

1 *MYC* dysregulation in the progression of multiple myeloma

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3 Running Title: *MYC* in the progression of MM

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23 Multiple myeloma (MM) is a plasma cell malignancy preceded by a premalignant stage, named  
24 monoclonal gammopathy of undetermined significance (MGUS), and often a smoldering phase  
25 (SMM).<sup>1, 2</sup> Primary events, which include recurrent translocations of the IgH locus and  
26 hyperdiploidy, occur early in pathogenesis, and are followed by the acquisition of secondary  
27 genetic events such as *MYC* structural variants (SV), mutations that activate the RAS or NFκB  
28 pathways, mutations of *DIS3* or *FAM46C* that drive precursor stages of disease toward MM.<sup>3-6</sup>  
29 Whole exome sequencing (WES) studies comparing serial MGUS/SMM and MM samples  
30 indicate clonal stability, and no significant increase in mutational load in patients that progress  
31 rapidly to MM.<sup>7</sup> In contrast, in 33 unselected MGUS patients single-nucleotide variants (SNVs)  
32 were less frequent, and no *MYC* translocations identified.<sup>8</sup>

34 To study the role of *MYC* in myeloma we performed an integrated genomic analysis of 612  
35 newly diagnosed myeloma (NDMM) patients enrolled in the CoMMpass study, as well as  
36 targeted sequencing of 23 patients with MGUS and 90 patients with SMM. We identified *MYC*  
37 SV in 42% of NDMM, including the majority of HRD (57%), and a quarter of MM with primary  
38 IgH translocations. The majority of these rearrangements resulted in juxtaposition of a super-  
39 enhancer (SE) and/or stretch enhancer adjacent to *MYC*, with one third involving an *Ig* super-  
40 enhancer, one third involving another recurrent super/stretch enhancer and the remaining third  
41 split between non-recurrent super/stretch enhancers, no identified super/stretch enhancer, or  
42 rearrangements wholly confined to the region telomeric to *MYC*, frequently duplications with no  
43 exogenous sequences present (**Table S1A-B, Table S2-4**). The *IgH MYC* rearrangements often  
44 were complex - sometimes involving duplications and 3 or more chromosomes - and the *IgH*  
45 breakpoints were often within or near the 3' SE regions, suggesting a different timing or  
46 mechanism than the primary *IgH* translocations.

47  
48 By using an informative group of patients in which we were able to identify germline  
49 polymorphisms within the exons of *MYC* (n=147), we found 66/69 (96%) NDMM with elevated  
50 mono-allelic *MYC* expression have a *MYC* SV, whereas in 69/77 (90%) with variable levels of  
51 biallelic *MYC* expression no *MYC* SV was identified (**Table S5**). This highlights the functional  
52 significance of *MYC* SV, suggesting that our analysis is neither missing nor overcalling the  
53 presence of many *MYC* SVs, and that the primary mechanism of cis-dysregulation of *MYC* is by

54 SV. The level of expression of *MYC* is higher in samples with rearrangements compared to those  
55 without (**Figure 1A, B**), with similar levels whether an Ig or non-Ig enhancer is involved (p-  
56 value > 0.10), but intermediate levels for samples with a wholly confined telomeric  
57 rearrangement.

58  
59 While in patients with *MYC* SV there was no correlation between *MYC* expression and NFκB  
60 index (**Figure 1C**), in patients lacking *MYC* SV, there was a strong linear correlation (**Figure**  
61 **1D**), identifying coordinate dysregulation of *MYC* associated with both constitutive and ligand-  
62 dependent NFκB pathway activation. Unlike many cancers, we did not find a correlation  
63 between the presence of *MYC* SV, or the level of *MYC* expression, and proliferation, as  
64 measured using a gene expression index (data not shown). As recently noted<sup>9</sup> *MAX* mutations or  
65 inactivation correlate with extremely low levels of *MYC* expression, and we found that  
66 aberrations in these genes rarely occur together (**Figure 1B**). (**Table S6**). This data suggests that  
67 as reported for small cell lung cancer<sup>10</sup> and oligodendroglial tumors<sup>11</sup>, aberrancies of *MYC* and  
68 its heterodimeric partner *MAX*<sup>12</sup>, operate in a mutually exclusive fashion.

69  
70 Taken altogether, *MYC* SV, *MAX* inactivation and NFκB pathway mutation, identify a genetic  
71 mutation associated with *MYC/MAX* pathway dysregulation in two-thirds of NDMM (261+22+  
72 127/612, **Table S1A**). In 86 of the remaining patients (14% of the total) there is ligand dependent  
73 NFκB activation associated with increased *MYC* expression. The overwhelming majority of the  
74 remaining patients, representing 14% of the total (86/612), have a mutation activating the MAPK  
75 pathway (*RAS/BRAF/FGFR3*). Only one in twenty (30/612) tumors lacks evidence of  
76 dysregulation of the *MYC/MAX*, NFκB or MAPK pathway. In contrast, there is no correlation  
77 between *MYC* dysregulation and mutations of the MAPK pathway, which are instead inversely  
78 correlated with NFκB activation, particularly in patients without *MYC* SV (**Figure 1E and 1F**,  
79 **Table S7, S8**).

