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# MSI2 is required for maintaining activated myelodysplastic syndrome stem cells

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Myelodysplastic syndromes (MDS) are driven by complex genetic and epigenetic alterations. The MSI2 RNA-binding protein has been demonstrated to have a role in acute myeloid leukaemia and stem cell function, but its role in MDS is unknown. Here, we demonstrate that elevated MSI2 expression correlates with poor survival in MDS. Conditional deletion of *Msi2* in a mouse model of MDS results in a rapid loss of MDS haematopoietic stem and progenitor cells (HSPCs) and reverses the clinical features of MDS. Inversely, inducible overexpression of MSI2 drives myeloid disease progression. The MDS HSPCs remain dependent on MSI2 expression after disease initiation. Furthermore, MSI2 expression expands and maintains a more activated (G1) MDS HSPC. Gene expression profiling of HSPCs from the MSI2 MDS mice identifies a signature that correlates with poor survival in MDS patients. Overall, we identify a role for MSI2 in MDS representing a therapeutic target in this disease.

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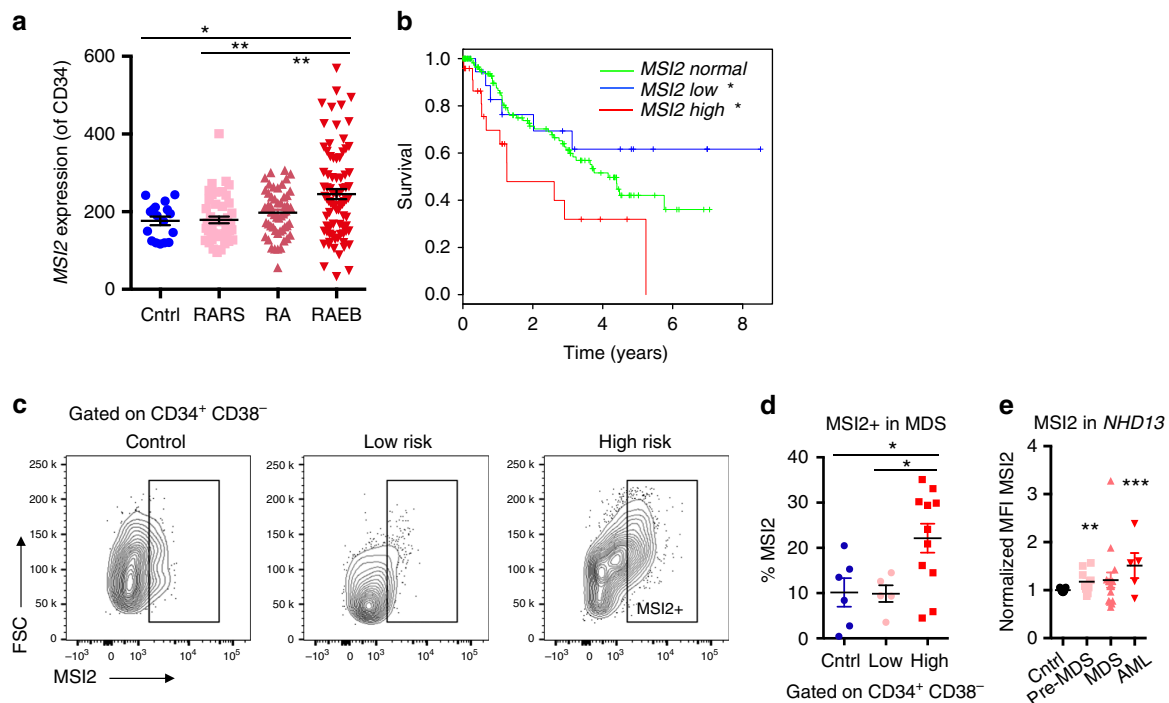
The majority of haematological disorders involving the myeloid lineage are thought to be of stem cell origin, including myeloproliferative diseases, myelodysplastic syndromes, acute myeloid leukaemia and acquired or heritable bone marrow failure syndromes<sup>1–3</sup>. In each instance, dysregulation of normal stem cell function is thought to contribute to the disease phenotype. Moreover, stem cell characteristics are modulated by a variety of developmental pathways and regulators. Recent studies of *MSI2* in normal and malignant hematopoietic stem cell (HSC) biology suggested that *MSI2* might play a role in myelodysplastic syndromes (MDS)<sup>4–11</sup>. It was previously reported that *MSI2* expression in MDS was reduced in patients with low-risk and high-risk MDS compared with normal CD34<sup>+</sup> cells<sup>7</sup>. However, in this study there was a subset of MDS patients with excess blasts with increased *MSI2* (ref. 7). The functional importance of *MSI2* in MDS therefore remains unclear. We examine previously published expression data sets and patient samples to find that *MSI2* is increased in high-risk MDS patients. Additionally, we utilize *MSI2* loss and gain of function approaches in the context of a mouse model of MDS and find that *MSI2* is required for MDS.

## Results

**Elevated *MSI2* expression predicts poor survival in MDS.** In our examination of a previously published expression data set, we found that *MSI2* expression was increased in CD34<sup>+</sup> population in high-risk MDS patients (refractory anemia with excess blasts; RAEB) compared with healthy individuals that were not age

matched or Low-Risk MDS (Refractory Anemia; RA or refractory anemia with ringed sideroblasts; RARS), Fig. 1a)<sup>12</sup>. Elevated *MSI2* levels correlated with a poor clinical survival (Fig. 1b and Supplementary Fig. 1a). In line with the microarray data, high-risk MDS patients had increased intracellular *MSI2* in their CD34<sup>+</sup>CD38<sup>-</sup> cells compared with low-risk MDS patients and healthy individuals (Fig. 1c,d). Altogether, the MDS patient data suggests that the level of *MSI2* expression correlates with disease subtype and clinical outcome. In contrast to the acute myelogenous leukemia (AML) patient data, where elevated *MSI2* expression correlates with FLT3-ITD/*NPM1* mutations<sup>5,8,9,11</sup>, MDS patients do not typically harbour these mutations. Due to the low number of patients with recurrent mutations in this study, we are unable to correlate *MSI2* levels with individual mutations (Supplementary Table 1).

