Identification of genome variations in patients with lung adenocarcinoma using whole genome re-sequencing

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Abstract. Lung adenocarcinoma is one of the types of non-small cell lung carcinoma, which tends to be treated with surgical therapy rather than radiation therapy. It occurs in smokers and non-smokers, and is the most common form of lung cancer among non-smokers and women. Gene rearrangements, including ALK, ROS1 and RET, and gene mutations, including epidermal growth factor receptor (EGFR), HER2, Kristen rat sarcoma viral oncogene homolog, BRAF, phosphoinositide-3-kinase, catalytic, α polypeptide and MET, have been identified in lung adenocarcinoma, which enable targeted therapy in lung adenocarcinoma, for example erlotinib, gefitinib and afatinib, which are EGFR inhibitors. The aim of the present study was to further investigate genome variations in lung adenocarcinoma. Single nucleotide polymorphisms (SNPs), insertions and deletions (InDels), structural variations (SVs) and copy number variations (CNVs) were identified in the whole genome from four patients with adenocarcinoma using a whole genome re-sequencing method performed on the Illumina HiSeq Xten platform. In total, ~415 GB of clean reads were obtained, the average sequencing depth was 31.10-fold, and 99.29% of the reference genome was covered by the clean reads. An average of 3,364,270 SNPs was identified, 98.76% of which were matched to the SNP database (dbSNP), and an average of 453,547 InDels were identified, 28.28% of which were in the dbSNP. The present study also identified a total of 13,050 SVs and 886 CNVs. The majority of the SVs were deletions (74.25%) and the major CNVs were in intergenic regions and coding sequence regions. In conclusion, the results of the present study generated an output of the genome alterations in lung adenocarcinoma, and provided a foundation for further investigation of the pathogenesis of lung adenocarcinoma.

Introduction

Lung cancer is a type of malignant tumor, which is one of the most life-threatening to humans. The morbidity and mortality rates in men with lung cancer are the highest of all types of malignancy, and lung cancer has the second highest following breast cancer in women (1). Smoking is the major cause of lung cancer (2) and accounts for 85% of lung cancer cases in the world (3). Lung cancer includes small-cell lung carcinoma and non-small-cell lung carcinoma (NSCLC) (4), and lung adenocarcinoma is a type of NSCLC, which is found in peripheral lung tissue (1). It is the most common type of lung cancer in smokers and in those who have never smoked (5). Lung adenocarcinoma grows slowly and usually forms small masses, however, they readily metastasize at the early stage (6).

Cancer is caused by genetic and environmental factors, and ~8% of lung cancer cases are caused by genetic factors (7). Genetic and environmental factors can damage DNA to alter the epigenetics, which affects the normal functions of cells, including DNA repair, cell proliferation and apoptosis (8). There have been numerous studies investigating the association between gene variation and lung adenocarcinoma. The epidermal growth factor receptor and Kristen rat sarcoma viral oncogene homolog have been identified as mutations in lung adenocarcinoma as important driver genes (9). In addition, single nucleotide polymorphisms (SNPs) have been found to be associated with lung cancer, including colony-stimulating factor 1 receptor, tumor protein p63 and co-repressor interacting with RBPJ1 (10). Successful mapping of the human genome and the emergence of next-generation sequencing technology have assisted in the identification of specific variations associated with disease comprising SNPs, insertions and deletions (InDels), structure variations (SVs) and copy number variations (CNVs). This has already assisted in understanding and investigating several diseases, including melanoma (11), lung cancer (12), breast cancer (13) and acute myelogenous leukemia (14), and has also assisted

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in disease diagnosis, screening of drug targets and prediction of disease risk.

In the present study, the genome variations of four tumor tissues from different patients with lung adenocarcinoma were detected, using a whole genome re-sequencing method performed on the Illumina HiSeq Xten platform. From this, the SNPs, InDels, SVs and CNVs from these four samples were identified, and the SNPs and InDels were annotated, respectively.

