AI-Driven Robotics Laboratory Identifies Pharmacological TNIK Inhibition as a Potent Senomorphic Agent

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Supplementary Figure 1. A typical robotic lab workflow.



Supplementary Figure 2. ABT-263 and mTOR inhibitors exhibited senolytic and senomorphic activities in chemotherapyinduced senescence models. (A) Quantitation of SA- β -gal-positive senescent cells and total cell numbers in ABT-263-treated cells. DMSO group: n=6; Doxo group: n=6; ABT-263 group: n=3; *p < 0.05; **p < 0.01; unpaired two-tailed Student's t-test for the comparison between DMSO and Doxo group and Mann-Whitney test for the comparison between Doxo and ABT-263 group. (B) Quantitation of SA- β -gal-positive senescent cells and the percentage of SA- β -gal-positive cells in Rapamycin-treated cells. n=6 per group; *p < 0.05; **p < 0.01; unpaired two-tailed Student's t-test. (C) Quantitation of SA- β -gal-positive senescent cells and the percentage of SA- β -gal-positive cells in Torin 1-treated cells n=6 per group; *p < 0.05; **p < 0.01; unpaired two-tailed Student's t-test. (D) Total cell numbers for groups presented in (B-C). n=6 per group; unpaired two-tailed Student's t-test. (E) Evaluation of non-senescent IMR-90 cells in Rapamycin or INS018_055-treated groups. DMSO group: n=6; Rapamycin group: n=3; INS018_055 group: n=3; *p < 0.05; Mann-Whitney test.



Supplementary Figure 3. Pharmacological TNIK inhibition or siRNA-mediated TNIK knockdown induced comparable senomorphic effects in chemotherapy-induced senescence models. (A-C) TNIK inhibition with INS018_055 induced a senomorphic effect on doxorubicin-induced senescent MRC-5 cells. Quantitation of SA- β -gal positive cell number, percentage of SA- β -gal positive cells, and total cell number in samples treated with DMSO, RAPA, and INS018_055 at indicated concentrations. DMSO group: n=9; ABT-263 group: n=3; Rapamycin groups: n=6; INS018_055 groups: n=3; *p < 0.05; **p < 0.01; unpaired two-tailed Student's t-test for the comparisons between DMSO and Rapamycin groups and Mann-Whitney test for other comparisons (n<6). (D-F) TNIK inhibition with INS018_055 induced a senomorphic effect in primary human dermal fibroblast (HDF) cells induced by doxorubicin. Quantitation of SA- β -gal positive cell number, percentage of SA- β -gal positive cells, and total cell number in samples treated with DMSO, RAPA, and INS018_055 induced by doxorubicin. Quantitation of SA- β -gal positive cell number, percentage of SA- β -gal positive cells, and total cell number in samples treated with DMSO, RAPA, and INS018_055 at indicated concentrations. Rapamycin and torin-1 served as senomorphic controls, and ABT-263 was a senolytic control. n=3 per group; *p < 0.05; **p < 0.01; Kruskal-Wallis test. (G-J) TNIK knock-down promoted senomorphic effects on doxorubicin-induced senescent IMR-90 cells. (G) IMR-90 cells were transfected with non-targeting siRNA (siNC) or siRNA targeting TNIK for 72 hours. Cells were then collected, and quantitative RT-PCR was performed to evaluate the TNIK knock-down efficiency.

n=3 per group; *p < 0.05; Kruskal-Wallis test. (**H-J**) IMR-90 cells were treated with siNC or siTNIK for 16 hours. Subsequently, the cells were exposed to doxorubicin for 2 hours. Cell medium was then replaced with fresh complete culture medium or medium supplemented with INS018_055 at a final concentration of 1.25 μ M for 72 hours. Quantitation of SA- β -gal positive cells, the percentage of SA- β -gal positive cells, and the total cell count in samples treated with siNC, siTNIK, or INS018_055 at 1.25 μ M. n=6 per group; *p < 0.05; **p < 0.01; unpaired two-tailed Student's t-test.



