

REVIEW

Genetic Predictors of Mortality in Patients with Multiple Myeloma

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Abstract: Multiple myeloma (MM) is a heterogeneous disease featured by clonal plasma cell proliferation and genomic instability. The advent of next-generation sequencing allowed unraveling the complex genomic landscape of the disease. Several recurrent genomic aberrations including immunoglobulin genes translocations, copy number abnormalities, complex chromosomal events, transcriptomic and epigenomic deregulation, and mutations define various molecular subgroups with distinct outcomes. In this review, we describe the recurrent genomic events identified in MM impacting patients' outcome and survival. These genomic aberrations constitute new markers that could be incorporated into a prognostication model to eventually guide therapy at every stage of the disease.

Keywords: multiple myeloma, genomics, aneuploidy, copy number abnormalities, structural variants, translocations, mutations, overall survival

Introduction

Multiple myeloma (MM) is a hematologic malignancy characterized by the proliferation of clonal plasma cells. The disease is virtually always preceded by an asymptomatic stage named monoclonal gammopathy of undetermined significance (MGUS) that subsequently can progress to smoldering myeloma and eventually to symptomatic multiple myeloma. 1 MM is a heterogeneous disease featured by various molecular subgroups with distinct outcomes. With the advent of many efficient therapeutic options in the past decade, including immunomodulators (IMiDs), proteasome inhibitors and monoclonal antibodies, patients' outcome has significantly improved. The therapeutic decisions are based on patient and disease characteristics. Intensive therapies are avoided in frail patients, while more aggressive treatments are usually recommended for fit patients and patients with high-risk disease. High-risk MM defines patients with poor prognosis, early relapse or primary refractory disease and with shorter survival. Identifying this subgroup of patients is critical to define the best therapeutic strategy with currently available treatments and to develop new therapeutic strategies.² Conversely, identifying standard-risk and good-prognosis patients is also very important as it refers to patients with prolonged overall survival that can potentially benefit from less intensive treatment. Therefore, risk stratification has become a major field of research in MM considering its potential impact on therapy. Current criteria defining high-risk myeloma include the revised international staging system (R-ISS) that combines high serum LDH and β2 microglobulin, low albumin levels and presence of any of 3 cytogenetic

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abnormalities (17p13 deletion, t(4;14) and t(14;16)).² However, this classification is not accurate to identify all high-risk patients and does not identify goodprognosis patients. Next-generation sequencing approaches have recently unraveled the complex genomic landscape of MM and significantly changed our understanding of myelomagenesis.³ While few genomic events are recurrent, such as immunoglobulin (Ig) genes rearrangements along with other structural variants, no universal event has been identified differentiating MM from other malignancies like chronic myeloid leukemia⁴ or Waldenström macroglobulinemia⁵ that are featured by the Philadelphia chromosome $t(9;22)(q34.1;q11.2)^4$ and MYD88 L265P⁵ mutation, respectively, for example. In MM, on the contrary, multiple recurrent genomic events have been discovered with distinct impact on disease outcome, further expanding the disease heterogeneity. The integration of DNA and RNA sequencing along with epigenomic profiling provides new critical information to improve current risk stratification in MM. We here review the genomic events involved in myelomagenesis and their impact on patients' overall survival.

Chromosome Abnormalities: Hyperdiploid and Non-Hyperdiploid MM

Conventional karyotyping and more recently fluorescent in situ hybridization (FISH) studies identified cytogenetic abnormalities in up to 70% of MM patients with two main groups: hyperdiploid (HDMM) and non-hyperdiploid myeloma (NHDMM).

HDMM is observed in 60% of MM and is characterized by trisomies of odd-numbered chromosomes 3, 5, 7, 9, 11, 15, 19 and/or 21.6,7 Duplication of odd chromosome is an early event in myelomagenesis and is observed at early stages of the disease, at MGUS and SMM stages.⁸ The mechanisms driving HDMM are largely unknown but may relate to a single catastrophic mitosis rather than serial gain of chromosomes over time.9 HDMM have been classically associated with standard risk and better outcome in comparison with NHDMM. 10,11 However, recent studies have identified significant heterogeneity in this subgroup, with trisomy 3 and 5 being associated with significantly better overall survival, whereas trisomy 21 is associated with worse outcome.7 Moreover, the cooccurrence of hyperdiploidy with additional genomic events including immunoglobulin light chain gene translocations or focal deletions significantly impacts the prognosis of patients with HDMM and is discussed below.