80  
81 We further expanded our genomic analysis and included premalignant stages in MM  
82 development. First, we established a sequencing panel targeting regions surrounding *IgH* (500  
83 Kb), *IgL* (100 Kb), *IgK* (50 Kb) and *MYC* (2 Mb) loci, in addition to detecting SNVs in 88  
84 important MM genes<sup>13</sup>. The robustness of the approach was tested by comparing with FISH data

85 from 90 primary samples, and for 60 of these also with Mate Pair whole genome sequencing  
86 (WGS). Across all 90 samples, the Custom Capture approach was able to detect 93% (39/42) of  
87 *IgH* translocations and 86% (19/22) of *MYC* SVs previously detected by FISH and Mate Pair  
88 WGS, respectively (details in Supplementary Methods). and as such we slightly underestimate  
89 the incidence of *MYC* SV in MGUS and SMM compared to MM patients in the CoMMpass  
90 study.

91  
92 We analyzed 23 unselected MGUS cases using the sequencing panel. Three patients had an N  
93 and/or K-RAS, two had NF $\kappa$ B pathway mutations (TRAF2 and CYLD) and none had  
94 rearrangements in the *MYC* locus. However, canonical initiating events (HRD and *IgH*  
95 translocations with *MAF*, *MAFA*, *MMSET*, *CCND1*, and *CCND3*) were observed in all but four  
96 samples, three with no clear initiating event and the other an *IgH* rearrangement with *UPK2*  
97 (**Table S9**, **Table S10-S12**). When analyzing 90 SMM samples with the sequencing panel, 22  
98 cases were observed with *MYC* SVs (24%), including 5 *IgH-MYC* and 1 *IgL-MYC* SV (**Table**  
99 **S9**). The time to progression (TTP) for SMM cases with non-Ig *MYC* SVs was not significantly  
100 different than cases without any *MYC* SV (median TTP of 45 versus 61 months, p-value >0.10).  
101 However, the SMM cases with Ig *MYC* SVs progressed rapidly to MM (all 6 cases progressed  
102 within 23 months of observation, **Figure 2A**). On multivariate analysis performed using Mayo  
103 Clinic criteria for high risk of progression Ig *MYC* SVs retained significance (HR 4.59, p 0.003)  
104 as an independent prognostic marker for rapid progression to MM (**Table S13**).

105  
106 In an expanded analysis of potentially relevant genomic features within this SMM cohort, *DIS3*  
107 mutations associated with rapid progression to MM along with Ig *MYC* SVs (**Table S14**).  
108 Notably, many CNAs that are commonly aberrant and often associated with adverse prognosis in  
109 NDMM, such as gain of 1q or deletion of 13q, bore no significant association with progression to  
110 MM despite increased frequency with advancing disease stage (**Figure 2C**, **Table S15**, **S16**).

111  
112 While *DIS3* mutation and Ig *MYC* SVs were significantly associated with rapid progression to  
113 MM in SMM, Ig *MYC* SVs alone only bordered on significance in NDMM (PFS p-value =  
114 0.055) but did achieve significance when paired with *DIS3* mutation (PFS p-value < 0.05, **Table**  
115 **S17**). In contrast to SMM, we observed that IgL, rather than IgH or IgK *MYC* SV, were

116 associated with more rapid disease progression in NDMM (**Figure S1**)<sup>14</sup>. In a more focused  
117 analysis comparing prognostic associations of *MYC* SV types (Ig, non-Ig, or none), we observed  
118 that HRD cases with a non-Ig *MYC* SV had uniquely beneficial prognosis with a significantly  
119 reduced rate of progression (82% cases without PFS events at 2-years compared to 59% in  
120 remaining cases, **Figure 2B**) while no difference in outcome was noted across *MYC* SV type in  
121 non-HRD MM (**Figure S2, S3**). Both the combination of non-Ig *MYC* SVs with HRD positivity  
122 and IgL *MYC* SV retained significant association with PFS in multivariate models including  
123 covariates for key genomic features (*MMSET* or *MAF* translocations, 1q gain, 13q loss, 17p loss,  
124 *DIS3* mutation), treatment strategy, i.e. use of combined therapy with Immunomodulatory drugs  
125 (Imids), and International Staging System (ISS) stage (**Table S18**). Whereas previous studies in  
126 lymphoma, and MM have shown *MYC* SVs to be an adverse prognostic factor<sup>6, 15</sup> we did not  
127 observe this in our studies of SMM or MM. This suggests that *MYC* may serve a somewhat  
128 different role in MM, less focused on proliferation and instead driving protein translation and  
129 metabolism to meet the demands of highly secretory plasma cells. Our findings require further  
130 investigation but provides preliminary evidence that outcome, and likely function, of *MYC*  
131 rearrangements is dependent upon partnered enhancer and genetic context. It is supported by the  
132 parallel observation of a much more rapid progression from MGUS through SMM to MM for  
133 patients with Ig *MYC* SV, but not non-Ig *MYC* SV.