***Msi2* is required for MDS.** To test if *Msi2* could be functionally important in MDS, we utilized a murine model of MDS. The *NUP98-HOXD13* transgenic model (*NHD13*) recapitulates many of the salient features of MDS, including neutropenia, lymphopenia and hypercellular or normocellular bone marrow at 4–7 months<sup>13–16</sup>. Also, 12–17% of the marrow contains dysplastic erythroid, myeloid and rare megakaryocytic cell types<sup>13</sup>. Similar to patients with MDS, a significant cohort of the primary mice can progress and develop an aggressive AML. However, if the bone marrow of *NHD13* mice is transplanted, the recipient animals succumb to a fully penetrant but non-lethal form of MDS that rarely progresses to AML (ref. 15). Although the *NHD13*



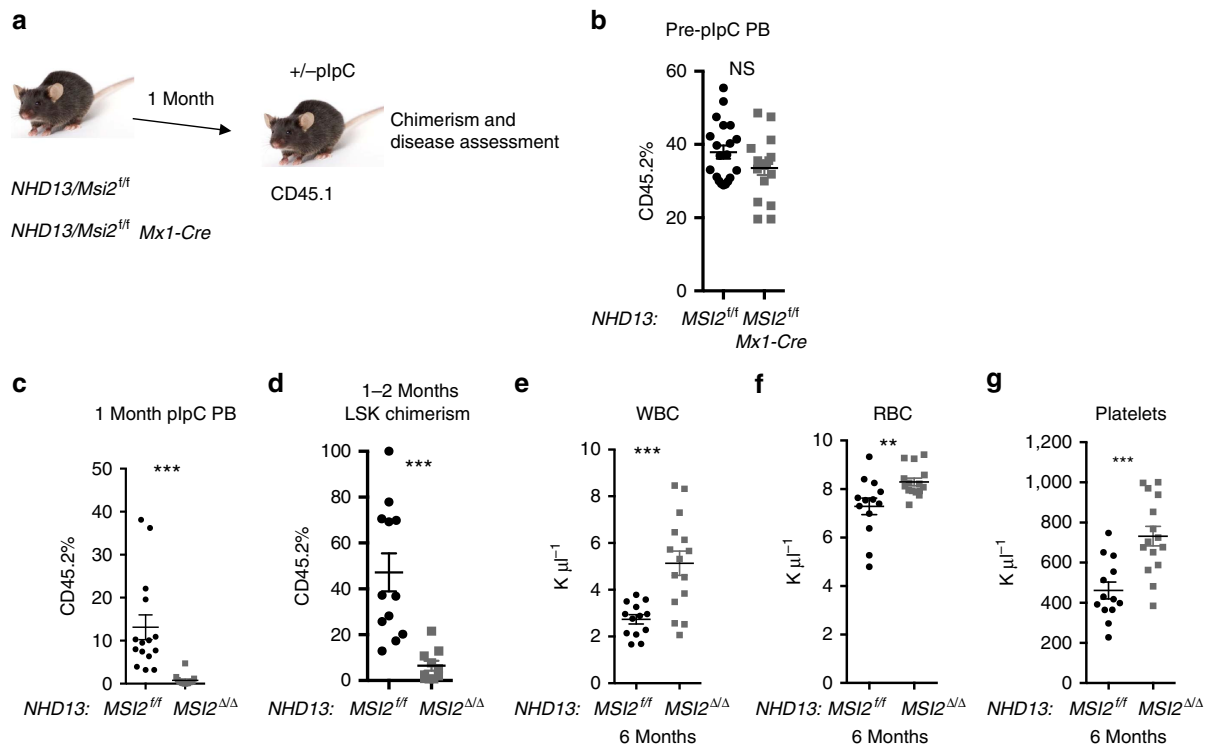
**Figure 1 | Elevated *MSI2* expression predicts poor survival in MDS.** (a) Microarray expression data (CD34<sup>+</sup> population) from normal elderly individuals (CD34<sup>+</sup>;  $n = 17$ ) and MDS ( $n = 183$ ), RARS, RA, RAEB, \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$  Student's  $t$ -test mean  $\pm$  s.e.m.<sup>12</sup>. (b) Overall survival in MDS patients stratified by *MSI2* expression (as high (Z-score  $> 1$ ), low (Z-score  $< -1$ ), or normal ( $-1 \leq$  Z-score  $\leq 1$ ) log-rank test. (c) Representative flow cytometric analysis of independent patient cohort of primary patients samples gated on CD34<sup>+</sup>CD38<sup>-</sup> and stained for intracellular *MSI2*, age-matched elderly individuals ( $n = 6$ ), low risk (RA or RARS;  $n = 5$ ) and high risk (RAEB-1, RAEB-2  $n = 10$ ) (d). *MSI2* positivity summarized from gating of patients in c. (e) *MSI2* intracellular levels in the *NHD13* MDS/AML animal model. Cells are initially gated on *MSI2*-positive cells (Supplementary Fig. 1 for gating) and median fluorescence intensity (MFI) is normalized to the control (C57BL6 mice),  $n = 19$ . Pre-MDS represents the analysis performed in *NHD13* primary or transplanted mice within 1–2 months of birth and before MDS onset ( $n = 9$ ), the MDS mice that are older than 2 months or primary transplanted and have low WBC, ( $n = 16$ ) and AML samples are from *NHD13* mice that have transformed to AML ( $n = 5$ ), d and e \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$  Student's  $t$ -test horizontal line is the mean  $\pm$  s.e.m.

transplanted bone marrow cells engraft poorly, they still retain the clinical features of MDS (~10–20% peripheral blood chimerism)<sup>15</sup>. Utilizing intracellular staining for MSI2, we found a significant albeit modest increase in MSI2 levels in the bone marrow of 44% of *NHD13* pre-MDS, 50% of MDS, and 80% of AML animals (Fig. 1e and Supplementary Fig. 1b). The significant increase in MSI2 was also observed within the sorted progenitors from pre-MDS animals (Supplementary Fig. 1c,d).