Supplementary Figure 4. Evaluation of long-term treatment of INS018_055 in the replicative senescence model. (A) Quantitation of the percentage of senescent cells at each cell passage number. P11: n=2, P14: n=5, P15: n=3; P16, 17, 18, 20: n=4, P19: n=5; *p < 0.05; **p < 0.01; Mann-Whitney test. (B) Cell population doubling level (PDL) was analyzed at the indicated passage number.



Supplementary Figure 5. Effects of INS018_055 on 12 hallmarks of aging-related genes. Gene expression changes in hallmarks of aging between the passages for treated (INS018_055) and untreated (DMSO) aged cells. For each sample, the geometric mean of gene expression comprising the investigated pathway was computed. A paired t-test was conducted using the stats.ttest_rel function from the scipy package. (n=3 per group. *p < 0.05, **p < 0.01, ***p < 0.001).

Supplementary Video 1. Introduction of the six-generation robotics lab.

Supplementary Table 1. Cohen's d analysis for comparisons.

| Comparison | Cohen's d value |
|--------------------------------------|-----------------|
| Figure 2 | |
| (C) SA_B_gal positive cell number | |
| DMSO vs RAPA 100nM | 2 //9 |
| DMSO vs INS018_055_1_25µM | 1 800 |
| DMSO vs INS018_055_2.5µM | 2 146 |
| DMSO vs INS018_055_5.0M | 2.140 |
| DMSO vs INS018_055_10uM | 2.449 |
| (D) SA-B-gal nositive% | 2.119 |
| DMSO vs RAPA 100nM | 2.449 |
| DMSO vs INS018_055_0.3125µM | 1.899 |
| DMSO vs INS018_055_0.625µM | 1.899 |
| DMSO vs INS018 055 1.25µM | 2.449 |
| DMSO vs INS018 055 2.5uM | 2.449 |
| DMSO vs INS018 055 5µM | 2.449 |
| DMSO vs INS018_055_10µM | 2.449 |
| (E)Total cell number | |
| DMSO vs INS018 055 0.625µM | 1.899 |
| DMSO vs INS018 055 2.5uM | 2.449 |
| (F) | |
| IL6: DMSO vs INS018 055 | 6.925 |
| IL8: DMSO vs INS018 055 | 3.773 |
| TGFB1: DMSO vs INS018 055 | 2.470 |
| IL1A: DMSO vs INS018 055 | 3.893 |
| IL1B: DMSO vs INS018 055 | 3.146 |
| | |
| Figure 3 | |
| (B) SA-β-gal positive% | |
| Early passage vs Late passage | 14.396 |
| (D) SA-β-gal positive cell number | |
| DMSO vs NDGA_3µM | 2.928 |
| DMSO vs INS018_055_3µM | 2.449 |
| (E)Total cell number | |
| DMSO vs NDGA_3µM | 1.760 |
| (F) SA-β-gal positive% | |
| DMSO vs NDGA_3µM | 2.049 |
| DMSO vs INS018_055_3μM | 2.449 |
| | |
| Figure 4 | |
| (C) SA-β-gal positive cell number | |
| P16: DMSO vs INS018_055_0.3μM | 2.828 |
| P17: DMSO vs INS018 055 1μM | 2.828 |
| P17: DMSO vs INS018 055 3μM | 2.828 |
| P18: DMSO vs INS018_055_1μM | 2.828 |
| P18: DMSO vs INS018_055_3μM | 2.828 |
| (D) IL1B | |
| P12: DMSO vs INS018_055 | 4.124 |
| P15: DMSO vs INS018_055 | 3.879 |
| P16: DMSO vs INS018_055 3.697 | |
| IL6 | |
| P16: DMSO vs INS018_055 | 28.671 |
| P18: DMSO vs INS018_055 | 7.367 |
| 1L8 | |
| P16: DMSO vs INS018_055 | 5.637 |
| P18: DMSO vs INS018_055 | 7.219 |
| TGFB1 | |
| P12: DMSO vs INS018_055 | 8.796 |