NHDMM entails hypodiploid, pseudodiploid, neartetraploid, tetraploid and hyperhaploid MM^{4,12,13} and constitutes about 40% of MM. NHDMM is associated with recurrent immunoglobulin heavy chain gene (IgH) translocations and is classically associated with worse outcome. Tetraploidy is observed in up to 6% of newly diagnosed MM and is an independent marker associated with significantly shorter overall survival. 14 Hyperhaploidy is another subset of NHDMM where myeloma cells have 24-34 chromosomes with disomies of most odd number chromosomes 3, 5, 7, 9, 11, 15, 19, 21 and chromosome 18, and monosomies of all other autosomes resulting in clinically relevant monosomies of 1p, 6q, 13q and 16q and 17p. 13,15,16 This last-mentioned aberration is considered to drive the poor prognosis observed in the setting of hyperhaploidy.

Both HDMM and NHDMM constitute two clear distinct entities, with distinct transcriptomic and mutational profiles. ^{17,18} However, each subgroup is also heterogeneous and can be impacted by additional genomic events. For example, recurrent Ig heavy chain (IgH) translocations are mainly observed in context of NHDMM, and only in 10% of HDMM, and Ig Lambda light chain (IgL) and MYC translocations are mainly observed in HDMM. ¹²

Copy Number Variations (CNV)

Copy number variations (CNVs) correspond to loss of heterozygosity (LOH), gain and loss of DNA at both a focal level or at an entire chromosome arm level. Similar to single nucleotide mutations, CNVs can be driver or passenger events, with highly recurrent CNVs likely to be drivers. CNVs are frequent in MM and are observed at an early stage of the disease.8,19 Several CNVs have been identified to be recurrent in MM with a frequency greater than 10%.²⁰ The most frequent focal gains are 1q, 6p, 11q gains, while the most frequent deletions are 1p, 6q, 8p, 13q, 14q, 16q and 17p deletions. Although these CNVs are recurrent and involved in MM pathogenesis, their detection do not impact overall survival with the exception of 1q gain and 1p and 17p deletions, which have been independently shown to negatively impact patients' outcome. As an example, del(13q) is found in about $\sim 45-50\%$ of cases, and more commonly in NHDMM, but is not associated with poor outcome.

Chromosome Iq Gain

Duplication of the 1q21 region of chromosome 1 is present in 35% of newly diagnosed MM patients.²¹ Three copies of chromosome 1q21 is classified as gain 1q21, while having 4 or more copies is classified as amplification of 1q21. The 1q gain is the most frequent recurrent chromosomal event that is an independent poor-prognosis factor impacting both period free survival (PFS) and overall survival (OS) as reported in several independent cohorts.^{21–24} Furthermore, presence of 4 copies or more of 1q is associated with the worst outcome.¹⁷ Several oncogenes located in this region have been involved in the mechanisms leading to poor outcome, such as MCL1, IL6R, BCL9, CSK1B, ILF2, ANP32E or ADAR1 that are amplified/overexpressed as a consequence of 1q gain. Resistance to proteasome inhibitor, apoptosis and DNA damage repair deregulation have been reported in that setting.²⁵

Chromosome Ip Deletion

The 1p deletions are observed in 25% of newly diagnosed MM patients and are associated with poor prognosis. Two regions of the 1p arm are mainly affected, 1p12 and 1p32.3, and are seen in 15% and 8% of patients, respectively. These deletions are independently associated with poor outcome. Several tumor suppressor genes have been involved in the mechanisms driving poor outcome, including *CDKN2C*, *FAF1*, *MTF2* and *TMED5*.

Chromosome 17 Deletion

Hemizygous deletion of the whole p arm (del(17p)) is one of the CNVs that retained its adverse prognostic significance for both PFS and OS in the current R-ISS risk stratification² and is observed in about 6% to 10% of NDMM patients. 28,29 The incidence increases to 25-50% in primary plasma cell leukemia (PCL)/advanced stage disease, to as high as 75% in secondary PCL, and is associated with low hematological responses, early drug resistance/relapse, extramedullary disease and central nervous system involvement. 28,30,31 The underlying mechanism is likely the loss of the guardian of genome gene, TP53. Multiple studies including phase 3 randomized controlled trials (RCTs) have confirmed the negative impact of del(17p) on overall survival while using different thresholds for the size of del(17p) clone ranging from a single cell in ELOQUENT-2 trial, 32 1.5-7.5% in the SWOG S0777 trial, 33 60% in the ASPIRE trial 34 and 5-50% in

TOURMALINE-MM trial.³⁵ It seems that del(17p) is associated with worse prognosis (PFS and OS) irrespective of the therapy and % fraction of clone alteration,³⁶ although a heightened risk population is identified with cutoff >55%.³⁷

