Introduction

Malignant pleural mesothelioma (MPM) is most commonly associated with exposure to the carcinogen asbestos, although some cases develop after therapeutic radiation or are inherited due to loss of function mutations in BRCA1 associated protein 1 (BAP1) (1,2). Consistent with the carcinogenicity of asbestos, previous studies frequently identified recurrent, structural chromosomal abnormalities in MPM using karyotyping (3). In contrast, more recent studies that used next-generation sequencing (NGS) to evaluate MPM reported a very low mutation burden overall (4,5). This finding was unexpected given that other carcinogen exposure associated tumors such as malignant melanoma and non-small cell lung cancer (NSCLC) are known to have a high mutation loads related to ultraviolet radiation and tobacco exposure respectively (6). A high tumor mutation burden is thought to be a surrogate for an increase in expression of tumor neoantigens that can be recognized by the immune system. In this context it has been demonstrated that patients with NSCLC with a high tumor mutation burden have superior progression-free survival compared to those with a low tumor mutation burden when treated with an immune checkpoint inhibitor that disrupts signaling between programmed cell death 1 ligand 1 (PD-L1) and its receptor PD-1 (7). Interestingly, despite reportedly very low tumor mutation burdens in patients with MPM, response rates and survival of patients...
with MPM treated with PD-1 inhibitors are similar to those of patients with NSCLC for second or later lines of therapy (8,9). Therefore, in our prior work we investigated the presence of structural chromosomal variations, not detected by conventional NGS techniques and their contribution to neoantigen expression in MPM (10).

**Sequencing structural variants**

While NGS is a powerful technique, based on its most common applications it is optimized for the detection of nucleotide variants. There are areas of the genome that are difficult to sequence (e.g., repetitive sequences), and genomic abnormalities that are not readily detected by standard NGS approaches (e.g., rearrangements) (11). Mate-pair sequencing (MPseq) differs from standard sequencing approaches namely in the library preparation step and bioinformatics analysis. For MPseq, large DNA fragments (>2 kb) are generated and their ends are labeled. These ends are then circularized, thus mating the ends of these longer fragments and giving the name mate-pair. These circularized fragments are then sheared, the mated ends are purified and sequenced as usual. Even though only a few hundred base pairs of sequence are generated, these results can identify structural events. Concordant reads map to a reference genome in the proper orientation and appropriate distance from one another, whereas discordant reads map closer or further to one another than expected and possibly with an incorrect orientation. Thus, chromosomal rearrangements (balanced and unbalanced), insertions and deletions can be robustly identified with MPseq.

Genomic array platforms may also be used to infer the presence of structural abnormalities; however, their ability to detect specific patterns can be limited. Whereas oscillating copy-number states might be identified, events involving multiple chromosomes will not likely be detected. Furthermore, prior work has shown that array platforms that consist of more than 250k probes are preferred for the detection of chromothripsis like events (12).

**Structural abnormalities in mesothelioma**

Recurrent chromosomal alterations such as losses of 1p and 9q were reported in MPM in prior karyotypic analyses (3). More recently, in order to resolve discrepancies in the detection of BAP1 mutations, a team of investigators identified that 3p21 (where BAP1 is located) is frequently involved with chromothripsis using a high-density comparative genomic hybridization array (13). These results suggested that standard NGS which detects nucleotide abnormalities cannot always detect structural abnormalities. Chromothripsis results from numerous double strand breaks of a large segment of a chromosome or a whole chromosome (Figure 1). The subsequent repair of these chromosomal breaks results in multiple novel rearrangements that are out of sequence from normal. The micronuclei that form around lagging chromosomes during cell division are not able to incorporate nuclear pore complexes and other non-core nuclear envelope proteins that protect chromosomes from fragmentation (14), and the loss of nuclear envelope integrity fosters chromosome fragmentation (15). Chromoplexy on the other hand represents a series of linked translocations, or a weaving of chromosomal fragments (Figure 1). Chromoplexy was first described in prostate cancer (16) and commonly involves the well-known TMPRSS2-ERG translocation (17). Chromoplexy likely results from the inappropriate ligation of chromosomal breaks of co-expressed loci; however, the inciting event is not well understood. Whereas chromothripsis typically involves a single chromosome, chromoplexy usually involves multiple chromosomes. These findings and statistical modeling support that chromothripsis and chromoplexy likely represent single, lineage-defining, catastrophic events during the evolution of a tumor (16). We previously reported that an ALK rearrangement in an inflammatory myofibroblastic tumor resulted from a complex chromoplectic rearrangement. Whereas that event involved the ALK oncogene (18), most of the rearrangements we have observed in MPM involve tumor suppressor genes and non-coding DNA (10). We currently do not know if the ALK rearrangements reported in peritoneal mesothelioma result from chromoplexy or other complex, structural events (19).