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| P15: DMSO vs INS018 055 | 1 246 |
|--|----------------|
| P1(DMGO | 7.500 |
| P16: DMSO vs INS018_055 | 7.590 |
| P1/: DMSO vs INS018 055 | 10.592 |
| P18: DMSO vs INS018 055 | 11.394 |
| | |
| Supplementary Figure 2 | |
| (A) SA-β-gal positive cell number | |
| DMSO vs Doxo | 16.428 |
| Doxo vs ABT-263 1µM | 2.449 |
| Total cell number | |
| DMSO vs Doxo | 10.464 |
| Doxo vs ABT-263 1µM | 2 449 |
| (B) | |
| SA_B-gal positive cell number | |
| DMSO vs Dovo | 13 550 |
| Dava va DADA 12 5mM | 2 894 |
| Doxo vs RAFA_12.5IIVI | 2.004 |
| Doxo vs KAPA_250 M | 2.145 |
| DOXO VS KAPA DUNIVI | 2.2(1 |
| Doxo vs KAPA 100nM | 2.301 |
| SA-p-gal positive% | 27.020 |
| DMSO vs Doxo | 27.929 |
| Doxo vs RAPA_12.5nM | 3.155 |
| Doxo vs RAPA_25nM | 3.343 |
| Doxo vs RAPA_50nM | 2.597 |
| Doxo vs RAPA_100nM | 1.548 |
| (C) | |
| SA-β-gal positive cell number | |
| DMSO vs Doxo | 13.559 |
| Doxo vs Torin 1 25nM | 1.544 |
| Doxo vs Torin 1_50nM | 3 316 |
| Dovo vs Torin 1_100nM | 3 682 |
| SA-B-gal nositive% | 5.002 |
| DMSO vs Devo | 27.020 |
| Dave vs Town 1 50mM | 2 / 925 |
| Doxo vs Torin 1 John | 2 228 |
| | 5.238 |
| (E) I otal cell number | 2 440 |
| DMSO vs RAPA-50nM | 2.449 |
| DMSO vs INS018_055_5µM | 1.899 |
| DMSO vs INS018_055 10µM | 1.899 |
| | |
| Supplementary Figure 3 | |
| (A) SA-β-gal positive cell number | |
| DMSO vs RAPA-100nM | 4.421 |
| DMSO vs RAPA-50nM | 5.234 |
| DMSO vs ABT-263 1µM | 1.791 |
| DMSO vs INS018 055 1.25µM | 2.078 |
| DMSO vs INS018 055 2.5uM | 2.078 |
| DMSO vs INS018 055 5µM | 2.078 |
| DMSO vs INS018 055 10uM | 2 078 |
| (B) SA-B-gal nositive% | 2.07.0 |
| $DMSO = RAPA_100mM$ | 3 715 |
| | 7.715 A 748 |
| DIVISO VS KAFA-JUIIVI DMSO va ADT 262, 1M | 7.740 |
| DIVIDU VS AB1-203_1µVI | 2.078 |
| DM50 vs INS018_055_1.25µM | 2.078 |
| DMSO vs INS018_055_2.5µM | 2.0/8 |
| DMSO vs INS018_055_5µM | 1.791 |
| DMSO vs INS018_055_10µM | 2.078 |
| (C)Total cell number | |
| DMSO vs RAPA-100nM | 3.018 |

| DMSO vs RAPA-50nM | 3.579 |
|-----------------------------------|-------|
| DMSO vs ABT-263 1µM | 2.078 |
| DMSO vs INS018 055 2.5µM | 2.078 |
| DMSO vs INS018 055 5µM | 2.078 |
| DMSO vs INS018 055 10µM | 2.078 |
| (D) SA-β-gal positive cell number | |
| DMSO vs ABT-263 1µM | 1.440 |
| DMSO vs INS018_055_10µM | 1.393 |
| DMSO vs INS018_055_20µM | 1.800 |
| (E) SA-β-gal positive% | |
| DMSO vs INS018_055_5µM | 1.206 |
| DMSO vs INS018_055_10µM | 1.538 |
| DMSO vs INS018_055_20µM | 1.884 |
| (F)Total cell number | |
| DMSO vs ABT-263_1µM | 1.458 |
| (G)TNIK | |
| siNC vs si-TNIK-1 | 3.998 |
| (H) SA-β-gal positive cell number | |
| siNC vs si-TNIK-1 | 1.525 |
| siNC vs si-TNIK-2 | 5.838 |
| siNC vs INS018_055_1.25µM | 7.794 |
| (I) SA-β-gal positive% | |
| siNC vs si-TNIK-1 | 1.322 |
| siNC vs si-TNIK-2 | 3.929 |
| siNC vs INS018_055_1.25µM | 5.382 |
| | |
| Supplementary Figure 4 | |
| (A) SA-β-gal positive% | |
| P14 vs P15 | 2.582 |
| P14 vs P16 | 2.828 |
| P14 vs P17 | 2.828 |
| P14 vs P18 | 2.828 |
| P14 vs P19 | 2.928 |
| P14 vs P20 | 2.828 |

