25 years of propagation in suspension cell culture results 1 in substantial alterations of the Arabidopsis thaliana 2 genome 3

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17 Abstract: Arabidopsis thaliana is one of the best studied plant model organisms. Besides cultivation in 18 greenhouses, cells of this plant can also be propagated in suspension cell culture. At7 is one such cell line that 19 has been established about 25 years ago. Here we report the sequencing and the analysis of the At7 genome. 20 Large scale duplications and deletions compared to the Col-0 reference sequence were detected. The number 21 of deletions exceeds the number of insertions thus indicating that a haploid genome size reduction is ongoing. 22 Patterns of small sequence variants differ from the ones observed between A. thaliana accessions e.g. the 23 number of single nucleotide variants matches the number of insertions/deletions. RNA-Seq analysis reveals 24 that disrupted alleles are less frequent in the transcriptome than the native ones.

25 Keywords: copy number variations; variant calling; next generation sequencing; long read sequencing

27 1. Introduction

26

Arabidopsis thaliana is a small flowering plant which is distributed over the northern hemisphere and has 28 29 become the model system of choice for research in plant biology. In 2000, the genome sequence was released as 30 the first available plant genome sequence [1]. After generating this reference sequence from the accession 31 Columbia-0 (Col-0), many other A. thaliana accessions were analyzed by sequencing to investigate, among 32 many other topics, genomic diversity, local adaptation and the phylogenetic history of this species [2-4]. While 33 most initial re-sequencing projects relied on short read mapping against the Col-0 reference sequence [5-7], 34 technological progress enabled *de novo* genome assemblies [2,8] which reached a chromosome-level quality 35 [9-11]. Low coverage nanopore sequencing was also applied to search for genomic differences e.g. active 36 transposable elements (TEs) [12].

37 Due to the high value of A. thaliana for basic plant biology research, it is frequently grown in greenhouses 38 under controlled and optimized conditions. Previous studies investigated the mutation rates within a single 39 generation [6,13]. Mutational changes appear to be different between plants grown under controlled conditions 40 and natural samples collected in the environment [6]. Another approach harnessed an A. thaliana population in 41 the United States of America, which is assumed to originate from a single ancestor thus showing mutations 42 accumulated over the last decades [14]. This study investigated modern and ancient specimens and estimated a 43 rate of $7.1*10^{-9}$ substitutions per site per generation [14]. Since not all mutations are fixed during evolution, the 44 mutation rate is higher than the substitution rate.

45 Even further away from natural conditions in the environment is the propagation of cells in suspension 46 cultures. Cells from such cultures can easily be employed for transient transfection experiments [15]. Transient 47 transfections of At7 protoplasts are a relatively straightforward method to study promoter structure and activity 48 and to investigate the interactions between transcription factors and promoters of putative target genes [16,17].

49 Since most functions of plants are dispensable in suspension culture, it was expected that mutations in 50 these dispensable genes accumulate over time due to genetic drift or even due to positive selection. We 51 sequenced and analyzed the genome of At7 cells which have been propagated in suspension culture for about 25 52 years and identified massive genomic changes.

53 2. Methods

54 2.1. Plant material

The *Arabidopsis thaliana* suspension cell culture At7 [18] is derived from hypocotyl of the reference accession Columbia (Col). This cell culture is cultivated at 26°C and 105 rpm in darkness with sugar supply on a rotary shaker. A subset of cells is transferred into fresh B5 medium at a weekly basis. For details about the propagation of this cell culture see [19]. All sequencing data sets generated in this study were submitted to the European Nucleotide Archive (ENA) as part of the study PRJEB33589 and the sample ERS3588070.