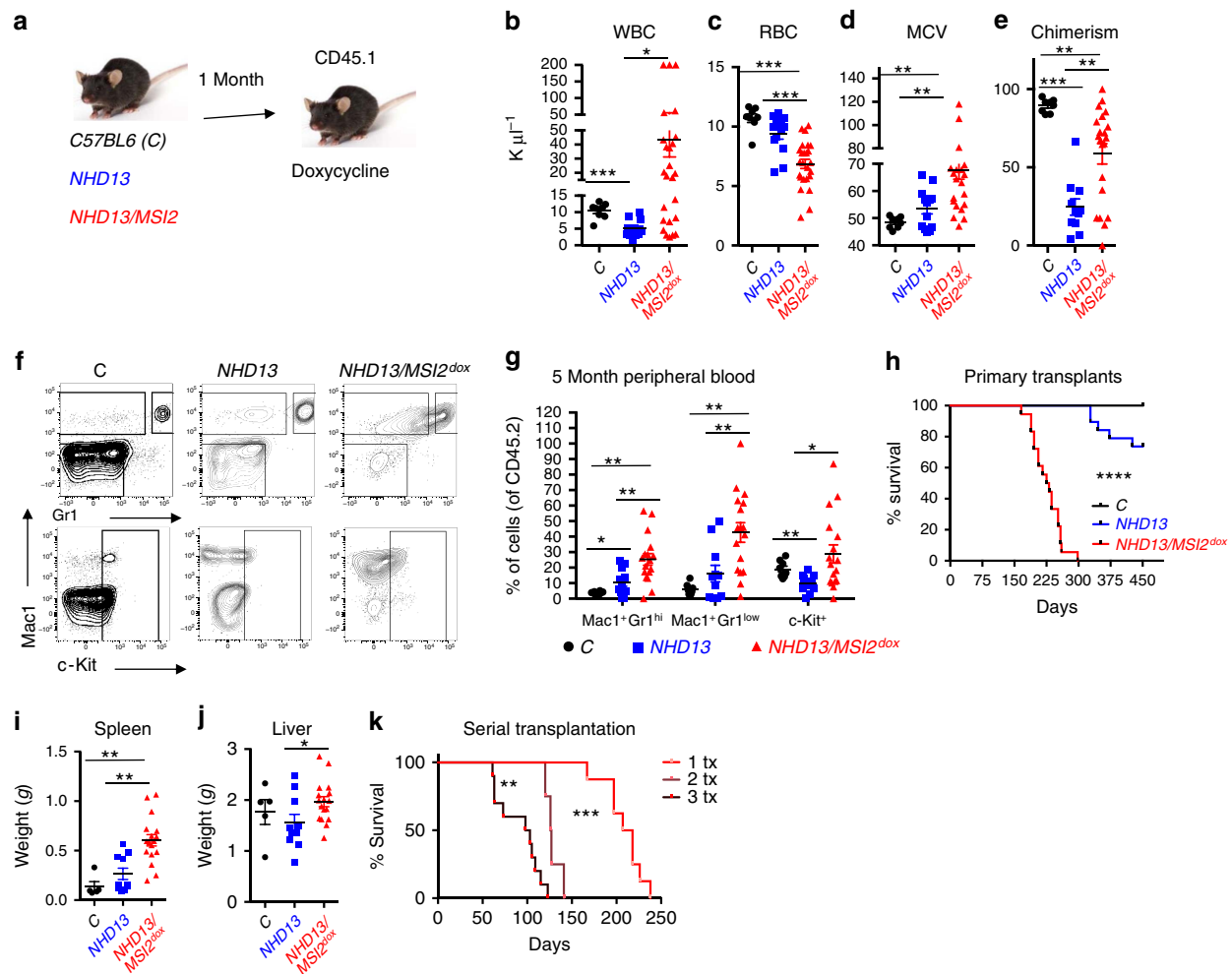
In agreement with MDS patient data, we observed an increase in the expression of MSI2 in the *NHD13* mice during disease progression. These data suggested that altering MSI2 levels in the *NHD13* model could alter the disease fate. To test this hypothesis, *Msi2* conditional knockout were crossed with the *NHD13* mice and then transplanted into congenic recipients (Fig. 2a,b). The chimerism in the peripheral blood and at the level of the haematopoietic stem and progenitor cell (HSPC) was significantly reduced one month after pIpC-mediated deletion (Fig. 2c,d). *Msi2* deletion resulted in the loss of the *NHD13*-expressing cells and a reversal of MDS-like disease that included an increase in white blood cell (WBC) counts, red blood cells and platelets (Fig. 2e–g). When the mice were analyzed 14 months after transplantation there was a trend towards reduced spleen weight, normalized WBC counts and significantly reduced chimerism in the HSPCs and in progenitors (Supplementary Fig. 2a–c). Despite the fact that some of the mice had detectable donor chimerism, the donor myeloid cells were mainly absent and the few remaining donor cells retained MSI2 expression indicating that the deleted cells were selected against (Supplementary Fig. 2d,e). Nevertheless, these

mice did not have detectable dysplastic cells or leukaemia in their bone marrow (Supplementary Fig. 2f).

**MSI2 overexpression in MDS drives transformation.** We next assessed if forced MSI2 expression could alter the disease course using the same model of MDS. Of note, MSI2 overexpression by itself does not result in leukaemic transformation<sup>5</sup>. We utilized our previously described inducible MSI2 overexpressing mouse model that can be controlled with doxycycline (*KH2-Col1A1-tet-on-MSI2/ROSA26-rTTA*) and crossed them with the *NHD13* mice<sup>5</sup>. Control (C57BL/6), *NHD13* or *NHD13/MSI2* bone marrow was transplanted into congenic mice and then allowed to engraft before MSI2 was induced (Fig. 3a). After 5 months the *NHD13/MSI2* overexpression mice started to succumb to lethal myeloid diseases while the *NHD13* mice had symptoms of a mild MDS. The *NHD13/MSI2* mice had reduced WBC (5/25) or elevated WBC counts, reduced red blood cell counts, increased mean corpuscular volume and increased chimerism in the blood at 5 months post-transplantation compared with the control and the *NHD13* mice (Fig. 3b–e). We observed increased immature myeloid cells in the peripheral blood, and all of the MSI2 overexpressing *NHD13* mice eventually succumbed to various lethal myeloid diseases including MPN/MDS or an AML/MDS with a median latency of 228 days (Fig. 3f–h and Supplementary Fig. 3a–g). At end point, we found that the *NHD13/MSI2* mice had a more severe disease burden based on increased spleen and liver weights compared with the control and *NHD13* mice (Fig. 3i,j). The *NHD13* mice



