–reduction process (GO:0055114) and regulation of transcription related genes (GO:0006355). Among genes related to molecular function and cellular components, protein binding (GO:0005515) and membrane related (GO:0016021) genes were highly enriched. Meanwhile, InDel affected genes involved in biological processes were highly enriched in transcription (GO:0006351), oxidation–reduction process (GO:0055114) and carbohydrate metabolic process (GO:0059575). Among InDel containing genes related to molecular function and cellular components, ATP binding (GO:0005524) and Integral component of membrane (GO:0016021) related genes were highly enriched (Figure 6B).

Pathway analysis of genes affected by genetic variations through RiceCyc led to mapping 1,350 genes on 212 pathways. The pathways with the highest number of variants affected genes included metabolism and regulation pathway (R-OSA-2744345, 247 genes), growth and developmental processes (R-OSA-9030769, 60 genes), amino acid metabolism (R-OSA-2744343, 57 genes), reproductive structure development (R-OSA-9031669) along with hormone signalling, transport, and metabolism (R-OSA-2744341; Figure 7A). Trait analysis using Q-TARO database mapped variant containing genes into four subgroups - morphological, physiological, resistance, or tolerance related genes and others. Q-TARO annotated a total of 253 genes, and the majority of them (92 genes) were grouped into morphological traits. Of these 92 genes, 32 were related to culm leaf, 24 to dwarf character governing genes, and 14 to panicle flowering. Second to morphological traits, 83 genes related to physiological traits such as eating quality (23), sterility (19) and source activity (15) were also affected. A total of 70 genes involved in several disease resistance or tolerance related genes were identified, of which 18 genes were related to blast resistance, 15 to bacterial blight resistance and 11 genes to salinity tolerance (Figure 7B).
Many genes affected by variations belonged to several classes of transcription factors like FAR1, bHLH, NAC, bZIP, C3H, MIKC MADS, G2-like, WRKY, B3, C2H2, HB-other, M-type MADS, and MYB related transcription factors (Figure 7C). The highest number of variants containing genes were localized in the FAR-RED IMPAIRED RESPONSE 1 (FAR1) family of transcription factors (31), the bHLH class of transcription factors (24 genes) and NAC and C3H transcription factor family (18 genes each; Supplementary File 4).

Biotrophic pathogens typically interact with susceptibility genes (S) in the hosts to facilitate infection and disease development for a compatible interaction. Previously characterized S genes of Arabidopsis thaliana and O. sativa (van Schie and Takken, 2014) were used to find the homolog of those S genes in the O. sativa ssp. indica genome. We found 50 putative S genes with SNP variations and 31 with InDel variations. Among these, 23 S genes were affected by variants at common positions in all mutant lines with 53 SNPs and five InDels. Most of these variants were present in intergenic and 3’ UTR regions and were predicted to have modifier and moderate effects. Arabidopsis S genes like PME3, IOS1, PSY1R, CPR22, DMR6, FER, TOM1, RIN4, SSI1, FDH, CSLA9,
AtNUDT6, SRFR1, TOM2A, PMR6, AtUBP13, RST1, PMR4, SIZ1, and CPR1 had modifier SNPs and InDels, whereas FAD8 had SNPs with predicted moderate effect (Supplementary File 4).