60 2.2. RNA extraction and RNA-Seq

61 Total RNA was extracted based on a previously described protocol [16]. Based on 1 μg of total RNA, 62 sequencing libraries were constructed following the TrueSeq v2 protocol. Three biological replicates of the At7 63 cell culture (splitted the preceding week) were processed and combined for sequencing after one week of 64 incubation. Single end sequencing of 83 nt was performed on an Illumina NextSeq500 at the Sequencing Core 65 Facility of the Center for Biotechnology (CeBiTec) at Bielefeld University (ERR3444576, ERR3444577).

66 2.3. DNA extraction

67 Cells were separated from media through filtration on a Büchner funnel. Next, cell walls were destroyed 68 by treatment in the Precellys Evolution (QIAGEN) for 3x30 seconds at 8500 rpm with 1 mm zirconium beads 69 (Roth). The following DNA extraction was based on a previously described cetyltrimethylammoniumbromid 70 (CTAB) protocol [20]. To increase the purity of the DNA an additional ethanol precipitation step was added. 71 DNA from the same extraction was used for sequencing with different second and third generation 72 technologies.

73 2.4. Oxford Nanopore sequencing

DNA was quantified via a Qubit fluorometer (Invitrogen) following suppliers' recommendation. Sequencing was performed on a total of four flow cells. The Ligation Sequencing Kit SQK-LSK109 (Oxford Nanopore Technologies, ONT) and the Rapid Sequencing Kit SQK-RAD004 (ONT) were used to prepare two DNA libraries each for sequencing based on the suppliers' protocol. Sequencing on a MinION (ONT) (ERR3445571) and GridION (ONT) (ERR3445572), respectively, was performed using R9.4 flow cells (ONT) based on the supplier's instructions. Real time basecalling for the MinION experiments was performed on a MinIT (ONT) via MinKNOW software (ONT).

81 2.5. Illumina DNA sequencing

82 Sequencing library preparation was performed as described previously [8] and sequencing took place at
83 the Sequencing Core Facility of the CeBiTec at Bielefeld University. Paired-end sequencing of the library was
84 done on an Illumina HiSeq1500 system in Rapid Mode to produce 2x250 nt reads (ERR3445426) and on an
85 Illumina NextSeq500 benchtop sequencer resulting in 2x155 nt reads (ERR3445427).

86 2.6. Coverage analysis

87 Dedicated Python scripts were applied for the genome-wide coverage analysis, the classification of genes 88 based on coverage values, and the investigation of coverage values at variant positions. These scripts are 89 available at github: https://github.com/bpucker/At7. Completely deleted regions were identified through the 90 identification of zero coverage regions in At7, i.e. regions where no At7 reads are mapped to the Col-0 reference 91 sequence, as described before [8].

92 2.7. Genome assembly

93 ONT reads longer than 3 kb were subjected to genome assembly via Canu v1.8 assembler [21] using the 94 following parameters: 'genomeSize=145m' 'useGrid=1' 'saveReads=true' 95 'corMhapFilterThreshold=0.000000002' 'ovlMerThreshold=500' 'corMhapOptions=--threshold 0.80 96 --num-hashes 512 --num-min-matches 3 --ordered-sketch-size 1000 --ordered-kmer-size 14 --min-olap-length 97 2000 --repeat-idf-scale 50'. In addition to Canu, Miniasm v0.3-r179 [22] and Flye v2.3.1 [23] were run to 98 identify the best assembler for this data set as previously described [11]. The quality of assembled contigs was 99 improved through nine successive rounds of polishing with Nanopolish v0.11 [24] harnessing the information 100 of all ONT reads. Minimap2 v2.10-r761 [22] was used for the read mapping with the arguments 101 '--secondary=no -ax map-ont'. Next, Illumina reads were mapped via BWA MEM v0.7.13 [25] to the polished 102 assembly. Five successive polishing rounds with Pilon v1.22 [26] were performed based on Illumina read 103 mappings. Previously developed Python scripts [8] were applied to check the assembly for contaminations, to 104 remove very short contigs, and to calculate general assembly statistics.

