# From discoveries in ageing research to therapeutics for healthy ageing

Judith Campisi<sup>1</sup>, Pankaj Kapahi<sup>1</sup>, Gordon J. Lithgow<sup>1</sup>, Simon Melov<sup>1</sup>, John C. Newman<sup>1</sup> & Eric Verdin<sup>1</sup>\*

For several decades, understanding ageing and the processes that limit lifespan have challenged biologists. Thirty years ago, the biology of ageing gained unprecedented scientific credibility through the identification of gene variants that extend the lifespan of multicellular model organisms. Here we summarize the milestones that mark this scientific triumph, discuss different ageing pathways and processes, and suggest that ageing research is entering a new era that has unique medical, commercial and societal implications. We argue that this era marks an inflection point, not only in ageing research but also for all biological research that affects the human healthspan.

key initial step in the field of ageing research was the observation in 1939 that restriction of caloric intake in mice and rats increased lifespan<sup>1</sup> (Fig. 1). This discovery, reproduced in several species including, most recently, in primates<sup>2,3</sup>,



was the first demonstration of the plasticity of the ageing process and a harbinger of the genetic studies that came 50 years later. Notably, dietary restriction increased not only the maximum lifespan but also suppressed the development of age-associated diseases<sup>4</sup>. These observations led to the concept that lifespan extension was associated with slowed ageing and increased healthspan—which describes both the length of healthy life and the fraction of total lifespan free from disease.

During the mid-1900s, the field began to debate the idea that ageing was the cause of age-related chronic disease. The use of the word 'cause' remains controversial because, although ageing is the largest risk factor for a multitude of age-related diseases<sup>5</sup>, causality has not been proven. In support of the idea, some apparently normal ageing phenomena, which interact with each other in a complex way, contribute to diseases. There was a realization that many of the molecular and biochemical mechanisms that determined the rate of ageing were also under investigation in laboratories that solely focused on individual chronic diseases. Increasingly, researchers who study lifespan genetics and work on disease models collaborate with scientists who have no expertise in ageing research. To distinguish this new field from gerontology, defined as the comprehensive multidisciplinary study of ageing and older adults, this interdisciplinary science at the interface of normal ageing and chronic disease was termed 'geroscience'<sup>6</sup>.

#### A genetic approach to ageing research

Biologists have long known that lifespan is a heritable trait and thus has a genetic basis, as different species have radically different lifespans that range from days to decades. In 1952, Peter Medawar proposed that ageing is the result of the decline in the force of natural selection after reproduction<sup>7</sup>. This led some population-genetics and evolutionary biologists to culture large fly populations (usually *Drosophila* species) with high genetic diversity to selectively breed for late- and early-reproducing flies and test their genetic makeup. These studies showed that the late-reproducing flies lived almost twice as long as early-reproducing flies, and that these differences were heritable, supporting the model that genes determined lifespan<sup>8</sup>.

Over 30 years after Medawar's writing on ageing, a landmark study in the nematode *Caenorhabditis elegans* showed that a single gene, *age-1*, can determine the lifespan of an organism<sup>9</sup>. The lifespan of *age-1*-mutant worms increased by 40–60% on average<sup>9</sup>. This came as a surprise to many, as researchers assumed that hundreds or thousands of genes would be involved and that the

effects of any single gene would be very small and even undetectable. Currently, over 800 genes have been identified that modulate lifespan in *C. elegans* according to GenAge (http://genomics.senescence.info/ genes/search.php?organism=Caenorhabditis+elegans&show=4). The actual number of genes that modulate lifespan is probably higher, as new long-lived mutants continue to be identified and additional genes may also affect lifespan under different environmental conditions.

#### Ageing pathways and processes

The past 30 years of ageing research has transitioned from identifying ageing phenotypes to investigating the genetic pathways that underlie these phenotypes. The genetics of ageing research has revealed a complex network of interacting intracellular signalling pathways and higher-order processes<sup>10</sup>. Many of the pathways and processes, such as dietary restriction, that have been identified are known to be critical in homeostatic responses to environmental change.

Below, we selected a few key pathways and processes that have emerged during the past 30 years.

#### Insulin-like signalling pathway

In 1993, a *C. elegans* mutation in *daf-2*, which is involved in a switch between normal developmental progression and an alternate diapause larval stage (the dauer), was shown to almost double the adult lifespan<sup>11</sup>. This finding was followed by the discovery that two of the daf genes (*daf-2* and *daf-16*) were located in a single pathway that influenced both the formation of the dauer larval stage and adult lifespan<sup>12</sup>. These ageing-associated genes were the *C. elegans* orthologues of mammalian genes that encode components of the insulin and insulin-like growth factor intracellular signalling pathway (ILS). *age-1* turned out to be a phosphatidylinositol-3 kinase, *daf-2* encodes an insulin-like receptor and *daf-16* encodes a FOXO-like transcription factor that acts downstream of the insulin signalling pathway in mammals. This was supported by findings in yeast<sup>13</sup> and flies<sup>14,15</sup> that inhibition of components of the ILS pathway extended lifespan. This suggested that the earlier discoveries in worms were not a 'private' mechanism confined to nematodes but a common mechanism with the potential to be relevant to humans and human diseases.