Patients and methods

Patient samples and DNA extraction. Tumor samples were collected from four patients with lung adenocarcinoma. The four patients were all diagnosed with lung adenocarcinoma using pathological methods and were classified to have stage IV tumors, as bony metastases had occurred prior to diagnosis. All were treated with chemotherapy only (Table I). Written informed consent was obtained from all patients. The study was approved by the ethics committee of Shanghai Tongji Hospital (Shanghai, China). Genomic DNA was extracted from tumor samples using standard phenol/chloroform extraction methods (15). Agarose gel electrophoresis was used to confirm that the DNA samples were not degraded and that RNA was not contaminated. The quality and quantity of DNA were assessed using a NanoDrop 2000 spectrophotometer (Thermo Fisher Scientific, Inc., Waltham, MA, USA) and Qubit® 2.0 Fluorometer (Thermo Fisher Scientific, Inc.), following which the DNA samples with optical density values between 1.8 and 2.0, and a content >1.5 µg were used for library construction.

Library construction and sequencing. The present study was performed by Beijing Novogene Bioinformatics Technology Co., Ltd, Beijing, China (www.novogene.com/). Briefly, the qualified DNA samples were randomly sheared into DNA fragment sizes of 350 bp using the Covaris S220 Focused UItrasonicator (Covaris, Woburn, MA, USA), and library construction was performed according to the manufacturer's protocol of the TruSeqDNA Library Construction kit (Illumina, Inc., San Diego, CA, USA). The Qubit® 2.0 Fluorometer was used first for preliminary quantification following the completion of library construction, following which the Agilent 2100 Bioanalyzer (Agilent Technologies, Inc., Waldbronn, Germany) was used for determining the insert size of the library. This was followed by accurate quantification using the quantitative polymerase chain reaction method to ensure the library effective concentration was >2 nM. Sequencing was performed using the Illumina HiSeq Xten platform (Illumina, Inc.) to obtain the raw reads. Reads with adapter sequences or of low quality were filtered out to obtain clean reads, which were used in the following analysis.

Read mapping and identification of SNPs, InDels, SVs and CNVs. The high quality filtered reads were mapped to the reference genome UCSC hg19 (16) using BWA 0.7.8-r455 software (17). The initial alignment results underwent duplicate removal, local realignment and base quality recalibration processing using Picard 1.111 (sourceforge.net/projects/picard/), GATK v3.1 (software.

broadinstitute.org/gatk/) (18) and SAMtools 1.0 (samtools.sourceforge.net) (19), respectively. The effective data were evaluated for the sequence read depth and coverage of the clean reads mapping to the reference genome. SAMtools 1.0 software (19) was used to identify SNPs and InDels (fragment size of insertion or deletion <50 bp), estimate the accuracy of SNP data with the transition/transversion ratio (ts/tv), with the whole genome ratio being ~2.2 (20), and matching these SNPs and InDels to the SNP database (dbSNP) (www.ncbi.nlm.nih.gov/projects/SNP/) (21). The identification of SVs was performed using Breakdancer 1.4.4 software (genome.ustl.edu/tools/cancer-genomics/) (22), containing large fragments of deletions, insertions, duplication and copy number variants, inversion and translocation. CNVs were identified using Control-FREEC v6.7 software (bioinfo.curie.fr/projects/freec/tutorial.html) (23), containing deletions and duplications.

Results

Genome sequencing and mapping to the reference genome hg19. Genome DNA was extracted from tumor tissues of four patients with lung adenocarcinoma and genome sequencing was performed with the Illumina HiSeq Xten platform. A total of 415.98 G raw data was generated on 25 paired-end lanes, and an average of 693,316,202 raw reads were obtained for each sample, clean reads accounted for ~99.88% of the original data. A Phred quality score is a measure of the quality of the identification of the nucleobases generated by automated DNA sequencing. Phred quality scores Q are defined as a property which is logarithmically related to the base-calling error probabilities P, Q=-10 $\log_{10} P$ (24). The proportion of four bases was 86-91% when the Phred score was >30, amongst which GC content accounted for 40.92-43.71% (Table II).