105 *2.8. Variant calling and annotation*

106 Illumina sequencing reads of At7 were aligned to the TAIR9 reference sequence of Col-0 via BWA MEM 107 v0.7.13 [25]. Next, GATK v.3.8 [27,28] was applied for the identification of small sequence variants as 108 previously described [29]. In contrast to previous studies, variant positions with multiple different alleles were 109 kept as they are biologically possible. GATK is able to identify low frequency variants and thus provides a 110 powerful solution given the variation in ploidy between hemizygous and pentaploid. Variants were considered 111 as heterozygous if at least 5 reads and at least 5% of all reads support an additional allele besides the dominant 112 one. Additionally, variants were excluded if their coverage deviates from the average coverage of a 2 kb 113 flanking region by more than 20%. SnpEff [30] was deployed to assign predictions of the functional impact to 114 all small sequence variants. Previously developed Python scripts [8,29] were customized to investigate the 115 distribution of variants and to check for patterns. SVIM [31] was deployed to identify large variants based on a 116 Minimap2 mapping of all ONT reads against the Col-0 reference sequence. RNA-Seq reads were mapped via 117 STAR [32] to the Col-0 reference genome sequence using previously described parameters [33]. Samtools [34] 118 and bedtools [35] were used to call variants based on an RNA-Seq read mapping to the Col-0 reference 119 sequence.

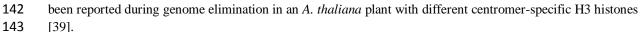
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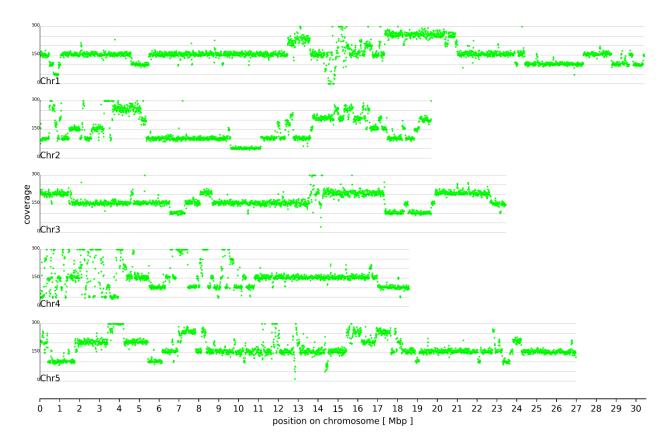
121 3. Results and Discussion

122 3.1. Ploidy differences between At7 and Col-0

123 Mapping of the At7 Illumina short reads and ONT long reads to the Col-0 reference sequence was used to 124 assess genomic changes in At7. The coverage analysis revealed duplications and deletions of large 125 chromosomal segments (Figure 1, File S1). Similar regional variations in ploidy between neighbouring 126 chromosomal segments are common in immortalized insect and mammalian cell lines and tumors, where they 127 may be an advantage to cells [36,37]. In the At7 suspension cell culture, about 5 Mbp at the northern end of 128 chromosome 2 (Chr2) and chromosome 4 (Chr4) appear highly fragmented. In addition, regions around the 129 centromeres are apparently fragmented, but this could be an artifact of higher repeat content and a substantial 130 proportion of collapsed peri-centromeric and centromeric sequences. These differences in chromosomal 131 stability seem to be consistent between plants and animals since similar observations were also reported for e.g. 132 Chinese hamster ovary (CHO) and *Drosophila* cell lines [36,37].