Complex Chromosomal Events

Macro-scale complex chromosomal events include chromothripsis, cyclo-templated insertions and chromoplexy. These events have been reported to occur in both early phases as well as at relapse potentially during one genetic catastrophic event. 38 Chromothripsis, also known as chromosome shattering, is a complex process where large segments of a chromosome undergo massive oscillations by breaking into smaller pieces, rearranging and then randomly rejoining, ultimately leading to an erroneous new genomic configuration of a single or few chromosomes.³⁹ This complex event has been captured in early stages of myeloma development and occurs in about 9-36% of cases. 38,40 Chromothripsis was found to have an independent negative predictive effect on PFS (HR: 1.42) and OS (HR: 1.81) and also has a strong association with biallelic inactivation of TP53 (HR: 6.6). 41 Chromoplexy includes copy number losses and mostly co-occur with cyclo-templated insertions. This leads to balanced double strand breaks, causing segmental rearrangements of multiple sites of different chromosomes (between 2 and 5) which have been implicated in myeloma relapse/drug resistance in about 10% of cases.³⁸ Templated insertions have been reported to occur in about 19% of the cases and have been reported in hijacking the enhancer oncogenes like CCND1 and MYC.41 At least one driver CNV is present in 47% of all chromothripsis, 42% of chromoplexy occurrences and 28% of templated insertions. 41 The causes of these complex chromosomic events and their impact on overall survival remain to be further investigated.

Recurrent Chromosomal Translocations

Normal B cells undergo affinity maturation and cell cycle arrest to evolve from a naïve B cell or centroblast to an antibody-secreting plasma cell in the germinal centers (GC). Affinity maturation is a complex mechanism that includes somatic hypermutation and class switch recombination that have been involved in lymphomagenesis and myelomagenesis. Activation-induced cytidine deaminase (AICDA or AID) is a major actor in these processes and generates double strand DNA-breaks at the variable region

of both Ig heavy and light chain loci. ⁴² Aberrant recombinations of these DNA breaks along with additional off-target DNA lesions can lead to translocations across the genome and drive tumorigenesis. ^{42–45} Recurrent IgH translocations referred to as primary IgH translocations are detected in 40% of MM and are observed at early stages of the disease ^{12,28} as they likely constitute primary driver events. Additional translocations involving Ig light chains and MYC locus have been more recently characterized and are also considered to be driver events (Table 1).

Translocation t(11;14)(q13:q32) occurs in $\sim 15-20\%$ of MM patients and corresponds to the juxtaposition of CCND1 to the IgH enhancer region, leading to increased cyclin D1 production. 46,47 Interestingly, t(11;14) is more frequent in IgM, IgE and non-secretory MM, 48 and these patients are more likely to have lymphoplasmacytic morphology with CD20 expression and lambda light chain isotype. 49 CCND1 is an oncogene encoding for cyclin D1, which is an activating regulatory subunit for cyclin-dependent kinase (CDK) 4 and 6.50 These activated cyclin complexes (D-CDK) phosphorylate and inactivate retinoblastoma (Rb) protein, which is a potent inhibitor of G1 to S phase progression. D-CDK complex also inhibits cyclin-dependent kinase inhibitor 1B (CDKI1B, also known as p27 and Kip1) that inhibits other CDK complexes required at later phases of cell cycle.⁵¹ The prognostic significance of t (11;14) is neutral; however, when found associated with an activating mutation of CCND1 (10%), it has been associated with poor prognosis.⁴⁷ Studies have also shown inferior response to the proteasome inhibitor bortezomib and inferior outcomes in absence of expression of CD20, suggesting some heterogeneity in this subgroup.^{49,52,53} Nevertheless, patients with t(11;14) have a high expression of BCL-2 and have high sensitivity to BCL2 inhibitors such as venetoclax potentially through a TP53-independent mechanism.^{54–57}

Translocation t(4;14)(p16.2:q32) is observed in ~11–15% of MM patients and leads to the juxtaposition of fibroblast growth factor receptor 3 (FGFR3) and multiple myeloma set domain (MMSET) to the IgH enhancer region. While MMSET is always overexpressed, FGFR3 is only overexpressed in 70% of t(4;14) MM depending on the breakpoint site. FGFR3 is a tyrosine kinase that acts as an oncoprotein activating the Ras-mitogen-activated protein kinase (MAPK) pathway. MMSET is a histone methyltransferase that methylates histones into H3K36⁵⁸ and H4K20⁵⁹ and significantly impacts expression of multiple genes. MMSET has also been involved in DNA damage repair responses by hindering the recruitment of p53 binding protein 1 (53BP1). Translocation t(4;14) is overall associated with adverse prognosis; however, this subgroup is heterogeneous.