The numbers of filtered clean reads were 620,492,220, 694,563,450, 679,993,278 and 774,771,688 for YJY, GMY, ZCG and JLY2, of which 96.38, 97.20, 97.71 and 97.25%, respectively, were properly mapped to the reference genome of UCSC hg19. The average sequencing depths were 28.31-, 31.08-, 30.55- and 34.47-fold, and 99.66, 98.96, 99.62, 98.93 of the reference genomes were covered by the clean reads, respectively. Coverage at least 4-fold were 99.32, 98.69, 99.19 and 98.70%, respectively (Table III). As shown in Fig. 1A, the association between the ratio of bases in each sample and the sequence depth was in accordance with the Poisson distribution. The mean depths and coverage of each chromosome of the reference genome are shown in Fig. 1B, showing a mean depth of ~47 and coverage of ~97%, with the exception of sex chromosomes.

Detection of SNPs and InDels. The detection of SNPs and InDels were performed using SAMtools, and matched to the dbSNP. There were 3,346,792, 3,387,147, 3,334,068 and 3,389,071 SNPs, respectively for YJY, GMY, ZCG and JLY2, and ~6% (191,998, 193,563, 189,761 and 193,356) of these were located in exonic regions. SNPs identified as being locating in coding sequence (CDS) regions constituted ~11, and ~44% were missense mutations (9,519 in 21,419, 9,670 in 21,629, 9,656 in 21,504, and 9,576 in 21,357; Fig. 2).

Table I. Patient information.

Patient	Sex	Age (years)	Cancer	Stage	Tumor sample
YJY	Female	67	Lung adenocarcinoma	IV	Primary tumor
GMY	Female	75	Lung adenocarcinoma	IV	Primary tumor
ZCG	Male	65	Lung adenocarcinoma	IV	Primary tumor
JLY2	Male	52	Lung adenocarcinoma	IV	Primary tumor

Table II. Quality of sequencing data.

Sample	Raw reads (n)	Raw data (G)	Clean reads (n)	Effective (%)	Q20 (%)	Q30 (%)	GC (%)
YJY	621,362,127	93.20	620,492,220	99.86	96.27; 93.27	90.88; 85.32	42.05; 41.99
GMY	695,467,557	104.32	694,563,450	99.87	96.53; 93.07	91.35; 86.04	40.93; 40.93
ZCG	680,810,250	102.12	679,993,278	99.88	96.43; 94.08	91.26; 86.94	43.71; 43.66
JLY2	775,624,875	116.34	774,771,688	99.89	96.55; 93.63	91.38; 86.22	40.95; 40.92

Table III. Summary of sequenced reads aligned to the reference genome of hg19.

Sample	YJY	GMY	ZCG	JLY2
Total	620,492,220 (100%)	694,563,450 (100%)	67,9993,278 (100%)	774771688 (100%)
Duplicate	62,418,141 (10.10%)	83,850,807 (12.12%)	78,946,241 (11.66%)	98027674 (12.70%)
Mapped	617,787,854 (99.56%)	691,799,013 (99.60%)	677,069,702 (99.57%)	771,860,901 (99.62%)
Properly mapped	598,003,088 (96.38%)	675,101,840 (97.20%)	664,436,740 (97.71%)	753,442,342 (97.25%)
PE mapped	615,682036 (99.22%)	689,578,896 (99.28%)	674,885,134 (99.25%)	769,555,296 (99.33%)
SE mapped	4,211,636 (0.68%)	4,440,234 (0.64%)	4,369,136 (0.64%)	4,611,210 (0.60%)
With mate mapped to a different chromosome	3,958,804 (0.64%)	2,711,738 (0.39%)	3,465,530 (0.51%)	2,738,078 (0.35%)
With mate mapped to a different chromosome [(mapQ ≥5)]	2,839,756 (0.46%)	1,788,585 (0.26%)	2,347,772 (0.35%)	1,691,563 (0.22%)
Average sequencing depth	28.31	31.08	30.55	34.47
Coverage	99.66%	98.96%	99.62%	98.93%
Coverage at least 4X	99.32%	98.69%	99.19%	98.70%
Coverage at least 10X	97.00%	97.93%	96.07%	98.15%
Coverage at least 20X	79.91%	91.11%	76.60%	94.19%

PE, paired-ended reads; SE, single-ended reads; mapQ, map quality which is the effective reading criteria.