133 An average coverage of 50 fold in a small region at 1 Mbp on Chr1 and in a region between 9.5 Mbp and 134 11 Mbp on Chr2 indicates hemizygosity, i.e. there is only one copy left and the regions are hemizygous. Small 135 blocks in the northern end of Chr4 show a similar coverage. An average coverage of 150 fold indicates that most 136 other regions are triploid. Although the starting material from Col-0 was diploid 25 years ago, these regions 137 represent a minority in At7. A region on Chr1 (17.5 to 21 Mbp) is present in five copies (pentaploid). There are 138 only 116 regions larger than 100 bp which appeared of being completely deleted in At7. These observations in 139 At7 differ from findings in CHO cells, where large chromosomal segments were found in a hemizygous state 140 [37]. Possible explanations for the observed polyploidy regions are defective mitosis and chromosome 141 endoreplication as previously reviewed by [38] and references therein }. Similar chromosomal restructuring has





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Figure 1. Genome-wide coverage of the Col-0 reference sequence. Hemizygous regions in At7 were revealed 146 by a read coverage of approximately 50 fold when combining Illumina and ONT sequencing reads. Different 147 multiples of this values can be observed revealing the presence of large scale multiplications.

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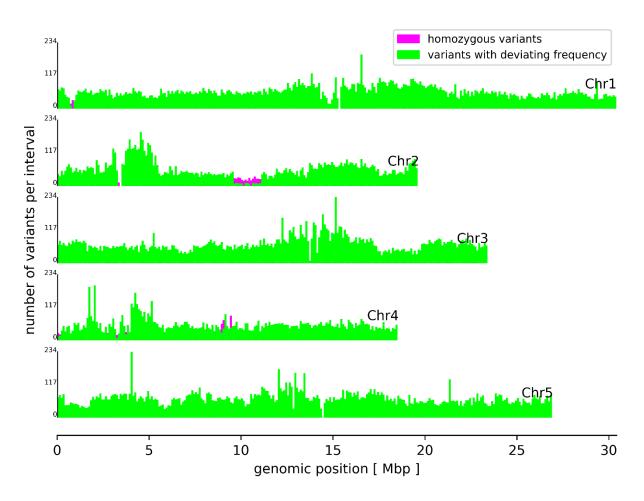
149 Besides Illumina sequencing, Oxford Nanopore Technologies' MinION and GridION sequencer were 150 deployed to generate long reads for the detection of large structural variants. Alignments against the Col-O reference 151 sequence revealed 160,348 deletions and 5,902 insertions (Figure S1). Previous comparisons of natural A. thaliana 152 accessions revealed equal numbers of insertions and deletions [2,8,29]. For comparison, long reads of the Nd-1 153 accession were aligned to the Col-0 reference sequence resulting in the identification of almost equal numbers of 154 insertions and deletions. Although different long read sequencing technologies are involved, this substantial 155 difference between the At7 comparison to Col-0 and the Nd-1 comparison to Col-0 is unlikely to be a technical 156 artifact. Analysis of the remaining coverage in deletions supports the validity, because most of these regions seem to 157 be maintained in at least two haplophases (Figure S2). The excess of deletions observed here indicates that a single 158 haplophase of the At7 genome is probably smaller than a haploid Col-0 genome. This could be due to an ongoing 159 genome size reduction in the At7 cell culture. A subset of the At7 cells in the suspension culture is transferred to a 160 new flask with fresh media on a weekly basis. Fast dividing cells have a higher chance of passing at least one 161 daughter cell to the new flask. The result is a strong selection pressure for fast cell division. Although the replication 162 of additional sequences is probably not costly in terms of evolution, the transcription and translation of dispensable 163 genes was shown to be under negative selection in eukaryotes [40]. Artificial selection through humans is one of the 164 strongest forces that can drive evolutionary changes [5,6,14]. The comparison of the genome sequences of 165 A. thaliana and the close relative A. lyrata revealed randomly distributed small deletions as one major source for the 166 genome size differences [41]. High numbers of large deletions between At7 and Col-0 indicate that the haploid 167 genome size reduction is occurring at substantially higher speed and using different mechanisms.