Table I Recurrent Translocations Observed in Multiple Myeloma

Translocation	Frequency %	Partner		
Immunoglobulin heavy chain (IgH) translocations				
t(11;14)(q13:q32)	~15–20%	CCNDI		
t(4;14)(p16.2:q32)	~11–15%	FGFR3/MMSET		
t(14;16)(q32:q23)	5%	c-MAF		
t(6;14)(p21:q32)	<2%	CCND3		
t(14;20)(q32:q11)	<1%	MAF-B		
t(14; undefined)	~15%	MYC		
		WWOX, B2M, ERF, RND3, JUN PAX5, DPF3		
Immunoglobulin light chain translo	cations			
Light chain Kappa Translocations (IgK)	4.5%	MYC		
Light chain Lambda Translocations (IgL)	10%	MYC		
		MAP3K14, CD40, MAFB, TXNDC5, CCND1, CCND2, CCND3		
MYC translocations				
MYC	~15–23%	lgL		
		lgH		
		lgK		
		FAM46C, TXNDC5, FOXO3, BMP6, XBP1, CCND1, CCND3		

DNA breakpoint, transcriptomic changes and additional chromosomic events influence significantly patients' overall survival such as del(13q14), del(1p32), del(17p) and >30 chromosomal structural changes. ^{60–62} Several studies have shown that use of proteasome inhibitor improves outcomes of t(4;14) MM patients. ⁶³

Translocation t(14;16)(q32:q23) is seen in 5% of MM patients and leads to overexpression of musculoaponeurotic fibrosarcoma (c-MAF),^{64,65} a known transcription factor that upregulates the expression of multiple genes including CCND2 by binding directly to its promoter.⁴⁷ Translocation t(14;16) is associated with high mutational burden and a specific mutational signature linked to apolipoprotein B mRNA editing catalytic polypeptide-like (APOBEC) activity.⁴⁷ Despite these consistent genomic patterns, the impact of t(14;16) on patient outcome has been controversial with distinct effect observed across distinct clinical trials.^{28,47,66,67} Nevertheless, t(14;16) is currently considered as a poor prognosis factor.

Translocation t(6;14)(p21:q32) is present in less than 2% of MM patients and leads to juxtaposition of CCND3 to the IgH enhancer region resulting in its upregulation. ^{47,68,69} The prognostic significance of t(6;14) is neutral. ⁷⁰

Translocation t(14;20)(q32:q11) is seen in less than 1% of MM patients and leads to upregulation of the MAF gene paralogue, MAF-B (musculoaponeurotic fibrosarcoma oncology family, protein B) that increases the downstream CCND2 activity. The t(14;20) MM has a distinct APOBEC mutational signature driven by the upregulation of APOBEC4 expression. Translocation t(14;20) is classically associated with a poor prognosis when detected in newly diagnosed MM patients; however, some observation showed that its presence at early stage (MGUS or SMM) does not impact the time to progression to active disease, suggesting this single event is not enough to drive the disease. The suggestion of the suggest

Translocation t(14; undefined): based on FISH analysis, 15% of IgH translocations happen with non-recurrent partners. The t(14; undefined) has been associated with a better outcome in comparison to t(11;14), t(4;14) and t (14;16) and might be associated with better response to bortezomib.⁴⁹ These additional IgH partners, ahve been identified using NGS and include mainly MYC, and less frequently WWOX, B2M, ERF, RND3, JUN PAX5, DPF3 and MTMR1.^{72–74}

Light Chain Translocations

Recurrent translocations involving kappa (IgK) and lambda (IgL) light chains locus at chromosome 2 and 22, respectively, are detected in 4.5% and 10% of newly diagnosed MM, respectively. Nearly half (41%) of IgL translocations and most of IgK translocations involve MYC locus. Other recurrent partners include MAP3K14, CD40, MAFB, TXNDC5, CCND1, CCND2 and CCND3 but with lower frequencies (1% to 7%). Importantly 80% of t(IgL) happen in HDMM and define a subgroup of HDMM with poor prognosis, with poorer overall survival and lower response to IMiDs. Translocation t(8;22) is often associated with IgL locus amplification seen in 80% of t(8;22).