Similarly, of the InDels, ~6% were located in exonic regions (24,304 in 443,118, 2,5246 in 461,393, 23,806 in 436,058, 25,672 in 473,617), an average of 647 InDels were located in the CDS, ~12% (75, 73, 78, and 74) were identified as frame shift deletions, and 9% (54, 55, 59, and 55) were frame shift insertions (Fig. 3).

Annotation of SNPs and InDels. The ts/tv ratios of all samples were ~2.2 (YJY, 2.11; GMY, 2.10; ZCG, 2.11; JLY2, 2.10), the numbers of TS and TV types of SNPs were 2,269,999 and 1,076,793, 2,296,037 and 1,091,110, 2,263,437 and 1,070,631, 2,297,128 and 1,091,943 for each sample. Compared with the dbSNP, an average of 98.76% of the SNP sites were matched and an average of 41,563 SNPs were novel in each sequence data (40,762, 41,619, 41,694, 42,176; Table IV). For the InDels, there were 443,118, 461,393, 436,058 and 473,617 in YJY, GMY, ZCG and JLY2, respectively, the majority of which were heterozygote and homozygote; ~28.28% (126,222, 130,260, 124,274 and 132,201) were found in the dbSNP, and the remaining were novel (Table V).

Table IV. Statistics of single nucleotide polymorphisms for high quality reads from YJY, GMY, ZCG and JLY2 mapped onto the reference genome of hg19.

Sample	YJY	GMY	ZCG	JLY2
Total	3,346,792	3,387,147	3,334,068	3,389,071
Heterozygote	1,890,012	1,951,091	1,881,111	1,961,901
Homozygote	1,456,780	1,436,056	1,452,957	1,427,170
Transition	2,269,999	2,296,037	2,263,437	2,297,128
Transversion	1,076,793	1,091,110	1,070,631	1,091,943
ts/tv	2.11	2.10	2.11	2.10
dbSNP percentage	3,306,030 (98.78%)	3,345,528 (98.77%)	3,292,374 (98.75%)	3,346,895 (98.76%)
Novel	40,762	41,619	41,694	42,176
Novel ts	26,861	27,531	27,471	27,834
Novel tv	13,901	14,088	14,223	14,342
Novel ts/tv	1.93	1.95	1.93	1.94

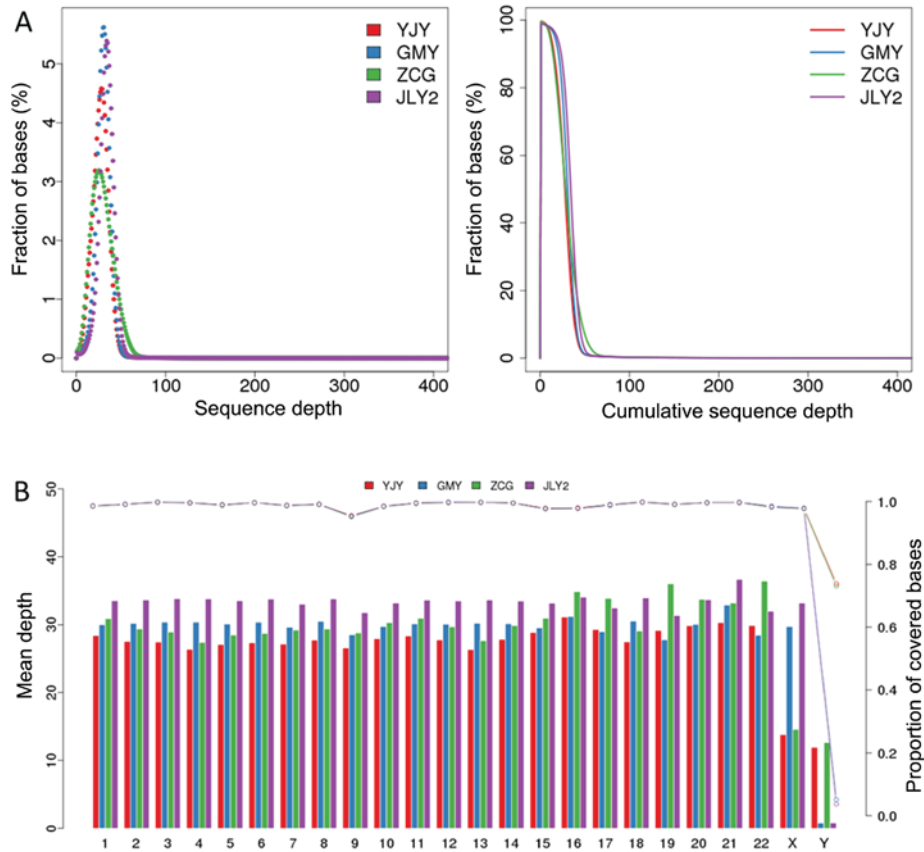ts, transition; tv, transversion; dbSNP, single nucleotide polymorphism database.