168 Read mappings revealed that both, plastome and chondrome, are still detectable in At7 cells. Due to differences 169 in the cultivation conditions and DNA extraction methods, a reliable comparison of plastome coverage to nucleom 170 coverage between At7 and plants is not feasible. Although the loss of chloroplasts may seem likely in plant cells 171 incubated in the dark and with sugar supply through the cultivation media, several central biosynthetic pathways like de novo synthesis of fatty acids [42,43] and isoprenoid biosynthesis [44] are located in the plastids [45]. This is 172 173 probably the explanation why this organell is maintained in At7 cells. The coverage ratio between chondrome and 174 plastome is about 10 times higher than observed in native plants [11,46] (Figure S3). The increased number of 175 mitochondria could be due to the specific conditions cultured At7 cells are exposed to. Previous reports described 176 differences in organell numbers due to development and environmental stresses [45].

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178 *3.2. Sequence variants and copy number variations*

179 Mapping of all At7 Illumina sequencing reads against the Col-0 reference sequence and following variant 180 calling revealed an almost equal amount of single nucleotide variants (SNVs) and small insertions/deletions 181 (InDels) (File S2). This is in contrast to previous re-sequencing studies where natural populations displayed a 182 substantial excess of SNVs compared to InDels [2,5,8]. In total, 127,686 small variants were identified leading 183 to a frequency of about one variant per kbp. This frequency is lower than previously reported values of 1 variant 184 in 200-400 bp for the comparison of natural A. thaliana accessions [5,8]. The sequence variants show an 185 increased change from CG to AT, when compared to the Nd-1 vs. Col-0 comparison [8,29]. Variants in At7 are 186 the result of spontaneous mutations which accumulate in the asexually reproducing At7 cells according to 187 Muller's Ratchet [47] as previously reported for apomicts [48,49]. The higher ratio of InDels could indicate that 188 more variants are deleterious than usually found between sexually reproducing accessions. This would be in 189 agreement with the expectation based on Muller's Ratchet. A generally higher frequency of variants between 190 accessions could be due to rare outcrossing events, which can introduce numerous variants in a single event 191 [50]. It is even possible that several of these variants between accessions compensate each other's effect [2,29]. 192 while isolated variants in At7 are deleterious. In agreement with previous findings [5,8], the genome-wide 193 distribution of variants between At7 and the Col-0 reference sequence showed increased variant frequencies 194 around the centromeres (Figure 2). As previously suggested [8], this enrichment can be partly explained by a 195 higher proportion of collapsed sequences in these regions due to the higher abundance of repeats.



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Figure 2. Genome-wide distribution of small sequence variants between At7 and Col-0. Homozygous
 variants (magenta) and variants with deviating frequency were counted in genomic blocks of 100 kb on all five
 chromosomes of the Col-0 reference sequence.

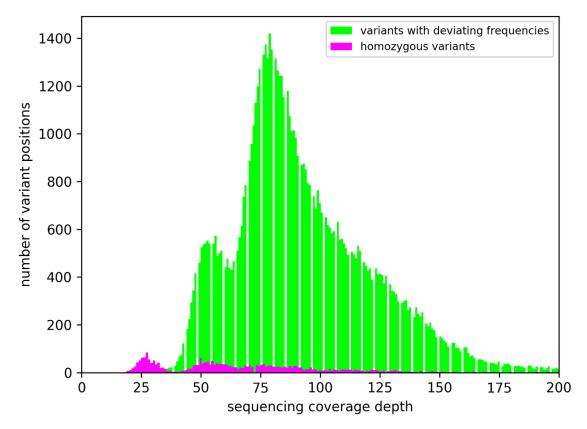
200 About 94.2 % of all small sequence variants display deviating frequencies. This can be explained by the asexual 201 reproduction of the originally diploid At7 cells. A mutation only occurs in one allele and is consequently passed on to 202 all daughter cells. However, the other allele of the same locus would still show the original sequence. It is very 203 unlikely that the same mutation occurs in all alleles independently. Although exchange between alleles cannot be 204 excluded, it is not a relevant mechanism for the generation of homozygous variants. Many homozygous variants 205 between At7 and Col-0 are clustered in a few regions (Figure 2). In most cases, the respective regions are also 206 depleted of variants with deviating frequencies. One clear example of a homozygous variant stretch is located on 207 Chr2 between 9.5 Mbp and 11 Mbp (Figure 2, magenta marked) where the number of homozygous variants exceeds 208 the number of variants with deviating frequencies. These 2,774 homozygous variants were probably caused by the 209 hemizygosity of these regions in the At7 genome (Figure 1). A substantially reduced read coverage of homozygous 210 variants compared to variants with deviating frequencies supports this hypothesis (Figure 3) and regions with high 211 proportions of homozygous variants displayed generally low coverage. A small fraction of variants with deviating 212 frequencies could be due to spurious read mappings and thus false positive variant calls. The weak peak of variants 213 with about 2-fold Illumina coverage but only one detectable allele might be explained by duplication of the 214 respective genome region after the small variant mutation occurred. The observation of a few variants with deviating 215 frequencies in apparently hemizygous regions could be due to spontaneous mutations in some cells leading to 216 different lineages. However, genetic drift will reduce this diversity resulting in the dominance of one allele as 217 observed for most positions and in agreement with Muller's Ratchet [47].