In order to resolve the reported discrepancy between the numerous chromosomal abnormalities detected by karyotyping and the low tumor mutation burden detected by standard exome sequencing in MPM we leveraged MPseq and RNAseq to detect transcribed structural variants. In a series of 22 MPM specimens, we found 1,535 chromosomal rearrangements that resulted in junctions or novel fusions of non-coding DNA or genes (median 41, range 3–298) (Figure 2). For comparison, prior work only identified 43 rearrangements in 211 specimens. We further characterized the abnormalities detected by MPseq and observed that many rearrangements were part of a pattern...
Figure 1 Patterns of chromosomal structural variations detected in malignant pleural mesothelioma (MPM). If we use books as a metaphor for the genome, there would be two copies of each chromosome and chapters would represent genes (top and bottom left of figure). Chromothripsis would be equivalent to pulling out the chapters of one book, throwing some out, rearranging the remaining chapters and placing them back into the binding (top right of figure). Chromoplexy would be equivalent to pulling one chapter each out of two to three books, rearranging them in a new order and placing them back into a book (bottom right of figure). We often find that only parts of genes are involved in these events rather than whole genes, but this metaphor helps to illustrate the concept of complex rearrangements (This image is used with permission by Mayo Clinic).

of chromoanagenesis consistent with chromothripsis (present in 10/22 specimens, 45%), chromoplexy (present in 9/22 specimens, 41%), or both (present in 7/22 specimens, 32%). In nine out of ten cases with chromothripsis, there were multiple chromothriptic events.

Although MPseq can robustly detect chromothripsis and chromoplexy, other techniques can infer the presence of chromothripsis. More specifically, chromothripsis was first identified in the malignant cells of a patient with chronic myeloid leukemia (20) and subsequent work screened for chromothripsis using single-nucleotide polymorphism array data (12,21). Accordingly, criteria for the inference of chromothripsis have been developed to aid in the appropriate identification of this event (Table 1) (22).

Since standard NGS approaches are not optimized to detect chromosomal rearrangements, the frequencies of chromothripsis and chromoplexy are likely underestimated in human cancers. Since chromothripsis results in oscillating copy number changes in a relatively small chromosomal region of high-quality genomic array data, methods have been developed to infer the presence of these events. CTLPScanner is a scan-statistic based algorithm that identifies clusters of copy number status changes called chromothripsis-like patterns (CTLPs) (23). We analyzed the copy number segmentation data of the mesothelioma cohort (n=87) in The Cancer Genome Atlas (TCGA) for chromothripsis using CTLPScanner (5). We used this approach since the DNA library preparation steps in TCGA...
Figure 2 Genome plot of malignant pleural mesothelioma (MPM) with chromothripsis and chromoplexy. In this genome plot of specimen ME022 the chromosomes are plotted in order by size as numbered near the margins. Curved pink lines represent intra-chromosomal rearrangements whereas light green lines represent inter-chromosomal rearrangements. Deletions are represented in red and amplifications are represented in blue. Some genes relevant to MPM or cancer in general are labeled in blue. Accordingly, the multiple pink lines on chromosome 7 represent chromothripsis and the green lines between chromosomes 7 and 11 represent chromoplexy. This figure was previously published and is used with permission from the International Association for the Study of Lung Cancer (10). CNV, copy number variation.