DISCUSSION

JBT 36/14 is an indica rice landrace that has been previously studied for its suitability for a promising trait donor for rice improvement programs (Shet et al., 2012; Mallikarjuna, 2013). JBT 36/14 showed tolerance to abiotic stress conditions (Raju et al., 2014; Basavaraju et al., 2020; Sampangi-Ramaiah et al., 2020) and brown planthopper (Nilaparvata lugens L.) resistance in previous studies (Dharshini and Gowda, 2014; Dharshini and Sidde, 2015; Raju et al., 2017). We sequenced the whole genome of a rice landrace JBT 36/14, and its activation tagged RRKN resistant mutant lines 8, 9, 11 and 15. We found the highest genetic variations in chr 1 in the parent JBT 36/14, as well as the mutants. The whole-genome sequencing of JBT 36/14 yielded 81.57 million paired-end reads of 151 bp, and 98.3% of HQ reads mapped to the reference indica genome. The SNP variants were mostly transitions, whereas most InDels were short, of 1–2 bp size. Nucleotide substitution analysis (the ratio of transitions to transversions (Ti / Tv)) was performed and found to be ~2.40. The mapped genome of JBT 36/14 revealed a clear bias toward transitions (more than twice that of transversions), and deviated from the expected ratio of 0.5 (Stoltzfus and McCandlish, 2017). This phenomenon is known as "transition bias," which has previously been reported in rice (Morton, 1995). Higher Ti/Tv ratios have been previously reported in maize, oats, medicago, diploid wheat, Triticum monococcum and barley (Batley et al., 2003; Vitte and Bennetzen, 2006; Bindusree et al., 2017). The Ti/Tv ratio observed here is higher than some previous rice studies (Subbaiyan et al., 2012; Jain et al., 2014; Chai et al., 2018), suggesting a low level of genetic divergence in this landrace. Due to the wobble effect, transitions manifest primarily into silent mutations that do not alter the amino acid and thus conserve the amino acid chain (Wakeley, 1996). Moreover, Transitions are found to be more conservative than transversions (Stoltzfus and Norris, 2016). SNP and InDel variations in JBT 36/14 were observed to affect metabolic pathways and biosynthesis of metabolic pathways, affecting the increased production of phenolic compounds and reduced sugar content observed in the previous studies (Dharshini and Gowda, 2014). The draft genome sequence of JBT 36/14 is a good resource for understanding genotypic and phenotypic variations in rice and will enable its use in rice breeding programs (Shet et al., 2012).

Activation tagging is a robust forward genetics approach to generate genetic resistance against biotic and abiotic stresses and improve plant traits (Gao et al., 2014; Moin et al., 2016; Manimaran et al., 2017). Such mutants can help study traits that are hard to find in natural sources, for example, nematode resistance. Four activation tagged mutant lines showing RRKN resistance were identified and T-DNA insertion was confirmed in a previous study (Hatzade et al., 2019a). Here, we sequenced the genomes of these resistant mutant lines 8, 9, 11, and 15.
to understand the genomic variations that might be responsible for imparting nematode resistance in addition to the T-DNA. T-DNA insertions have been observed to cause chromosomal translocations and InDels in the target genome (Lafleuriel et al., 2004; Curtis et al., 2009; Ruprecht et al., 2014; Pucker et al., 2021). The whole-genome sequencing of mutant lines showed a high degree of genetic variations in terms of SNPs and InDels compared to its JBT 36/14 parent. The difference in number of variants in the mutants was directly proportional to the number of sequenced reads. The Ti/Tv ratio of >2 for all mutant lines was similar to JBT 36/14. However, unlike T→C transitions in JBT 36/14, G→A and C→T transition were the major types of transitions in mutants. Also, the highest number of variants was observed to be spanning chr number 1 and lowest in chr number 9. The increased number of small mutations and chromosomal translocations in these lines are
unprecedented for T-DNA mutants as these are usually low in such mutants (Ossowski et al., 2010; Schouten et al., 2017).

Analysis of common genes containing variants in all the mutant lines suggested that the majority of the genes were involved in the metabolic pathway and gene regulation in rice. In particular, genes involved in the biosynthesis of secondary metabolites seemed to contain the majority of common InDels and SNPs. This is interesting as a previous study regarding changes in transcriptomic profile in line-9 after nematode infection showed up-regulation of genes involved in the production of rice phytoalexins such as oryzalexins phytocassanes, momilactones and several flavonoid compounds (Dash et al., 2021). It may be suggested that in addition to activation tagging, these genomic structural variants may also be contributing to altered phytoalexin and flavonoid production in the mutants.