A minority of the homozygous variants could also have been contributed by the original material which was used to generate this suspension cell cultures. Based on previous studies of mutation accumulation over generations [5,6,8,14], it is likely that a few of these variants have been differentiating the material used for the generation of the At7 cell culture from the material used in the *A. thaliana* genome sequencing project. Errors in

the At7 sequencing data and in the Col-0 reference sequence [7,11,51] could be an additional source of

seemingly differences. Similar numbers were observed between genomes of individual plants of the same

A. *thaliana* accessions before and have been considered to be recent events or technical artifacts [8,9].



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Figure 3. Illumina sequencing coverage depth at variant positions. Only Illumina reads were considered in
 this analysis, because the variant calling was limited to this set of high quality sequences. Therefore, the average
 coverage of 25 fold is about half the coverage observed for the complete sequence read data set.

229 Since extremely large differences in the genome structure of At7 and Col-0 might not be revealed through 230 variant detection tools, genes of the Col-0 genome sequence annotation Araport11 were classified based on 231 their read mapping coverage (Figure 4, File S3 and Figure S4). About 85% of all genes display a coverage 232 which was similar to the coverage of flanking genes. Therefore, it is likely that large genomic blocks, and not 233 just single genes, were deleted or duplicated. This is in agreement with consistent coverage levels for large 234 genomic blocks. Again, an average coverage of 50 fold indicates hemizygous regions, while multiples of this 235 hemizygous coverage value indicate the presence of additional copies. The high number of genes with increased 236 copy numbers is in agreement with previous reports of increases in chromosome duplications over cultivation 237 time as callus [52]. Analysis of the genome of this cell line again after additional years of cultivation could 238 reveal if there is a saturation of this increase in ploidy and nuclear DNA content. We speculate that these copy 239 numbers are beneficial due to deleterious variants in some copies of required genes.

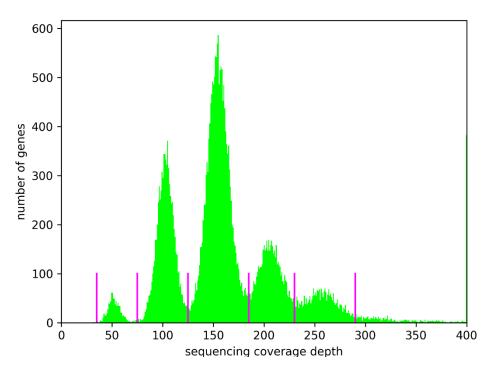




Figure 4. Gene copy numbers. Read coverage per gene was calculated as proxy for the copy number of the respective gene. Magenta lines indicate the central position of coverage valleys enclosed by peaks. Distances between these coverage valleys are not identical due to differences in peak height and resulting width differences. Absolute coverage values might be underestimated due to the removal of read pairs which appeared as the result of PCR duplicates.