**Figure 2 | *Msi2* is required to maintain MDS.** (a) Transplant scheme for *Msi2* conditional knockout in *NHD13* MDS model. (b) Peripheral blood chimerism 4 weeks posttransplantation as described in a, (*NHD13/Msi2*<sup>fl/fl</sup> *n* = 20 and *NHD13/Msi2*<sup>fl/fl</sup> *Mx1-Cre*; *n* = 18). (c) Peripheral blood chimerism 8-weeks posttransplantation (4-weeks post-plpC treatment; *NHD13/Msi2*<sup>fl/fl</sup> *n* = 15 and *NHD13/Msi2*<sup>Δ/Δ</sup> *Mx1-Cre*; *n* = 14). (d) Chimerism within the haematopoietic stem and progenitor cell compartment from bone marrow aspirates performed 8-weeks posttransplantation, gated on Lin-Sca1<sup>+</sup>Kit<sup>+</sup> cells, (*NHD13/Msi2*<sup>fl/fl</sup> *n* = 12 and *NHD13/Msi2*<sup>Δ/Δ</sup> *Mx1-Cre*; *n* = 10). (e) WBC. (f) Red blood cells (RBC). (g) Platelets at 6 months posttransplant. f–h, (analysed at 6 months post-plpC, *NHD13/Msi2*<sup>fl/fl</sup> *n* = 13 and *NHD13/Msi2*<sup>Δ/Δ</sup> *Mx1-Cre*; *n* = 15). Data in b–g are represented two independent transplants \**P* < 0.05, \*\**P* < 0.01, \*\*\**P* < 0.001, Student's *t*-test horizontal line is the mean ± s.e.m.

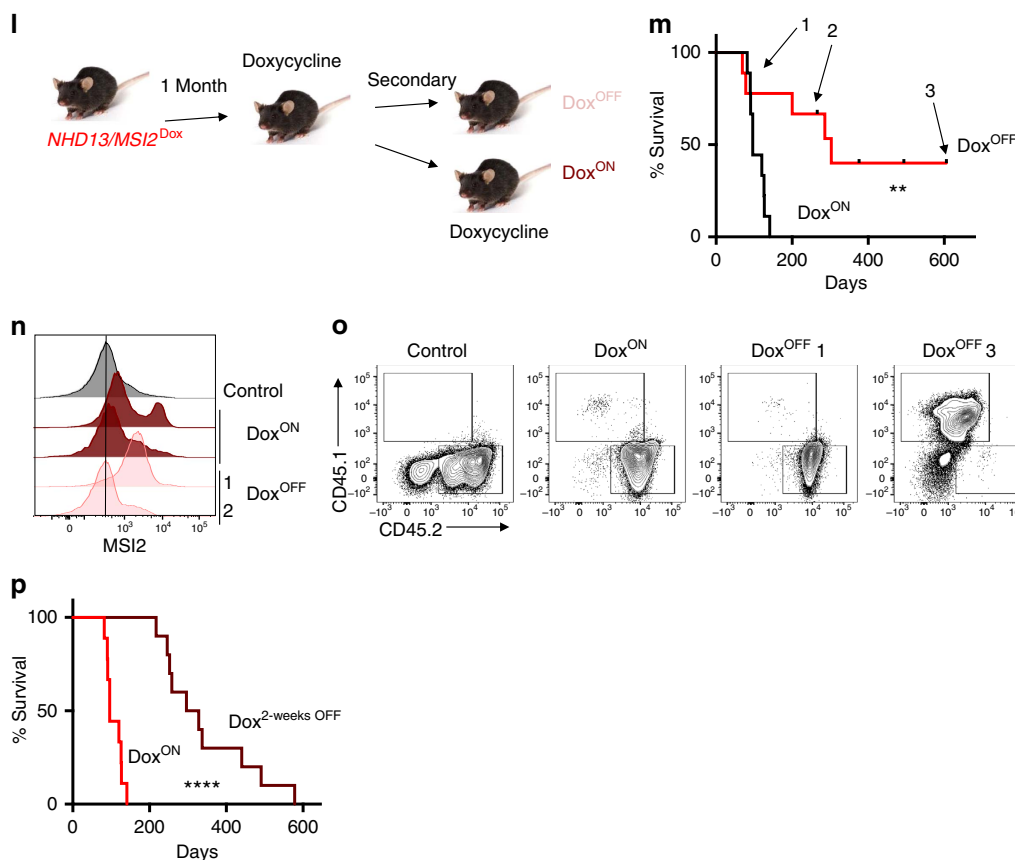


**Figure 3 | Sustained MSI2 overexpression transforms MDS to a lethal AML.** (a) Experimental scheme for MSI2 overexpression in the *NHD13* transplant model. (b) Peripheral blood analysis 5 months posttransplantation, including WBC. (c) Red blood cell count (RBC). (d) Mean corpuscular volume (MCV). Data in b–d, (C;  $n = 8$ , *NHD13*;  $n = 13$ , *NHD13/MSI2*;  $n = 25$ ). (e) Chimerism (CD45.2) in the peripheral blood 5 months posttransplantation, (C;  $n = 8$ , *NHD13*;  $n = 11$ , *NHD13/MSI2*;  $n = 21$ ). (f) Representative Mac1, Gr1, and c-Kit staining of peripheral blood from the bone marrow. Mice were analysed 5 months posttransplant and gated on CD45.2<sup>+</sup> cells. (g) Immunophenotyping of peripheral blood 5 months posttransplant. Samples gated as in e, data in f and g, (C;  $n = 8$ , *NHD13*;  $n = 11$ , *NHD13/MSI2*;  $n = 17$ ). (h) Survival curves of *NHD13* with MSI2 overexpression combined from two independent transplants mice (C;  $n = 8$ , *NHD13*;  $n = 15$ , *NHD13/MSI2*<sup>Dox</sup>;  $n = 18$ ). (i) Spleen and (j) liver weights from healthy mice analysed at the end point or moribund mice, (C;  $n = 5$ , *NHD13*;  $n = 10$ , *NHD13/MSI2*;  $n = 17$ ). (k) Survival analysis of serially transplanted myeloid disease in the *NHD13/MSI2*<sup>Dox</sup> mice (primary donor;  $n = 8$ , secondary;  $n = 4$  and tertiary transplants;  $n = 10$ ; transplanted from two independent donors). (l) Experimental scheme for testing MSI2 dependence of *NHD13/MSI2* AML. The bone marrow from moribund primary *NHD13/MSI2* transplanted animals was secondarily transplanted into congenic mice and treated accordingly. (m) Survival analysis for doxycycline on/off secondary transplants, (Dox<sup>ON</sup>;  $n = 8$  and Dox<sup>OFF</sup>;  $n = 8$  from two independent donors and transplants), Arrows 1, 2 and 3 indicate three representative mice that are described in n and o. (n) Intracellular MSI2 staining by flow cytometry in fixed bone marrows of representative moribund mice described in m. (o) Representative CD45.1/2 staining of mice at different points in the survival curve from m. (p) Survival analysis of doxycycline treated *NHD13/MSI2* secondary transplants relative to transplants whose recipients had a 2-week delay in doxycycline treatment posttransplant, Dox<sup>ON</sup>;  $n = 9$  and Dox<sup>OFF</sup>;  $n = 10$  from two independent transplants). Data in b–k, are represented two independent transplants \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$ , b–e, g, i and j are Student's *t*-test and horizontal line is the mean  $\pm$  s.e.m and h, k, m and p, *P* values assessed by log-rank.