Figure 1. Statistical results of sequence depth and coverage of bases in each sample. (A) Statistical results of sequence depths; the proportion of bases at different sequence depths are shown on the left and the cumulative proportion of bases at different sequence depths are shown on the right. (B) Mean depth (left) and proportion of covered bases (right) of each chromosome. Gray line represents the corresponding autosomal and sex chromosomes in the reference genome of UCSC hg19.

Analysis of SVs and CNVs. SV identification was performed using Breakdancer 1.4.4 software, the results showed that the largest number of structural variations were deletions with average of 2,422 variations (YJY, 2,193; GMY, 2,390; ZCG, 2,220 and JLY2, 2,886). The majority of the variations were located at intergenic (~57%) and intron (~35%) regions. By

contrast, the least common structural variation was inversions, with an average of 138 (YJY, 150; GMY, 130; ZCG, 133; JLY2, 138), which were predominantly located in the intergenic, intron and CDS regions (Table VI). CNVs were identified using Control-FREEC v6.7 software, which contained deletions and duplications, the majority of which were in intergenic regions

Table V. Statistics of insertions and deletions for high quality reads from YJY, GMY, ZCG and JLY2 mapped onto the reference genome of hg19.

Sample	YJY	GMY	ZCG	JLY2
Total	443,118	461,393	436,058	473,617
Heterozygote	191,092	202,768	187,294	207,839
Homozygote	252,026	258,625	248,764	265,778
dbSNP percentage	126,222 (28.48%)	130,260 (28.23%)	124,274 (28.50%)	132,201 (27.91%)
Novel	316,896	331,133	311,784	341,416

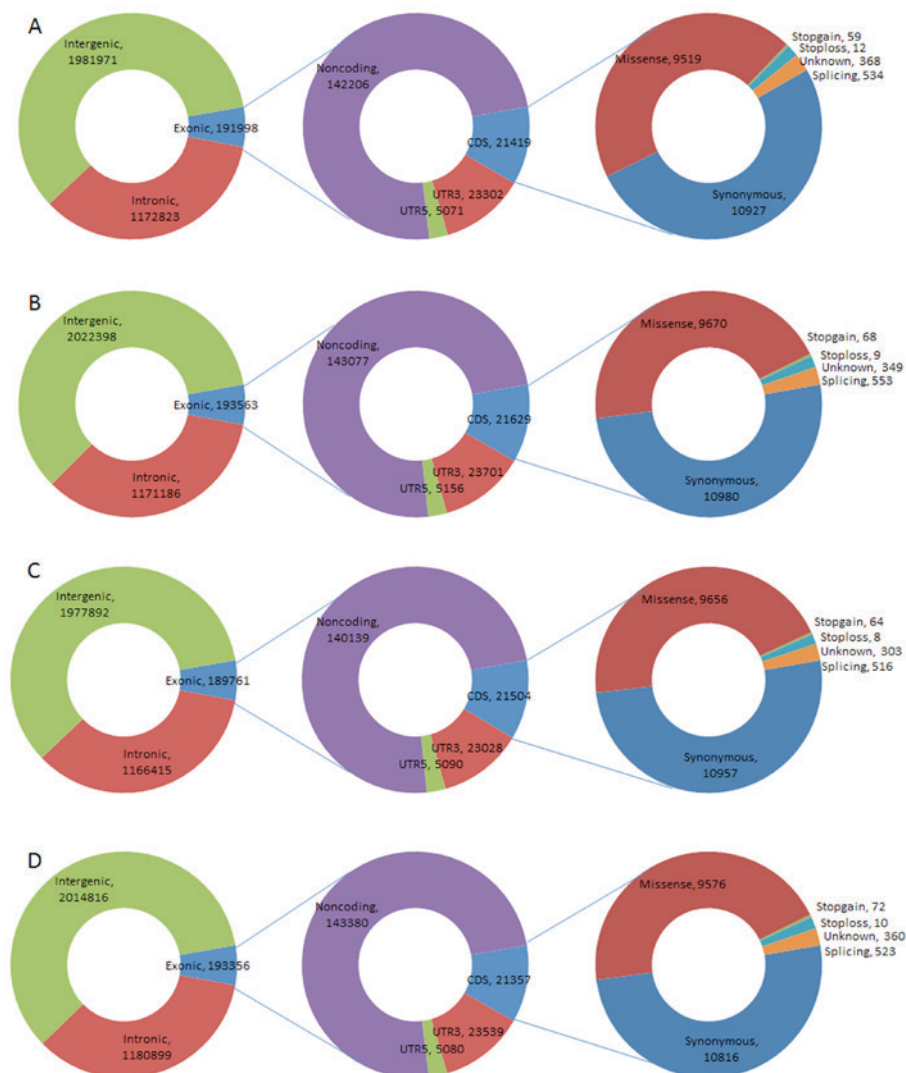dbSNP, single nucleotide polymorphism database.