134  
135 Our analyses demonstrate that MM tumors rely for progression on a few signaling pathways  
136 (*MYC*, RAS, NFkB) that show functional redundancy and complementary activation, with at  
137 least one pathway activated in 95% of NDMM. In contrast to previous studies of serial samples,<sup>7</sup>  
138 our analysis of MGUS cases showed a lack of key progression features, e.g., 0/23 with *MYC* SV  
139 and only 2/23 with a clonal NFkB or KRAS mutation. This discrepancy is likely due to not  
140 selecting samples known to progress to MM. Focusing on the same 3 progression pathways for  
141 SMM vs MM, *MYC* SV are 24 vs 43%, NFkB mutations 12 vs 32%, and RAS pathway  
142 mutations 46 vs 53%. Rapid progression of SMM to MM appears to be independently associated  
143 with Ig *MYC* SV and *DIS3* mutations, and possibly with NFkB mutations.

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## 151 Authorship Contributions

152 PLB, WMK and KM originated concept and design of investigation, KMK EB developed  
153 custom capture panel, SVW FISH analysis, GA primary samples, YA GD WMK PLB developed  
154 additional bioinformatics methods, NK KM CKS PLB WMK performed analyses, and NK KM  
155 CKS WMK PLB composed manuscript. We thank JK and MMRF research network for their  
156 work on CoMMpass. All authors read and approved of final manuscript.

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## 158 Conflict of Interest Disclosures

159 None.

160

## 161 Figure Legends

### 162 Figure 1. Location of *MYC* breakpoints and variation in *MYC* expression

163 The exact location of breakpoints (black dots) at the *MYC* locus for the 260 NDMM cases  
164 with *MYC* SV in the CoMMpass cohort, shows that the breakpoints clustered within an  
165 approximately 2Mb region around *MYC*, with three breakpoint cluster regions: one centered on  
166 *MYC*, a less frequent one centromeric, and more common one telomeric to *MYC*. The level  
167 of *MYC* expression (log transform of Salmon TPM) is shown on the Y-axis, and shows that the  
168 breakpoints were associated with an increased expression of *MYC*, (**A**). The level  
169 of *MYC* expression is highest in cases with IG or Non-IG *MYC* SVs (median TPM 79; non-  
170 significant one-sided Wilcoxon test between IG and Non-IG *MYC* SVs, p-value > 0.05)  
171 according to data from 612 NDMM CoMMpass cases. Cases with IG or non-IG *MYC* SVs have  
172 significantly higher *MYC* expression than those with wholly confined telomeric *MYC* SVs  
173 (median TPM 38, p-value < 0.001), who in turn have significantly higher expression than cases  
174 with NFkB aberrations (median TPM 26, p-value < 0.05), and cases with RAS or FGFR3  
175 mutations (median TPM 15) have low expression of *MYC*, even lower than cases with NFkB  
176 aberrations (p-value < 0.001). *MYC* expression is lowest in cases harboring *MAX* aberrations  
177 (median TPM 1, **B**). Across patients with *MYC* SVs, there was no correlation between the level  
178 of expression of *MYC* and NFkB aberrations or index (**C** and **E**). However, in patients  
179 without *MYC* SV, there is a significant correlation between the level of *MYC* TPM and the NFkB  
180 index (**D** and **F**). Vertical line in plots **C** and **D** denotes the median NFkB<sub>i</sub>. Correlation triangles  
181 report Spearman correlations between variables when highly significant (p-value < 0.001) with  
182 negative correlation in blue, positive correlation in red, and size of circle associated with  
183 absolute value of correlation.

184

### 185 Figure 2. Progression in SMM and NDMM and genomic copy number comparison of

### 186 MGUS, SMM, and NDMM

187 An analysis of *MYC* SVs in SMM cohort revealed that *MYC* rearrangements that juxtaposed any  
188 of the Ig regions (five *IgH*, one *IgL*) had a rapid progression to MM (**B**). However, in NDMM,  
189 only cases with *IgL* *MYC* SVs had inferior outcomes (see also Supplementary Figure S1)

190 Additionally, HRD cases harboring a Non-Ig *MYC* SV had a significant association with  
191 improved performance (**B**) not observed for Non-HRD (NHRD) cases (Supplementary Figures  
192 S2 and S3). Across 23 MGUS, 90 SMM, and 612 NDMM cases, the percent of samples with a  
193 gain and loss were determined at equal 30 Kb intervals across the entire genome. A gain was  
194 denoted if copy number segment values at given location was greater than  $\log_2(2.25/2)$  and loss  
195 if segment value was below  $\log_2(1.30/2)$ . Across entire chromosomes, many of the copy number  
196 gains and losses are similarly prevalent across disease stages, however gain of 1q and loss of 13q  
197 significantly increase in frequency with disease stage, more so than any other chromosomes. (**C**)  
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