MYC Translocations

The 8q24 region is often subject to complex structural variants including duplications, amplifications, templated insertions, chromoplexy, chromothripsis translocations. 73 This region includes the proto-oncogene MYC, which is a basic helix-loop-helix (bHLH) transcription factor that is involved in the pathogenesis of several cancers. MYC translocations are found in about 15-23% of newly diagnosed MM patients. 40,73 The most frequently (range 16.5-3.5%) juxtaposed partner genes are IgL [t (8;22)], IgH [t(8;14)], FAM46C, TXNDC5, IgK [t(2;8)], FOXO3, BMP6 and more rarely XBP1, CCND1 and CCND3.73 MYC translocations are often sub-clonal and found in up to 20% of patients with SMM. 76 In that setting, it is an independent risk factor of progression to symptomatic MM. 19 Other MYC loci structural variants, such as duplications, are also common in SMM and MM. Both sub-clonality and increased frequency in more advanced stages of the disease suggest that MYC translocations and rearrangements contribute significantly to disease progression. 47,73,76-78 MYC translocations in particular have been associated with kataegis which is a localized pattern of hypermutation linked to the deregulation of APOBEC-induced mutagenesis. It is hypothesized that clusters of APOBEC-induced hypermutations aggregate at the chromosomal rearrangement sites before the single stranded DNA (ssDNA) gets repaired. 79 MYC translocations are more frequently observed in HDMM tumors $(\sim65\%)^{80}$ and are associated with a poor outcome, especially when they involve an IgL partner.^{47,73}

Mutational Landscape

The advent of next-generation sequencing allowed deep DNA sequencing studies in large cohorts of MM patients. To date, more than one thousand myeloma genomes have been sequenced and reported in the literature using either targeted, whole-exome or whole-genome sequencing methods with distinct sequencing depth. While no universal driver of the disease has been identified, several recurrent mutations have been observed. KRAS, NRAS, DIS3, FAM46C, BRAF and TP53 have been found mutated in 20-23%, 19-20%, 1-11%, 6-11%, 6-12% and 8-12% of newly diagnosed MM, respectively 40,80,81 (Table 2). More strikingly, pathway analysis revealed that RAS/MAPK and NF-kB pathways are recurrently mutated in 43% and 17% of

MM patients, respectively. 80 Interestingly, the distinct IgH translocation subgroups are enriched for specific mutations suggesting oncogenic dependencies. Thus, CCND1, IRF4, LTB and HUWE1 are almost exclusively mutated in t (11;14), while FGFR3, PRKD2, ACTG1, DIS3 on one hand, and ATM, BRAF, MAF, TRAF2, EP300 and DIS3 on the other hand are almost exclusively mutated in t(4;14) and t(14;16), respectively. However, the clinical impact of these mutations in each MM subgroup is unclear. ¹⁷ The only recurrent mutations that significantly and negatively affect patients' outcome are those observed in p53 pathway (10%; TP53, ATM, ATR). Mutations in IRF4 (3%) and PRDM1/ BLIMP1 (5%) tend to be associated with a favorable outcome in patients treated with IMiDs based regimen. More

Table 2 Recurrent Mutations Observed in Multiple Myeloma

Gene	Frequency	Gene Function	
KRAS	22%	Kirsten-ras oncogene homolog, RAS/MAPK pathway	
NRAS	17.5%	N-ras oncogene, RAS/MAPK pathway	
DIS3	10%	Exosome endoribonuclease and 3'-5' exoribonuclease	
TENT5C (previously FAM46C)	9.4%	Terminal nucleotidyltransferase 5C, non-canonical poly(A) RNA polymerase	
BRAF	8%	B-Raf proto-oncogene, serine/threonine kinase, RAS/MAPK pathway	
HUWEI	5.7%	HECT, UBA and WWE domain containing E3 ubiquitin protein ligase I	
TP53	5.7%	Tumor protein P53	
TRAF3	5.3%	TNF receptor associated factor 3, NFKB pathway	
EGRI	4.8%	Early growth response I, transcription regulator	
ATM	4.3%	ATM serine/threonine kinase, cell checkpoint kinase	
HI-4 (previously HISTIHIE)	4%	Histone linker	
FGFR3	3.9%	Fibroblast growth factor receptor 3	
UBR5	3.9%	Ubiquitin protein ligase E3 component N-recognin 5	
PRKD2	3.5%	Protein kinase D (PKD) family of serine/threonine protein kinase	
CYLD	3.4%	CYLD lysine 63 deubiquitinase, deubiquitinating enzyme, NFKB pathway	
ACTGI	3.2%	Actin gamma 1, cell motility and in maintenance of the cytoskeleton	
IRF4	3.1%	Interferon regulatory factor, transcription factor	
MAX	3.1%	MYC associated factor X, transcription factor	
KMT2C	3.1%	Lysine methyltransferase 2C, epigenomic regulator	
CREBBP	3.1%	CREB binding protein, transcription factor	
CCNDI	2.9%	Cyclin D1, cell cycle	
ARIDIA	2.8%	AT-rich interaction domain IA, member of the SWI/SNF family, epigenomic regulator	

Notes: Data from Walker et al. 113

consistently, the overall mutational load positively correlates with poorer outcome and is reported to be lowest in HDMM and highest in t(14;16). 40,82