showed signs of a MPN/MDS or MDS disease, but only 3 out of 15 mice died of a characterized myeloid disease (AML/MDS  $n = 2$ , MDS  $n = 1$ , and one mouse was found dead and another died of a non-myeloid disease; Fig. 3i,j). Serial transplantation of the *NHD13/MSI2* demonstrated reduced latency further supporting the idea that MSI2 overexpression resulted in a clonal myeloid disease (Fig. 3k and Supplementary Fig. 3h). We secondarily transplanted the *NHD13* AMLs and then compared the disease burden to the secondary transplants from the *NHD13/MSI2* mice. Despite the fact that both groups had myeloid disease, the *NHD13/MSI2* group retained their more aggressive phenotype

compared with the *NHD13* AMLs indicated by the increased spleen and liver weights (Supplementary Fig. 3i,j).

**MSI2 maintains activated MDS stem and progenitor cells.** We then determined if MSI2 overexpression was required to maintain the disease. Thus, we transplanted *NHD13/MSI2* overexpressing mice into secondary recipients with or without doxycycline feed. Mice that were maintained on doxycycline and expressed MSI2 rapidly formed a lethal myeloid disease, while the majority of mice that were no longer being induced survived significantly



**Figure 3 | continued.**

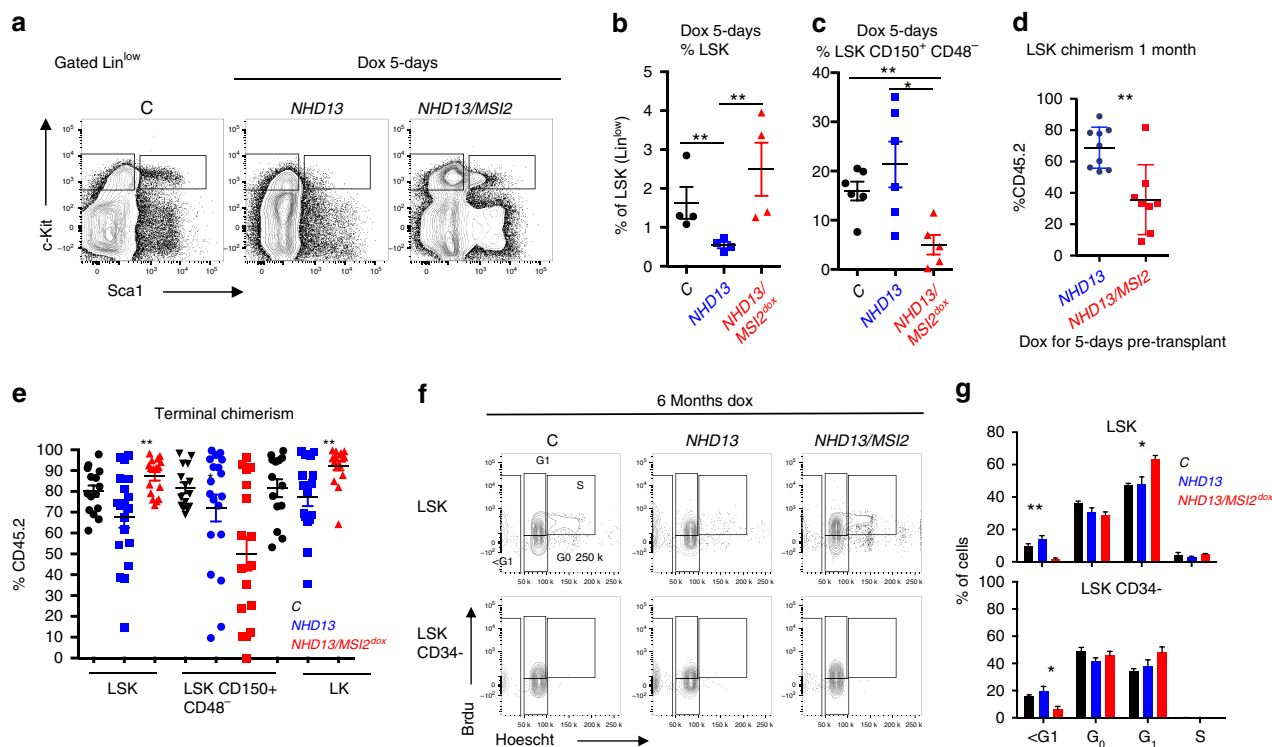
longer (median, 96 versus 303 days; Fig. 3l,m and Supplementary Fig. 3k–t). Moreover, in mice that were no longer induced and died at the same time as the mice in the induced group, we were still able to detect high levels of intracellular MSI2 suggesting selection for constitutive activation *in vivo* (Fig. 3n). Similarly, a mouse that died later also demonstrated leaky MSI2 expression albeit at lower levels compared with the mouse that died earlier. Overall, in all the mice that died of leukaemia, MSI2-positive cells were detectable. However, mice killed at the experimental end point that remained disease free, we found that the chimerism was either low or undetectable (Fig. 3o). To further examine if transient withdrawal of MSI2 expression could also delay the leukaemia, we transplanted *NHD13/MSI2* cells and waited 2 weeks to induce MSI2 expression (Fig. 3p). We observed a delay in the myeloid leukaemia (312 days compared with 96 days) in the control, and these leukaemias relapsed with MSI2 positivity, providing evidence that MSI2 overexpression must be sustained to maintain disease.