Figure 2. Detection results of single nucleotide polymorphisms in each sample. (A) YJY; (B) GMY; (C) ZCG; and (D) JLY2.

(92, 174, 98 and 159) and CDS regions (41, 35, 43 and 42). The frequency of deletion occurrence was higher, compared with that of duplication occurrence in the four samples (Table VII).

Discussion

The characteristics of tumor cells include infinite proliferation and growth, evasion of the body's immune surveillance, energy metabolism on the basis of glycolysis metabolism, dedifferentiation, and invasion or migration in a clone growth manner. These biological characteristics of tumor cells differ from the basic features and evolution processes of normal cells, and are considered a result of decisive factors and genetics. Therefore, the investigation of cancer from the perspective of molecular genetics has become the mainstream. A study by Boveri (25) suggested that cancer was caused by abnormal
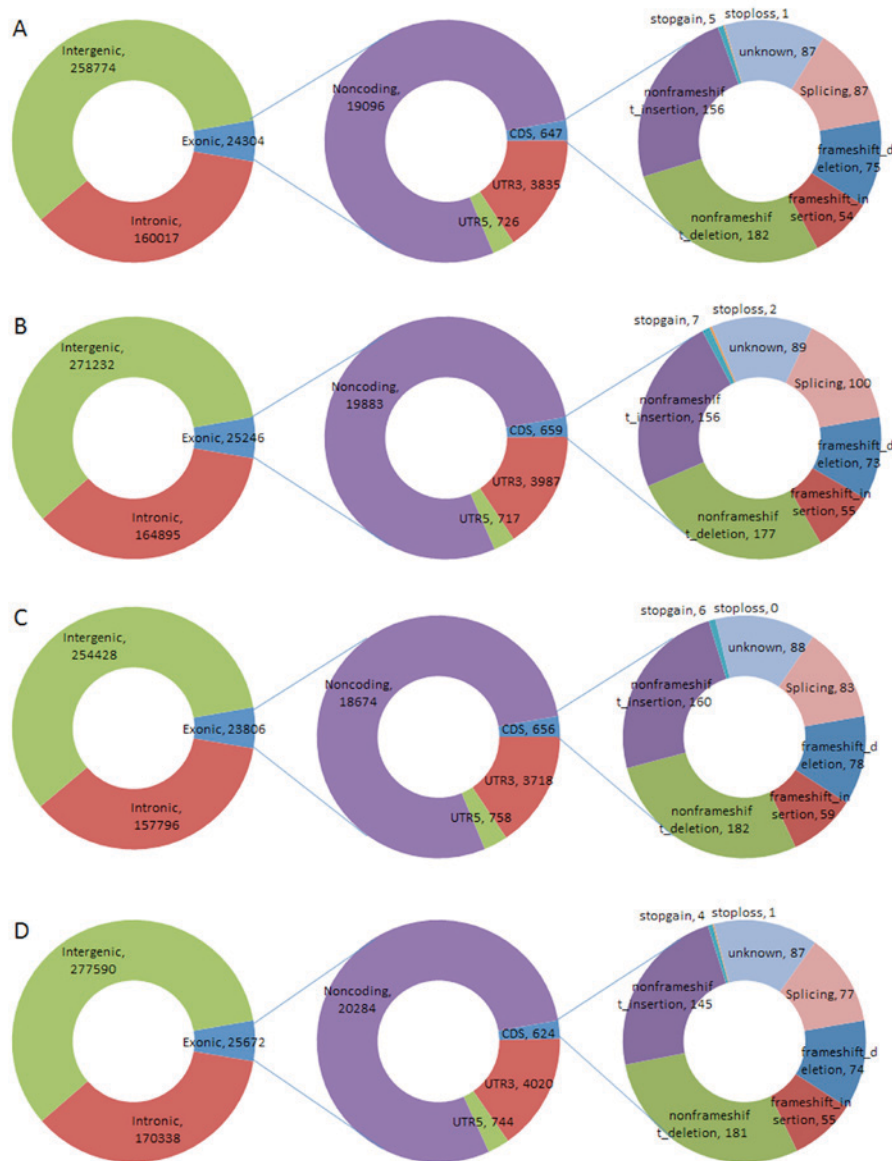
Figure 3. Detection results of insertions and deletions in each sample. (A) YJY; (B) GMY; (C) ZCG; and (D) JLY2.