Mutational Signatures

Bayesian models analyzing the different 96 trinucleotide possible combinations related to nucleotide changes allowed determining mutational processes or signatures active across cancer genomes.⁸³ In MM, an enrichment of C>T transitions at CpG dinucleotides, which reflect deamination of methylated cytosine to thymine, and the C>T transition associated with C>A and C>G transversion in TpC context has been consistently observed. C>T transitions at CpG dinucleotides are observed in various malignancies like breast, pancreatic, CLL, B cell lymphoma and myeloma and are thought to be ubiquitous in these malignancies. 47,83 The very high frequency of C>T transitions observed in myeloma is a significant challenge to clearly evaluate its clinical impact. However, it is possible that these changes, when occurring at gene promoters, can impact methylation profile and contribute to disease progression. 17,40,84 The latter process (C>T transition associated with C>A and C>G transversion in TpC context) was found to occur in clusters at specific intervals in a phenomenon known as kataegis. Most recent analysis of the mutational signature involved in myelomagenesis using whole-genome sequencing data in newly diagnosed MM samples revealed the role of age-related signature contributing to 25% of the total mutational burden, AID/APOBEC family of cytidine deaminases related signature involved in 5% of mutations, somatic hypermutation

(9%), DNA damage related pathways (16%) and unknown processes (45%). These mutational signatures have different weights depending on the stage of the disease, with APOBEC related signature being more predominant at advanced stages of the disease. APOBEC and DNA damage related signatures predominantly contribute to sub-clonal mutations as opposed to AID related signature that is more frequently involved in clonal and driver mutations. This suggests that AID is a critical actor of myeloma initiation, while APOBEC contributes to the disease progression. ^{78,82}

Double Hit and Multiple Hit Myeloma

The accumulation of genomic aberrations is a hallmark of cancer. In MM, the co-occurrence of few genomic events is significantly impacting patients' outcome and define a very high-risk subgroup of patients. This is exemplified by the double hit of TP53 located on 17p chromosome (Figure 1). TP53 is a tumor suppressor gene that is mapped to 17p13.1 locus and encodes a 53 kDa transcriptional regulator protein, p53.85 P53 silencing role has been involved in several cancers, as it is involved in multiple vital cellular pathways including cell cycle regulation, cellular stress, DNA damage repair response and apoptosis. TP53 aberrations are seen in up to 10% of MM at diagnosis. It includes single hit with heterozygous deletion seen in ~6% of patients or monoallelic mutation in the DNA binding domain that are seen in less than 1% of patients. Bi-allelic or double hit events that include homozygous deletions, heterozygous

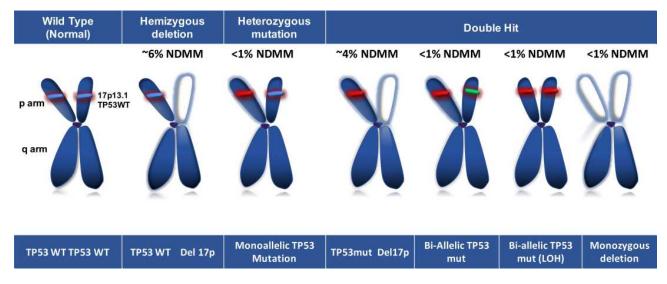


Figure 1 Chromosome 17p13 and TP53 aberrations in multiple myeloma.

Abbreviations: WT, wild type; NDMM, newly diagnosed multiple myeloma; LOH, loss of heterozygosity; Del 17p, deletion 17p arm; mut, mutant.

deletions associated with TP53 mutation, bi-allelic mutation or mono-allelic mutation with LOH are seen in up to 4% of patients and are associated with worse clinical outcome.³¹ Of note, the vast majority of TP53 mutations occur in the context of heterozygous del (17p).86 Frequency of double hit lesions affecting TP53 increases with the stage of the disease and has been reported in up to 15% of relapsed and refractory MM patients.⁸⁷ Other mechanisms of decreased expression of p53 in MM include overexpression of specific microRNAs, TP53 promoter methylation and overexpression of MDM2.88,89 TP53 aberrations are often subclonal, and clonality impacts on patients' outcome. 90 The impact of sub-clonal deletion 17p remains uncertain as contradictory results have been reported. A report from the myeloma XI trial that analyzed NDMM patients (n=1777) with multiplex ligation-dependent probe amplification (MLPA) showed that minor tumor subclones with TP53 deletion are independently associated with shorter OS. In this study, patients were divided into three subgroups: low sub-clonal 17p deletion identified by an MPLA < 0.8 cutoff (equivalent to 10–20% sub-clonal tumor population), intermediate 17p deletion clonality identified by MPLA ≥0.55 but <7 (equivalent to >50% clonal tumor fraction) and clonal TP53 deletion identified by MPLA <0.55 (equivalent to dominant clonal deletion 95-100%). All three groups were individually associated with worse OS with HR of 1.8, 2.9 and 2.2, respectively, in comparison to nondel(17p) patients. 90 Alternatively, in another large cohort study using whole-exome sequencing data, comparable OS and PFS were observed in del(17p) patients with cancer cell fraction (CCF) ≤0.55 in comparison to nondel(17p).³⁷ The discordant results observed between the two studies may be related to the different methods and treatment received. Therefore, the sub-clonality threshold of myeloma cell population with del(17p) conferring a poor prognosis remains controversial at this time. Nevertheless, CCF or clonal content ≥55% is constantly associated with poor outcome.³⁷