*NHD13* haematopoietic cells have a block in their differentiation at the HSC to multipotent progenitors (MPP) stage and have dramatically reduced numbers of HSPCs (ref. 16; Fig. 4a,b). MSI2 induction for 5 days resulted in an increase in the percentage of phenotypic LSKs (Lin-Sca1<sup>+</sup>Kit<sup>+</sup> cells) and a decrease in the phenotypic HSCs, but no difference in the frequency of the myeloid or erythroid progenitors (Fig. 4a–c and Supplementary Fig. 4a). Interestingly, if the 5-day-induced *NHD13/MSI2* cells were then transplanted in the absence of doxycycline to turn off MSI2, we observed reduced chimerism at 1 month (Fig. 4d). Alternatively, when non-induced bone marrow was engrafted and then activated for MSI2, the LSK compartment was expanded at 1 month (Supplementary Fig. 4b), and in the diseased *NHD13/MSI2* mice LSKs and myeloid progenitors (granulocyte-monocyte progenitor (GMP) and common myeloid progenitor (CMP))

were increased compared with the *NHD13* mice (Fig. 4e and Supplementary Fig. 4c). Similarly to the 5-day induction the chimerism of the phenotypic HSCs (LSK<sup>+</sup>CD150<sup>+</sup>;CD48) was reduced in the diseased *NHD13/MSI2* compared with the *NHD13* and the control animals. We then profiled the cell cycle status of the HSPCs using Brdu incorporation and Hoechst staining and found reduced cell death (sub-G1) and increased percentage of cells in G1, which suggests the accumulation of more activated HSPCs (Fig. 4f,g). Taken together with the previous data, MSI2 expression maintains a more aggressive myeloid disease and a more activated HSPC.

To further characterize how MSI2 alters the *NHD13* MDS programme in the dysregulated stem cell compartment, we performed transcriptome profiling in the HSPCs (LSK) from transplanted mice after 3 months of doxycycline administration and before the mice demonstrate any disease phenotype. To elucidate the *NHD13/MSI2* expression programme, we utilized a generalized linear model that identified 891 significant genes (q-value < 0.01, generalized linear model), of which 137 genes were upregulated (log<sub>2</sub> fold change > 0) and 754 genes were downregulated (log<sub>2</sub> fold change ≤ 0). We then matched the gene signature to human homologues (690 genes; Supplementary Data 1) and created a heatmap after unsupervised hierarchical clustering, which separated the samples into their respective groups (Fig. 4h).

To functionally annotate our RNA-sequencing, we performed gene set enrichment analysis<sup>17</sup> on all curated gene sets in the molecular signatures database (<http://www.broadinstitute.org/msigdb>; 3,256 gene sets) combined with an additional set of relevant gene sets (92 gene sets from our experimentally derived or published haematopoietic self-renewal and differentiation signatures<sup>4,17</sup>; rank list; Supplementary Data 2). We found 14 gene sets that were enriched for genes that were upregulated and



**Figure 4 | MSI2 overexpression leads to haematopoietic progenitor stem cell expansion.** (a) Representative flow cytometry of primary animals treated with doxycycline (Dox) for 5 days and live and Lin<sup>low</sup> gated. (b) Percentage of LSK population among the Lin<sup>low</sup> compartment from primary mice (C; *NHD13* and *NHD13/MSI2*<sup>Dox</sup>;  $n = 6$ ,  $n = 6$  and  $n = 5$  from five independent experiments). (c) Percentage of the HSC (LSK + CD150<sup>+</sup> CD48<sup>-</sup>) compartment gated from the LSK<sup>+</sup> at 1 month transplantation after 5 day dox administration in the primary animals, data representative (C; *NHD13* and *NHD13/MSI2*<sup>Dox</sup> same as b). (d) Chimerism (CD45.2) in the LSK compartment at 1 month transplantation after 5 day dox administration in the primary animals, data representative of two independent transplants (*NHD13*;  $n = 9$ , *NHD13/MSI2*<sup>Dox</sup>;  $n = 8$ ). (e) Terminal chimerism from transplants in Fig. 3 in the gated populations, (C, *NHD13*, *NHD13/MSI2*<sup>Dox</sup>;  $n = 11$ -16 combined from two independent transplants). (f) Representative flow cytometric plots from transplanted mice analysed (combined experiments from 3 and 7 months posttransplant) that were injected with BrdU 24 h and then sorted for LSK cells and gated accordingly. (g) Data represented in f, ( $n = 3$  for each group combined from two independent experiments). (h) RNA-sequencing of LSK sorted cells from primary transplanted animals (4 months posttransplantation and 3 months post *MSI2* induction) before disease initiation underwent unsupervised clustering of the differentially expressed genes with human homologues, (C;  $n = 3$ , *NHD13*;  $n = 2$ , *NHD13/MSI2*<sup>Dox</sup>;  $n = 4$ ). (i-k) Gene set enrichment analysis (GSEA) from ranked list of *NHD13/MSI2*<sup>Dox</sup>/*NHD13* versus Control. (l) Unsupervised clustering of the mouse *NHD13* signature overlapped with MDS patients. (m) *MSI2* expression (Z-score) separated based on clustering in l. (n) Survival of MDS patients based on clusters from the *NHD13/MSI2* signature (l,m). Data in b-e,g and m \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$ , are Student's *t*-test and the horizontal line is the mean  $\pm$  s.e.m and n, *P* values are displayed and calculated with log-rank.

29 gene sets enriched for downregulated genes (Supplementary Tables 2 and 3). The top ranked gene sets included enrichment in an *NRAS* activated signature<sup>18</sup>, a reduced quiescent phenotype<sup>19</sup> and a more progenitor-like cell (Fig. 4i-k). Taken together with our phenotypic analysis of the HSPC compartment, *MSI2* induction increases the cells that are in G1, switching them to a less quiescent and more progenitor-like gene expression signature.

To determine if the *MSI2* signature from the murine model of MDS corresponds to patients with MDS, we overlapped the *NHD13/MSI2* RNA-seq (690 genes) with microarray data from control ( $n = 17$ ) and MDS patients ( $n = 183$ ) (refs 12,20). After unsupervised clustering of the human microarray data, we obtained four distinct clusters (Fig. 4l). Patients with elevated *MSI2* expression were mainly found in Cluster-2, which predicted a poor survival compared with the other clusters (Fig. 4m,n). Our study demonstrates an important functional role of *MSI2* in MDS (Supplementary Fig. 4d).