Glossary of terms

| Torms | Fundamention |
|---|---|
| Senomorphics | therapeutic small molecules capable of suppressing senescent cell characteristics by blocking SASP |
| Cellular senescence | a cellular status characterized by stable exit from the cell cycle and loss of proliferative capacity even with growth-promoting stimuli |
| Senescence-associated secretory phenotype (SASP) | the secretory phenotype produced by senescent cells, including metalloproteinases, cytokines, chemokines, and growth factors, as well as non-protein metabolites |
| Senolytics | therapeutic small molecules that can kill senescent cells |
| Senostasis | approaches to reduce the detrimental impact of senescent cells by suppressing senescent traits |
| Artificial intelligence (AI) | a technical and scientific field devoted to the engineered system that generates outputs such as content, forecasts, recommendations, or decisions for a given set of human- defined objectives |
| Fibrosis | the process of replacing functional tissue with excess fibrous connective tissue under damage, leading to a reduction in organ function and ultimately organ failure and death |
| Geroprotectors | anti-aging interventions that can extend lifespan or health span |
| TGF-β signaling | transforming growth factor- β signaling that plays a critical role in the regulation of cell growth, differentiation, and development |

| c-Jun N-terminus kinase (JNK) | a family of protein kinases binding to and phosphorylate c-Jun that play a central role in stress signaling. The targets of JNK pathway include c-Jun, ATF2, ELK1, SMAD4, p53 etc. |
|--|--|
| INS018 055 | first AI-designed drug developed by Inisilico Medicine for IPF; |
| Idiopathic pulmonary fibrosis (IPF) | an aggressive interstitial lung disease with a high mortality rate |
| Extracellular matrix (ECM) | a large network of proteins and other molecules that surround, support, and give structure to cells and tissues in the body |
| Epithelial-to-mesenchymal transition (EMT) | a process by which epithelial cells lose their cell polarity and cell-cell adhesion, and gain migratory and invasive properties to become mesenchymal stem cells |
| Fibroblast-to-myofibroblast transition (FMT) | in the pathogenesis of fibrotic diseases or wound healing, a process that the fibroblasts at the quiescent state could be activated into the myofibroblast |
| Telomere attrition | a process that telomeres undergo shortening during cell division leading to cell senescence |
| Oxidative stress | an imbalance between the production and accumulation of oxygen-reactive species in cells and the ability of a biological system to remove these reactive products |
| High-content imaging | an image-based technology that can identify small molecules, peptides, or other substances that alter cellular phenotypes by extracting multiple cellular features such as morphology, localization, movements, <i>etc.</i> at a single cell level |
| Wnt-signaling | a pathway can regulate stem cell pluripotency and cell fate decisions during development. It can also interact with other singalongs such as TGF- β |
| Senescence-associated-β- galactosidase (SA-β-gal) | a lysosomal hydrolase with optimal activity at pH 6.0 in the senescent cells |
| ABT-263 | also known as Navitoclax, a potent active Bcl-2 family protein inhibitor that binds to multiple anti-apoptotic Bcl-2 family proteins |
| Rapamycin | a potent and specific mTOR inhibitor |
| Torin 1 | a potent inhibitor of mTOR |
| Replicative senescence | a process that normal somatic cells reach the irreversible cell cycle arrest following multiple rounds of replication |