In addition, co-occurrence of del(17p) with amplification 1q or t(4;14) significantly worsens patient outcome. 17,62 Presence of more than one high-risk abnormality is seen in less than 5% of newly diagnosed MM including t(4;14), t(14;16), t(14;20), del(17p)/TP53 mutation, gain(1q), del(1p) and constitutes "double-hit" or "multi-hit" myeloma, associated with significantly poorer prognosis. 91,92 Similarly, coexistence of del(6q) and del (1p32) with del(17p) significantly worsens the prognosis of patients.60

Conversely, using a genomic scar score (GSS), whole-genome sequencing studies have also identified a subgroup of MM patients characterized by low GSS (low mutational burden, specific mutation signatures pattern and fewer structural variants) and a very good overall survival.82 GSS is a score calculated from an algorithm that evaluates allele-specific CNV by scarHRD-R-package⁹³ as the sum of homologous recombination deficiency-loss of heterozygosity (HRD-LOH: number of 15-Mb-exceeding LOH regions which do not cover the whole chromosome), large-scale transitions (LST: chromosomal breaks between adjacent regions of at least 10 Mb, with a distance between them ≤3 Mb) and number of telomeric allelic imbalances (telomeAI: number AIs that extend to the telomeric end of a chromosome). MM patients with low GSS have a significantly superior outcome.⁸²

Transcriptomic Profile

Multiple studies have identified several prognostic gene expression signatures in newly diagnosed MM.⁹⁴ Most of these studies have identified a transcriptomic profile or gene expression profile (GEP) featuring high-risk patients as an independent prognostic factor. At least 8 studies from major myeloma research groups including the Dutch-Belgian Cooperative Trial Group for Hematology Oncology Group (HOVON), the Intergroupe Francophone du Myelome (IFM) and the University of Arkansas for Medical Sciences (UAMS) have validated distinct GEP as an independent prognosis factor in independent large cohort of patients. 95-97 However, only very few or no genes overlap between these signatures, suggesting that each signature does not incorporate all high-risk patients. Incorporation of RNA splicing, and non-protein coding gene such as microRNA (miRNA) and long noncoding RNA (lncRNA) expression has also been shown to be useful to predict patient outcomes, 98,99 even more accurately than ISS, standard cytogenetic studies and protein-coding gene expression profile alone. 98 However, the lack of a uniform platform to perform transcriptomic profiling remains an important challenge to incorporate GEP as a prognosis marker in clinical practice to date.

Epigenomic Modifications

Epigenomic deregulation is a hallmark of MM at various levels. DNA methylation and histone modifications

are essential mechanisms impacting on transcriptome regulation. 100 The role of histone modification is highlighted in t(4;14) MM in which MMSET, a histone methyl transferase (HMT) involved in methylation of H3K36 and H4K20,⁵⁹ is universally overexpressed and influences cell cycle progression, apoptosis, cell adhesion, oncogenesis and DNA damage response. 101 In addition, up to 24% of MM patients harbor at least one potentially deleterious mutation in epigenomic regulator genes. 102 Additional epigenetic modifiers including other overexpressed HMT have been shown to play critical roles in MM. Thus, the overexpression of the HMT PHD finger protein 19 (PHF19) and enhancer of zeste homolog 2 (EZH2) is a strong predictor of poor outcome. 99,103 EZH2 is a component of the polycomb repressive complex 2 (PRC2), which tri-methylates histone H3 lysine residue 27 (H3K27me3) to repress gene transcriptome related to stem cell self-renewal, cell cycle checkpoints, metastasis and cellular differentiation. Aberrant activity of EZH2 is regulated at multiple levels driven by interleukin-6 especially in cell lines that harbor K- and N-RAS mutations, ¹⁰⁴ upregulation of NFpathway¹⁰⁵ and downregulation of several microRNA (miRNA). 106 EZH2 also plays an important role in t(4;14) and in case of mutation or loss of expression of the histone acetyl transferase UTX/KDM6A, which occurs in up to 5% of MM patients, representing a possible therapeutic target in these settings. While EZH2 inhibitors are in the pre-clinical stages and include EPZ-6438, GSK126, UNC1999, OR-S2¹⁰⁷⁻¹⁰⁹ in myeloma, the recent FDA approval of tazemetostat for relapsed refractory EZH2-mutated positive follicular lymphoma is encouraging.