genetic material, and that the damage and induced mutation of DNA leading to cancer also indicated the importance of genetic material in cancer. Rather than explaining the role of single genes or single mutations in cancer cells, investigations are now primarily aimed at clarifying the nature of carcinogenesis through identifying whole genome variation. This includes the identification of novel mutation sites and gene mutations associated with tumors, the molecular regulatory network and the cellular signaling pathways, which these mutations are involved in, for determining the cause of cancer from the gene variation profile (26). Several cancer genes and pathways have been identified in cancer genome investigations, including the stromal antigen 2 mutation in transitional cell carcinoma of the bladder (27), FAT atypical cadherin 1, FAT atypical cadherin 2 and zinc finger protein 750 mutations in esophageal squamous cell carcinoma (28) and AT-rich interactive domain-1A, vascular cell adhesion molecule 1 and cyclin-dependent kinase 14 mutations in liver cancer (29).

In the present study, re-sequencing of four tumor genomes was performed from different patients with lung adenocarcinoma, and these sequence data were aligned to reference genome hg19 to obtain information regarding the numbers of SNPs, InDels, SVs and CNVs in each sample, respectively. The alignment results showed that changes of base ratio with sequence depth in each sample were in accordance with the Poisson distribution, and this suggested that the sequencing results were of high quality and coverage.

SNPs can occur anywhere in the genome, including CDS, untranslated region, splicing, non-coding RNA and intergenic regions; they can occur as a synonymous SNP, missense SNP, stopgain and stoploss in the CDS region, which can lead to errors in the amino acid sequence of proteins or in the regulation of translation, thus affecting cell features and function. In the present study, an average of 3,364,269 SNPs was detected in each sample, of which 98.77% were matched to the dbSNP. The ts/tv ratios were all ~2.1, indicating a high level of accuracy of the SNP data (whole genome ratio is ~2.2). InDels of the

Table VI. Statistics of structural variations for high quality reads from YJY, GMY, ZCG and JLY2 mapped onto the reference genome of hg19.

