

1 Immunological age predicts clinical outcomes in older patients with multiple myeloma

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14 Background

15 Immunotherapy has transformed the treatment landscape of multiple myeloma (MM), a
16 hematological cancer predominantly affecting older individuals. We here explored the impact of aging
17 on the immune system of MM patients and assessed whether immunological aging predicts clinical
18 outcomes.

19 Methods

20 We conducted comprehensive immune profiling of T-cells and NK-cells in peripheral blood (PB) and
21 bone marrow (BM) samples from 124 older (median age 77; range 67-92 years) and 145 younger
22 (median age 58; range 34-65 years) newly diagnosed patients enrolled in the HOVON-143 and
23 CASSIOPEIA/HOVON-131 clinical trials. Computational data clustering was performed using the
24 unsupervised clustering algorithm FlowSOM. To assess immunological age at the individual patient
25 level, a LASSO-regularized machine learning model (immunological clock) was trained on high-
26 dimensional phenotypic T-cell data using cross validation. Associations between immunological age
27 and survival outcomes progression-free survival (PFS), progression-free survival on second line
28 therapy (PFS2) and overall survival (OS) were assessed in the HOVON-143 trial using Kaplan-Meier and
29 Cox regression analysis.

30 Results

31 At the group level, older patients displayed a more activated, differentiated and senescent T-cell
32 compartment than younger patients in both PB and BM. More specifically, older patients exhibited a

33 higher CD4⁺:CD8⁺ ratio; increased frequencies of Tregs and activated CD4⁺- or CD8⁺ T-cells; decreased
34 frequencies of naive CD8⁺ T-cells; and increased frequencies of effector memory CD8⁺ T-cells re-
35 expressing CD45RA (TEMRA) and senescent CD8⁺ T-cells in both PB and BM. In addition, older patients
36 had higher frequencies of TIGIT⁺CD8⁺ T-cells in PB, as well as LAG-3⁺CD4⁺ and LAG-3⁺CD8⁺ T-cells in BM.
37 The impact of aging on the NK-cell compartment was minimal. Given the notable inter-individual
38 variation in immune cell frequencies, we calculated the immunological age of individual patients using
39 an immunological clock and discovered widely divergent immunological ages among patients of
40 similar chronological age. Importantly, immunological age, rather than chronological age, showed
41 significant association with PFS (HR 1.02, 95% CI 1.00-1.04, p = 0.048), PFS2 (1.03, 95% CI 1.01-1.06, p
42 = 0.004) and OS (HR 1.04, 95% CI 1.01-1.06, p = 0.006) in older newly diagnosed patients receiving
43 daratumumab-based therapy, even after adjusting for established risk factors such as WHO
44 performance status, ISS stage, and IMWG frailty status.

45 **Conclusion**

46 We have demonstrated the feasibility of measuring immunological age in individual MM patients using
47 high-dimensional T-cell data. Our findings furthermore underscore the potential of assessing
48 immunological age as a composite measure of immune fitness to predict immunotherapy outcomes
49 in MM. We propose further development of this methodology to improve predictions of
50 immunotherapy outcomes in MM and other hematological cancers.