Table 1 Criteria for inference of chromothripsis [adopted from (22)]

1. Clustering of breakpoints
2. Regularity of oscillating copy-number states
3. Interspersed regions of loss and retention of heterozygosity
4. Prevalence of rearrangements affecting a specific haplotype
5. Randomness of DNA segment order and fragment joins
6. Ability to walk the derivative chromosome

were not compatible with MPseq. We identified that 69% of the mesothelioma specimens in TCGA had copy number changes consistent with chromothripsis. Subjects with 3 or more CTLPs had a significantly worse prognosis than those with 2 or fewer CTLPs (HR =2.002, P=0.006) (Figure 3). This analysis of CTLPs in the mesothelioma cohort of TCGA complements the results of our Mayo Clinic cohort with MPseq: both suggest that chromosomal rearrangements, and more specifically chromothripsis, are common in mesothelioma.

Figure 3 Survival based on chromothripsis-like patterns in malignant pleural mesothelioma (MPM). In this analysis subjects with mesothelioma in The Cancer Genome Atlas (TCGA) were classified by the presence of 0–2 chromothripsis-like patterns (CTLPs) (n=64), or 3 or more CTLPs (n=23). Survival was significantly worse for patients with 3+ CTLPs (HR =2.002, P=0.006). This figure was previously published and is used with permission from the International Association for the Study of Lung Cancer (10).
Neoantigenic potential of chromosomal rearrangements in mesothelioma

To determine whether transcription of chromosomal rearrangement-related junctions have neoantigenic potential, we used NetMHC-4.0 to predict whether any of the expressed junctions could encode peptides that could be presented by a patient’s HLA molecules (24,25). NetMHC uses artificial neural networks to predict the binding of peptides to MHC class I molecules. In one case of MPM (ME018) a total of 1,146 9mer, 10mer, and 11mer peptides were identified from 6 protein products of expressed chromosomal rearrangements with at least 10 RNAseq reads. Of these peptides, 75 were predicted to bind to that patient’s specific HLA molecules (HLA-A*02:05, HLA-A*24:02, HLA-B*15:01 and HLA-B*35:01), yielding 87 distinct epitopes. To evaluate whether the candidate rearrangement-related peptides with neoantigenic potential bind patient-specific HLA molecules, the 9mers of two candidate peptides (NYLETTSDF, CYGETYQNI) and the 11mer (NYLETTSDHFH) of one candidate peptide were selected based on their predicted immunogenicity. These candidate peptides resulted from the rearrangement of non-coding DNA with CADPS2 or non-coding DNA with NOD1. An MHC-peptide competitive binding assay was performed and demonstrated that all three peptides bound HLA-A*24:02 very well. These results suggest that the predicted peptide-MHS class I binding affinities were accurate.

To determine the effects of chromosomal rearrangements on tumor-infiltrating T cells, we used T cell receptor sequencing. We found a significant correlation between the number of T cell clones and predicted chromosomal rearrangement-related neoantigens. For each specimen we also calculated a productive clonality score which provides a measurement of clonal distribution. Pielou’s evenness index is used to derive the productive clonality score (26). In regards to T cell clones, Pielou’s evenness index scores the relative abundance (number of detected copies) of each clone. Productive clonality is the inverse of Pielou’s Evenness Index and ranges from 0 to 1, where 0 represents an even distribution of clones and 1 represents an uneven distribution of clones (aka clonal expansion of one or a few T cell clones). We detected a positive correlation between productive clonality with chromosomal rearrangements, rearrangements involving genes and predicted neoantigens. In other words, an increase in predicted neoantigens resulting from chromosomal rearrangements was correlated with clonal expansion of tumor-infiltrating T cells.