246 3.3. Variant impact on genes and transcript isoform abundance

The impact of InDels on coding sequences was analyzed by comparing the length distributions of InDels inside protein encoding sequences with the InDel length distribution outside of these coding regions. InDel lengths which are divisible by three (one codon size) are enriched inside of coding sequences. Of all 28,213 analyzed InDels, only 856 are located within the 33.5 Mbp of protein encoding regions annotated in Araport11. This depletion of InDels inside of protein encoding regions indicates that at least residual selection against disruption of these sequences is still ongoing.

Assessment of the functional impact of small sequence variants revealed a high impact effect (e.g. premature stop codon or frameshift) on a total of 2,189 genes (File S4). This high number can be explained by functional redundancy due to multiple alleles i.e. at least one allele is maintained in a functional state. In addition, many genes might be dispensable under stable, stress-free cell culture conditions. Therefore, the accumulation of disruptive variants or entire deletion is feasible. We restrained from gene ontology (GO) enrichment analysis due to a functional high redundancy caused by the presence of multiple alleles for most genes.

260 RNA-Seq analysis revealed a substantial difference in the abundance of native alleles and defective 261 alleles. Isoforms with a destructive variant displayed a substantially reduced abundance (Figure 5, 262 Mann-Whitney U-test p-value = 0). The genomic coverage of these variant positions displays a very similar 263 pattern: Abundance of the reference allele is on average substantially higher than the coverage of the alternative 264 alleles. This indicates that not the nonsense mediated decay pathway [53], but different copy numbers of the 265 allele, are the main explanation for the difference in transcript abundance. Such copy number-dependent 266 preferential allele expression is known from the vegetatively propagated autotetraploid potato [54] and seems to 267 be a general mechanism. 268

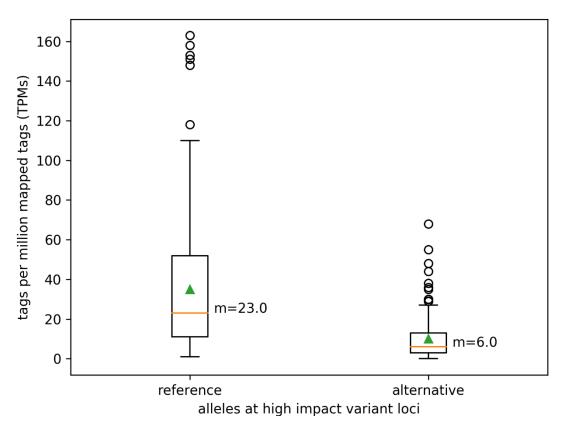


Figure 5. Allele specific transcript abundance at high impact variant positions. The number of RNA-Seq
 reads supporting the reference (Col-0) and alternative allele, respectively, were determined at high impact
 variant positions.

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274 *3.4 De novo genome assembly*

275 To reveal the sequences of large structural variants, we generated an independent de novo genome 276 assembly of At7. The Canu assembler performed best in our hands. A set of 1.4 million ONT reads longer than 277 3 kb was assembled into 433 contigs representing 126.2 Mbp of the At7 nucleome (File S5, File S6, File S7). 278 The N50 of 1.2 Mbp is substantially lower than other recent reports of A. thaliana genome assemblies [9-11]. 279 We speculate that points with abrupt changes in coverage of the At7 genome deteriorated the assembly 280 contiguity. Manual inspection of the borders of some hemizygous regions revealed two groups of reads, which 281 support different assembly paths: one containing the hemizygous sequence and one continuing in a different 282 genomic location. The observation of different groups of reads is in agreement with the high number of large 283 structural variants, which are not supported by all reads, and several distinct coverage levels detected during the 284 read mapping to the Col-0 reference sequence. However, the total assembly size exceeds the 119.8 Mbp of the 285 Col-0 reference sequence thus rendering the accurate anchoring of contigs in some regions, e.g. close to the 286 centromeres, unreliable.