Sample	VarType	Total	CDS	Splicing	UTR5	UTR3	Intron	Upstream	Downstream	ncRNA	Intergenic	Unknown
YJY	Insertion	295	5	0	1	1	114	2	3	16	153	0
	Inversion	150	33	0	0	0	32	1	0	12	72	0
	Deletion	2,193	49	2	2	5	748	12	20	79	1,276	0
	Translocation	298	3	0	1	4	83	3	0	14	190	0
GMY	Inversion	130	30	0	0	0	24	1	0	13	62	0
	Deletion	2,390	51	0	2	4	809	14	15	92	1,403	0
	Insertion	176	4	0	0	1	71	3	3	8	86	0
	Translocation	300	1	0	0	10	92	3	0	17	177	0
ZCG	Deletion	2,220	52	2	3	5	807	24	20	77	1,230	0
	Inversion	133	49	0	0	0	29	1	1	11	42	0
	Insertion	376	7	0	1	0	156	1	4	19	188	0
	Translocation	378	4	0	1	5	110	3	0	19	236	0
JLY2	Deletion	2,886	57	1	3	8	1,002	13	24	94	1,684	0
	Insertion	631	9	0	1	2	243	6	7	28	335	0
	Inversion	138	29	0	1	0	36	1	0	10	61	0
	Translocation	356	3	0	1	6	101	2	0	18	225	0

VarType, type of variation; CDS, coding sequence; UTR, untranslated region; ncRNA, non-coding RNA.

Table VII. Statistics of copy number variations for high quality reads from YJY, GMY, ZCG and JLY2 mapped onto the reference genome of hg19.

Sample	VarType	Total	CDS	Splicing	UTR5	UTR3	Intron	Upstream	Downstream	ncRNA	Intergenic	Unknown
YJY	Loss	96	17	0	2	1	16	0	0	4	56	0
	Gain	67	24	0	0	0	2	0	1	4	36	0
GMY	Gain	82	22	0	0	0	7	3	1	8	41	0
	Loss	195	13	0	1	1	35	2	1	9	133	0
ZCG	Gain	74	21	0	1	1	4	1	0	9	37	0
	Loss	106	22	0	1	1	13	2	1	5	61	0
JLY2	Gain	88	22	0	0	0	7	2	1	9	47	0
	Loss	178	20	0	1	1	33	1	3	7	112	0

VarType, type of variation; CDS, coding sequence; UTR, untranslated region; ncRNA, non-coding RNA.

CDS region and splice site are likely to alter protein translation. Frameshift mutations, in which the base lengths of insertion or deletions are not a multiple of three bases, may lead to changes in the reading frame. The present study also identified numerous InDels in each sample, the majority of which were located in intergenic regions and noncoding regions, and a large proportion of InDels (~82%) were novel. However, changes in frame coding proteins, including frameshift deletions, frameshift insertions, stopgain and stoploss were present in CDS regions.

SV is widespread in the human genome, and is the source of individual differences and susceptibility to certain diseases. SV also exists in cancer cells, compared with the genome of normal tissue cells and may lead to the occurrence of fusion genes, which may be associated with cancer (30). The results of the present study showed that the most common SV type was deletions, with an average of 2,422 variations. CNV may be an important cause of certain diseases. Deletions and duplications at the chromosome level have become a focus of investigations of several diseases. The results of the present study indicated that deletions and duplications were present in all four samples, predominantly in intergenic regions (92, 174, 98 and 159) and CDS regions (41, 35, 43 and 42).

In conclusion, the present study described the genome re-sequencing results of four patients with lung adenocarcinoma and the alignment results of these sequence data. The SNPs, InDels, SVs and CNVs of each sample were identified, which aligned to the reference genome of hg19, and a simple annotation of SNPs and InDels was performed. Increasing evidence indicates that genetic variation is closely associated with diseases, including cancer. SNPs, InDels, SVs and CNVs may affect gene expression or signaling pathways, which may lead to changes in cell viability and metastasis. The occurrence and progression of lung adenocarcinoma is a complicated process with specific gene expression profile and gene functions, which are the result of genetic variation and/or environmental factors. The results of the present study showed that investigating genome variation in patients with lung adenocarcinoma assists in understanding the mechanism of lung adenocarcinoma oncogenesis. More samples and investigations of specific genetic analysis and functional annotations are required to further examine of the associations between gene variation and lung adenocarcinoma.

Acknowledgements

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