Several phenotypic variations were also observed in mutant lines compared to their JBT 36/14 wild type in greenhouse conditions. These mutants varied compared to their wild type in terms of plant height, internodal length and width of leaf blade, number of tillers, flowering time, root structure and distinct seed color (Hatzade et al., 2019b). The morphological and physiological trait governing genes with the common variants might be associated with these different phenotypes observed in the mutants.

Common variants were also observed in several transcription factors (TF) families like FAR1, BHLH, and NAC in the mutants. FAR-RED IMPAIRED RESPONSE 1 (FAR1) transcription factor families play multiple roles in a wide range of cellular processes, including light signal transduction (Wang and Deng, 2002), circadian clock and flowering time regulation (Li et al., 2011), oxidative stress responses (Ma et al., 2016), and plant immunity (Wang et al., 2016). Similarly, rice BHLH transcription factors also have a role in both abiotic (Wang et al., 2003; Zhou et al., 2009; Sun et al., 2018) and biotic (Yamamura et al., 2015; Wei and Chen, 2018) stress responses of plants. NAC transcription factor is also known to be involved in abiotic and biotic stress responses in rice (Kaneda et al., 2009; Puranik et al., 2012). Some other TF families like WRKY, bzip, GATA, and MYB, which are related to plant stress responses, were also affected by variants in mutant plants. The majority of variants affecting TFs in mutants were predicted to be modifiers, while some had moderate effects. It may be suggested that some of these variations might be contributing...
Susceptibility genes play an important role in plant-pathogen interactions. All plant genes that facilitate infection and support compatibility can be considered as susceptibility (S) genes (Eckardt, 2002; van Schie and Takken, 2014). Mutation or loss of an S gene can limit the ability of the pathogen to cause disease, either due to impaired pre-penetration requirements such as host recognition and penetration or impaired post-penetration requirements like nutrients. Rice homologs of several Arabidopsis S genes were found to have common variants with predicted modifier and moderate effect in mutant lines. Among these S genes, PME3 is an S gene characterized in Arabidopsis targeted by Cyst nematode (Heterodera schachtii) cellulose-binding protein (Hewezi et al., 2008). Likewise, TOM1, TOM2A, and EIF4E are S genes targeted by viruses, while the rest of the identified S genes are targeted by either bacterial or fungal pathogens (van Schie and Takken, 2014). Nematodes secrete several effectors to establish feeding sites and facilitate penetration (Truong et al., 2015; Mejias et al., 2019). Effectors generally target S genes to facilitate disease progression. Variants in S genes can lead to a loss in its activity and may impede interaction with the pathogen—RRKN in this case. However, further validation is required to affirm the role of identified S genes in nematode resistance.

In summary, this study investigated genomic structural variations in rice landrace JBT 36/14 and its nematode-resistant activation tagged mutants. The genome of the rice landrace JBT 36/14 will add to the available databases of rice genetic variations. A set of 7,331 common genes affected by structural variations were recognized in all nematode-resistant mutant lines. These genes included secondary metabolite biosynthesis pathway genes, several families of TFs, and S genes. Further validation of these variants might help link them to the resistant phenotype observed in these mutants and may be helpful in future breeding programs.

**DATA AVAILABILITY STATEMENT**

The original contributions presented in the study are publicly available. This data can be found here: National Center for
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SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fpls.2022.823372/full#supplementary-material

Supplementary File 1 | SNP and InDel variants identified in JBT 36/14 as compared to the O. sativa ssp. indica reference 93-11.

Supplementary File 2 | Structural variations identified in mutant lines as compared to JBT 36/14.

Supplementary File 3 | SNP and InDel variants found at common genomic locations in all mutant lines.

Supplementary File 4 | Variant containing putative susceptibility genes and transcription factors families identified in all mutant lines.

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Conflict of Interest: JG and RB were employed by Bionivid Technology Private Limited.

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