## Discussion

In summary, we found that elevated *MSI2* expression predicts poor prognosis in MDS and is required for maintaining the

diseased MDS stem cell. Cooperativity with *NHD13* has been associated with various factors including *FLT3*, *MEIS1*, *P16* and *TP53* (refs 16,21-23). *MSI2* overexpression can act as a cooperating oncogene and drive transformation, accelerate leukaemia and increase disease burden in the context of a MDS mouse model. Additionally, we found reduced apoptosis and a more activated stem cell, suggesting that the altered HSPC may contribute to disease progression. Gene expression profiling of HSPCs from the *NHD13/MSI2* mice generated a signature that overlapped with human MDS and could predict patient outcome. Our lab previously found that *MSI2* directly binds to the mRNA of mixed-lineage leukaemia target genes including *Hoxa9*, *Myc* and *Ikzf2*, and regulates the translation of these targets in a mixed-lineage leukaemia-AF9 leukaemia model<sup>9</sup>. Additionally, a recent report showed that *Msi2* may regulate the development and propagation of AML through Tetraspanin 3 (refs 24). Future studies will determine how *MSI2* alter stem cells in MDS or whether it uses similar mechanisms as in AML.

Several studies have demonstrated that *Msi2* is required for HSPC engraftment<sup>4,10</sup>. It is unclear if in the context of suppressed hematopoiesis where few normal HSCs remain, targeting could result in additional toxicity. However, we found that the HSPC

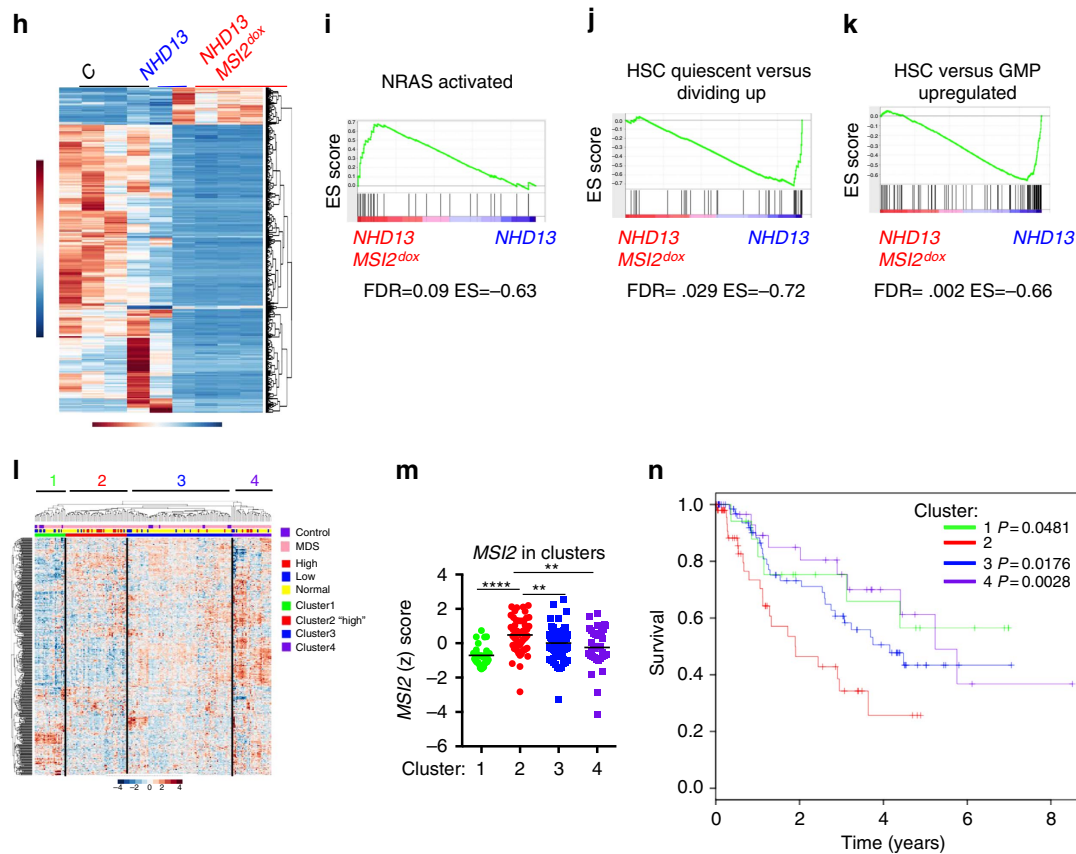


Figure 4 | continued.

population demonstrated a selective advantage and remained addicted to the forced MSI2 expression, as removal of MSI2 overexpression greatly reduced chimerism and reversed the myeloid disease. We propose that the increased expression of MSI2 in the HSPCs in high-risk MDS patients might allow for a therapeutic index in these patients. Our mouse model might provide a context to test how targeting MSI2 might alter the disease. Overall, our study suggests that targeting MSI2 could provide a therapeutic benefit in MDS.

## Methods

**Transgenic mice.** *KH2-Col1A1-tet-on-MSI2/ROSA26-rTTA* transgenic mice<sup>5</sup>, backcrossed 10 times to C57BL/6 strain or *Msi2* conditional knockout<sup>4</sup> were crossed with *Vav-Tg-NUP98-HOXD13* mice. The primary donors that were used for transplants were either male or female of 3–4-month-old animals<sup>14</sup>. All animal procedures were approved by the Institutional Animal Care and Use Committee at Memorial Sloan Kettering Cancer Center.

**Non-competitive transplants.** Transplants were performed with  $2\text{--}3 \times 10^6$  bone marrow cells from 12–16-week-old C57BL/6 donor mice mixed with  $0.2 \times 10^6$  CD45.1<sup>+</sup> helper cells injected into the retro-orbital of lethally irradiated B6.SJL-Ptprc<sup>a</sup> *Pepc<sup>b</sup>/BoyJ* recipient mice. Secondary transplants were performed by injecting  $1 \times 10^6$  bone marrow or spleen cells into sublethally irradiated B6.SJL-Ptprc<sup>a</sup> *Pepc<sup>b</sup>/BoyJ* mice.