To determine whether there are patient T cells responsive to these predicted neoantigens we prospectively collected the peripheral blood mononuclear cells (PBMCs) and tumor from an additional patient who underwent surgery for mesothelioma at our institution. The tumor was analyzed as per the prior 22 cases and 86 potential neoantigens were predicted from the chromosomal rearrangements. We then synthesized eight peptides of these potential neoantigens that correspond to 20 epitopes (cross-presented on 1–4 patient HLA alleles, with a median of 2 neo-epitopes per peptide) for an interferon-γ enzyme-linked immunospot assay. This assay demonstrated that T cells responsive to these predicted neoantigens were present in this patient’s PBMCs. These results are the first to our knowledge that suggest chromosomal rearrangements have neoantigenic potential (Figure 4).

Beyond mesothelioma

The prevalence of chromothripsis is likely higher across malignancies than previously reported. With the use of low-density array platforms, it was suggested that chromothripsis was present in 1–5% of cancers (21). This rate was observed using CTLPs in a more recent study of 402 GEO series, encompassing 22,347 high quality genomic arrays of human cancer samples. CTLPs were identified in 918 cases and involved 1,269 chromosomes (12). These events were not related to chromosome size and were most commonly observed on chromosome 17. Also, TP53 mutations were more common in cases with CTLP events than without, although CTLP events were present in the absence of TP53 mutations. Furthermore, among the patients with available survival information, CTLP events were associated with worse outcomes than patients without CTLP events. Other approaches using whole genome sequencing with single nucleotide resolution have suggested that chromothripsis can be detected in 50% or more of several cancer types (27).

In regards to non-small cell lung cancer in which subsets of patients have chromosomal rearrangements that can be targeted therapeutically, a recent analysis of 138 cases of adenocarcinoma of the lung identified that 74% of the fusions of known oncogenes were related to chromothripsis or chromoplexy (28). These results suggest that complicated chromosomal rearrangements may play a significant role in oncogenesis. Whereas prior version of “Signatures of Mutational Processes in Human Cancer” did not include chromosomal rearrangements, the latest version recognizes...
Figure 4  Presentation of neoantigens by tumors. This drawing illustrates how mutant proteins may be processed by the proteasome and transported into the endoplasmic reticulum by transporter associated with antigen processing (TAP). Peptides typically of 8–12 residues are loaded onto class I major histocompatibility complex (MHC) proteins, migrate to the cell surface and are presented. We hypothesize that the expression of chromosomal rearrangements provides a source of neoantigens that can be presented by tumor cells for recognition by the immune system. This figure was published previously (1) and is used with permission by Mayo Clinic.

Chromothripsis has also been identified in a patient with severe congenital abnormalities (29). Multiple de novo breakpoints on chromosomes 1, 4 and 10 were identified in this patient and were thought to be related to this patient’s congenital abnormalities. There are not many reports in the literature of chromoanagenesis in germline DNA; however, the application of sequencing techniques that can detect rearrangements may help identify congenital abnormalities when standard approaches fail.

Conclusions

Despite a low tumor mutation burden determined by single nucleotide changes, MPM is commonly characterized by unique chromosomal rearrangements that often fit a complex pattern of chromoanagenesis. Standard NGS sequencing strategies, optimized to detect nucleotide variants, are sub-optimal for the detection of these events while MPseq provides an excellent means for their detection. These chromosomal rearrangements can result in novel, unique gene junctions that can be expressed and potentially result in the presentation of several neoantigens. These predicted neoantigens can be presented by tumors on major histocompatibility complex (MHC) proteins and are correlated with clonal expansion of tumor infiltrating T cells. T cells responsive to these neoantigens have been identified in the circulation of a patient. These findings may have several implications for the use of immunotherapy. The predictive values of NGS-based tumor mutation burden measurements may be significantly enhanced by the addition of MPseq and the identification of rearrangement associated neo-antigens. Furthermore, rearrangement associated neo-antigens may also represent valuable targets for future anti-tumor vaccine strategies. Finally, chromosomal rearrangements are now recognized as a mutation signature in cancer and these events are likely to be important in the oncogenesis and immune recognition of not only in MPM but multiple malignancies including non-small cell lung cancer.

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Footnote

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**Ethical Statement:** The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved.

**References**