Future Perspective

High-throughput technologies have been increasingly explored and include DNA-based studies (WGS, WES, array comparative genomic hybridization, high density SNP arrays) and RNA-based studies (RNA sequencing and microarrays). These techniques have allowed identification of recurrent mutations and affected pathways, mutational signatures, clonal evolution, CNVs, protein-coding gene (fusions, mutations, splicing, isoform expression, gene expression) and non-coding gene expressions. Some of these have already been shown to have clinical utility for both risk stratification and personalized medicine

(Table 3). Detection of recurrent mutations may have therapeutic implications for targeted therapies. NRAS mutations in relapsing myeloma are associated with lower response rate to bortezomib, 110 while IRF4 mutations are associated with better response to IMiD therapy. 80 Presence of V600E BRAF mutation can be specifically targeted by vemurafenib. 111 More accurate risk stratification, based on transcriptomic studies, mutational signatures and clonal shift harboring a high-risk mutation or low GSS can be captured and guide clinicians for utilizing more or less intensive treatment at induction, consolidation and maintenance stages. 112 With the advent of efficient quadruplet regimens, BCMA targeting agents including monoclonal antibodies and chimeric antigen receptor T cells therapies in myeloma, identification of accurate prognosis markers will be extremely important. Major limitations for incorporating NGS to clinical practice currently relate to its availability and cost. The development of standardized and widely available genomic investigation methods is mandatory. Furthermore, the dynamic nature of cancer genome requires serial genomic evaluations over time to accurately prognosticate and identify potential therapeutic implications.

Conclusion and Perspectives

Multiple myeloma is a complex and heterogeneous disease. Genomic studies have identified various molecular subgroups and recurrent events involved in myelomagenesis and impacting patients' outcome. While current risk stratification only include presence of del (17p), t(14;14) and t(14;16), new genomic markers can be incorporated to improve risk stratification and potentially to guide therapy. These genomic markers include high-risk markers (IgL and MYC translocations, high mutational burden and detection of double and multi-hit myeloma) and good-prognosis hallmarks (low mutational burden, low genomic scar score) at diagnosis. In addition, integrating genomic alterations associated with early progression at an early stage of the disease (MYC rearrangements, DNA damage and repair gene pathways abnormalities) will also be important. The inclusion of these markers can significantly improve patients' management in the near feature. However, important challenges exist as it is necessary to develop a broadly available platform using high-throughput sequencing technologies to

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Table 3 Recurrent Genomic Events Impacting Overall Survival in Newly Diagnosed Multiple Myeloma Patients

Standard Risk	Genomic Events	High-Risk
Aneuploidy	•	
Hyperdiploid		Non-hyperdiploid Hyperhaploid Tetraploid
Copy Number Alterations		
Deletion 13q		Deletion 1p32 Deletion 17p13 (CCF>55%) 1q amplification (≥4 copies)
Chromosomal Translocations		
t(11;14): CCND1 (~15–20%) t(6;14): CCND3 (<2%) t(14;undefined) (~15%)	IgH translocations	t(4;14): FGFR3/MMSET (~11–15%) t(14;16): MAF (5%) t(14;20): MAFB (<1%)
	MYC translocations	t(8:lgL)
	lgL translocations	t(8;lgL)
Mutations		
		TP53 High mutational load
Mutational Signatures	•	
Age		APOBEC
Epigenomics	•	
		MMSET EZH2 PHF19
Transcriptomic		
Low-risk gene expression signature		High-risk gene expression signature
Double and multi-hit		
		17p13 double hit t(4;14) and del(17p) del(17p) and del(1p) t(4;14) and del(1p) or del(13q) or >30 chromosomal structural changes

Abbreviations: CCF, cancer clonal fraction; APOBEC, apolipoprotein B mRNA editing catalytic polypeptide-like; FGFR3, fibroblast growth factor receptor 3; MMSET, multiple myeloma set domain; CCND I, cyclin DI; CCND 3, cyclin D3; c-MAF, musculo-aponeurotic fibrosarcoma; MAF-B, musculo-aponeurotic fibrosarcoma oncology family-protein B; EZH2, enhancer of zeste homolog 2; PHF19, PHD finger protein 19.

capture such genetic complexity and to take into account the dynamic evolution of the disease which requires serial evaluations to adjust therapy.

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submitted; and agree to be accountable for all aspects of the work.

Disclosure

The authors report no conflicts of interest in this work.

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