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288 3.5. Future directions

289 After the identification of genomic changes in At7 compared to the Col-0 reference genome sequence, it 290 would be interesting to investigate genomic changes in other cell culture lines. A previous study indicates that 291 the speed of genomic changes could be cell line specific [55]. Based on our findings and previous reports about 292 differences in genomic stability [37], there might be certain regions in the Arabidopsis genome which are more 293 likely to change than others as previously reported for Solanum tuberosum [56]. Aneuploidy events were 294 described previously for an asexually reproducing plant [48] and in long term suspension and callus cultures 295 [57,58]. Comparing genomic changes observed in independent lineages would facilitate the identification of 296 instable or even dispensable regions. Increased copy numbers of many genomic regions seemed to have low

297 metabolic costs, but might be beneficial in buffering deleterious mutations that accumulate due to asexually298 reproduction.

299 In this study, we focused at the genome sequence and excluded other previously reviewed DNA 300 modifications like methylation and chromatin condensation [59,60]. The methylation pattern is known to partly change e.g. in response to environmental conditions or developmental stage [61,62]. Changes in methylation 301 302 are associated with transposable element activity [63] and general genome instability [56]. TE activation in At7 303 could be harnessed to identify intact elements, which are repressed by methylation under normal conditions in a 304 plant. Local hypo- and hypermethylation were reported before as the result of a tissue culture and appeared at 305 the same genomic location across independent lines [64,65]. Generally increased methylation levels have been 306 reported to render in vitro cultures unsuitable for long term production of secondary metabolites [66]. In the 307 light of these reports and our genomic alteration findings, substantial methylation differences between At7 cells 308 in a suspension culture and hypocotyl cells in a Col-0 plant can be expected. Since the number of hypocotyl 309 cells in a plant is very limited, whole genome nanopore sequencing of this cell type to generate a reference data 310 set for the methylation pattern is not feasible at the moment. Advances in single cell sequencing could enable 311 such a comparison in the future.

In-depth investigation of genomic changes under cell cultures conditions including methylation
 differences could benefit applications like the development of stable transgenic lines from in vitro cell cultures
 [67]. Using regenerable protoplasts for non-transgenic genome editing could advance crop improvements [56]

and plant cells could even be used as efficient biofactories once epigenetic challenges are overcome [66].

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Supplementary Materials: File S1: Per chromosome histogram of At7 sequencing coverage of the Col-0 reference 317 318 sequence. File S2: Small sequence variants between At7 and Col-0. Illumina short reads were mapped to the Col-0 reference 319 sequence via BWA MEM. Variant calling was performed with GATK. Figure S1: Deletions and insertions between At7 320 and Col-0. ONT long reads were aligned to the Col-0 reference sequence via Minimap2 and variants were identified via 321 SVIM. Figure S2: Sequencing coverage of deletions between At7 and Col-0. File S3: Classification of Araport11 genes 322 based on At7 read mapping coverage. Figure S3: Difference in sequencing coverage depth of plastome and chondrome. File 323 S4: Selection of most severe variants based on a SnpEff prediction. Figure S4: Genome-wide distribution of genes with 324 different read mapping coverage values (File S3). File S5: Summary of generated sequencing data. File S6: De novo At7 325 assembly statistics. File S7: De novo At7 assembly.

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 Weisshaar; Data curation, Boas Pucker; Investigation, Boas Pucker, Christian Rückert, Ralf Stracke and Prisca Viehöver;
 Project administration, Boas Pucker; Software, Boas Pucker; Supervision, Bernd Weisshaar; Visualization, Boas Pucker;
 Writing – original draft, Boas Pucker; Writing – review & editing, Boas Pucker, Ralf Stracke and Bernd Weisshaar.

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