**Peripheral blood analysis.** Peripheral blood was collected from the facial vein using a lancet or retro-orbital cavity using a heparinized glass capillary tube. A complete peripheral blood count was collected using a Hemavet 950 (Drew Scientific).

**Flow cytometry.** Flow cytometry experiments were carried out using BD Fortessa, LSRII, or LSRIIFortessa instruments. Bone marrow and spleen cells collected from mice were subjected to red blood cell lysis before staining. Peripheral blood and leukaemic bone marrow and spleen were immunophenotyped with the following antibodies: CD45.2, CD45.1, Mac1, Gr1, c-Kit, CD71, Ter119 and B220. For stem

cell analyses, bone marrow cells were stained with the following antibodies: lineage (Gr1, B220, CD3a, CD4, CD8 and Ter119), Sca1, c-Kit, CD150, CD48, CD16/32 and CD34. MSI2 staining was performed using a rabbit anti-mouse/human MSI2 antibody (Abcam) with a goat anti-rabbit Alexa647 conjugated secondary (Life Technologies). Anti-mouse antibodies were used at 1:200 and secondary antibodies were used at 1:400. Data analyses were performed using the FlowJo software.

**Statistical analyses.** To compute *P* values for bar graphs, an unpaired 2-tailed Student's *t*-test was used except where stated otherwise. Error bars reflect the s.e.m., except where stated otherwise. In survival curves, significance was calculated using log-rank analysis. Graph Pad Prism 4.0 and the R statistical environment were used to carry out all statistical analyses.

**NHD13 RNA-seq analysis.** *NHD13* mouse RNA-seq raw data were deposited to Gene Expression Omnibus (GEO) GSE76840. Differential analysis of RNA-seq samples utilized the DESeq package for gene expression analysis<sup>25</sup>. False discovery rate correction of *P* values used for all bioinformatics analyses of this study utilized the Benjamini–Hochberg procedure. Mapping between entrez IDs between mouse and human genes was done using the biomaRt R packages<sup>26</sup>. Heatmap clustering and production was done using the heatmap function found within the NMF package in R (ref. 27).

**Human data analysis and RNA-seq analysis.** The clinical microarray samples consist of 183 and 17 healthy controls from anonymized donors that were not age matched, but included elderly patients who underwent hip replacement. MDS patients and 17 controls samples were publically available on GEO with the reference series tag: GSE19429 (ref. 12). The MDS patient samples were collected from several centres: Oxford and Bournemouth (UK), Duisburg (Germany), Stockholm (Sweden) and Pavia (Italy). This study was approved by the ethics committees (Oxford C00.196, Bournemouth 9991/03/E, Duisburg 2283/03, Stockholm 410/03, Pavia 26264/2002) and informed consent was obtained<sup>12</sup>.

The microarray data were downloaded and had gene identifiers in the form of AffyID probes. For *MSI2* we mapped the probes and found that only 4 out of the 9 probes were correctly matched to *MSI2*. We utilized the Spearman correlation coefficient to assess the correlation with the remaining probes and the three probes, which showed a good correlation (1552364\_s\_at, 243010\_at and 243579\_at), were then averaged together. These AffyID probes were converted to human and mouse

Entrez IDs, which was done using the biomaRt tool in R. The AffyIDs that had human and mouse Entrez IDs were kept as it indicated that the AffyID corresponded to a human gene that had an orthologue in mouse. In the case that several AffyIDs mapped to a single human Entrez ID the corresponding AffyID rows were combined and a mean of their values were taken. This gave one row of mean expression of all Affy probes that corresponded to a human Entrez gene.

Kaplan–Meier curves were generated to gauge survival probability between the samples that had high, low and normal *MSI2* expression. A heatmap was generated using the statistically significant genes derived from the general linearized model. The rows in this expression matrix were log10 transformed and then a Z-score was computed for every element in the row. A heatmap was generated using this matrix of Z-scores. This heatmap allowed for row and column clustering. The 200 samples which composed this matrix were labeled according to whether the sample was derived from an MDS patient or a control. Additionally, the samples were labeled according to their French–American–British MDS clinical classification. The samples could take 1 of 4 possible classifications: healthy, RA, RA with excess blasts (RAEB) and RARS. Lastly, the samples were also classified according to their *MSI2* expression levels, which could be classed as high *MSI2* expression, low *MSI2* expression or normal *MSI2* expression. *MSI2* expression was classified as high if the Z-score for the *MSI2* in a sample was  $>1$ . *MSI2* expression was classified as low if the Z-score for the *musashi2* gene in a sample was  $<-1$ . *MSI2* expression was classified as normal if the Z-score for the *musashi2* gene in a sample was  $-1 \leq x \leq 1$ .

**Age-matched normal individuals and primary MDS patient samples.** Normal bone marrows from elderly individuals were obtained from hip replacements and MDS patient samples (PBMCs, low risk; RA  $n=3$ , RARS  $n=2$  and high risk; RAEB-1  $n=4$ , RAEB-2  $n=6$ ) were obtained from the Memorial Hospital Tumor Bank under the protocol IRB Waiver Number: WA0260-12 and HBUC: HBS2012060.

**Cell Cycle analysis.** Before 24 h analysis, mice received an intraperitoneal injection of  $1 \text{ mg kg}^{-1}$  of BRDU. Mice were killed and Lin-Sca1 + c-Kit + cells were sorted, fixed with 1.6% paraformaldehyde for 15 min, and permeabilized with ice-cold methanol. To prevent cell loss, LSKs were mixed with B220 + splenocytes and subsequently stained with CD34 and Hoechst for cell cycle, and then analysed by flow cytometry.

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## Author contributions

J.T., T.C.H., E.A., H.X., T.S.B., P.T., R.O., A.C., L.V., S.M.P. and C.P. performed experiments. A.R.P. and C.L. performed computational work and biostatistics. B.H.D. performed histopathology. C.F., M.P., G.R., M.G. and V.M.K. provided clinical MDS samples. C.L. provided critical reagents and discussion. A.V. provided critical project advice. S.D.N. provided support and critical advice; M.G.K. wrote the manuscript, managed the project and supported the work.

## Additional information

**Accession codes:** *NHD13* mouse RNA-seq raw data was deposited to GEO under the accession code GSE76840.

**Supplementary Information** accompanies this paper at <http://www.nature.com/naturecommunications>

**Competing financial interests:** The authors declare no competing financial interests.

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