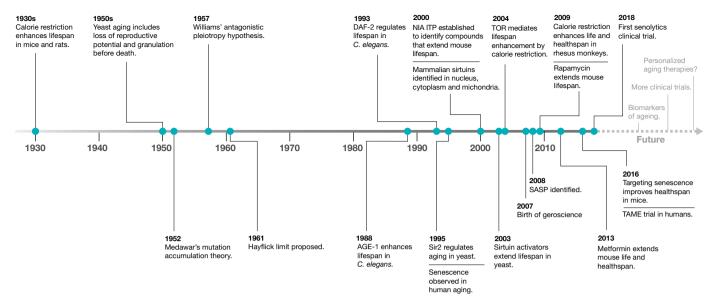


Fig. 1 | Timeline of ageing research. Key discoveries in the ageing field are highlighted, starting with the discovery of the effect of calorie restriction on ageing in 1930.

Further studies in flies, worms and mice have since proven the conserved effects of inhibiting the insulin signalling pathway and extended lifespan<sup>16</sup>. Some alleles of the *daf-16* orthologue in humans, *FOXO3*, are also associated with human centenarian populations across the globe<sup>17</sup>, which supports the idea that what we learn from model organisms may be relevant to ageing in humans.

#### Target of rapamycin

Target of rapamycin (TOR) proteins were first identified from rapamycin research. Rapamycin was originally discovered for its potent antifungal properties and later shown to inhibit the growth of cells and act as an immune modulator<sup>18,19</sup>. Insights into its mechanism of action came from the identification of mutants that suppressed the cell cycle-arrest properties of rapamycin in *Saccharomyces cerevisiae*<sup>18</sup>. These were later identified to be mutations in the genes that encode TOR1 and TOR2. Mammalian TOR genes are known as mTOR (mechanistic (or mammalian) target of rapamycin).

Studies have also elucidated the relationship between TOR and dietary restriction. Evolutionary hypotheses that explain the protective effects of dietary restriction argue that under nutrient restriction, there is a shift in metabolic investment from reproduction and growth towards somatic maintenance to extend survival<sup>10</sup>. The evidence for TOR as a conserved nutrient sensor made it an attractive candidate to mediate the switch between growth and maintenance and lifespan extension by dietary restriction across species. Consistently, flies with reduced activity of various components of the TOR pathway show extended lifespan in a manner that mimics dietary restriction<sup>20</sup>. A large-scale screen for long-lived mutants in yeast identified several mutations in the TOR pathway that also mimicked the effects of dietary restriction<sup>13,21</sup>. Notably, double mutants that carry mutations in genes of both the TOR and insulin signalling pathways have a nearly fivefold increased lifespan in C. elegans<sup>22</sup>. Both key longevity pathways-that is, TOR and ILS-have emerged as key parallel but interacting conserved nutrient-sensing pathways, with TOR being important for autonomous and the ILS pathway for non-autonomous growth signalling.

TOR is a versatile protein that acts as a major hub that integrates signals from growth factors, nutrient availability, energy status and various stressors<sup>10</sup>. These signals regulate several outputs that include mRNA translation, autophagy, transcription and mitochondrial function, which have been shown to mediate extended lifespan<sup>23</sup>.

#### Sirtuins and NAD<sup>+</sup>

In 1995, a genetic screen identified epigenetic 'silencing' factors as longevity genes<sup>24</sup>. Five years later, Sir2 was identified as a conserved pro-

tein that regulates replicative lifespan in yeast<sup>25</sup>. A key discovery was the demonstration that Sir2 was a protein deacetylase that removed acetyl groups from histone proteins in a manner that is dependent on the cellular coenzyme nicotinamide adenine dinucleotide (NAD<sup>+</sup>)<sup>26</sup>. Another key demonstration was the fact that Sir2 was a key protein in the lifespan extension observed under dietary restriction in yeast<sup>27</sup>. Other organisms also express Sir2-related proteins called sirtuins, which generally function as protein deacylases that remove acyl groups, including acetyl, succinyl and malonyl, from lysine residues on target proteins<sup>28</sup>. Mice and humans express seven sirtuins that are characterized by a conserved catalytic domain and variable N- and C-terminal extensions. SIRT1, SIRT2, SIRT3, SIRT6 and SIRT7 are bona fide protein deacetylases, whereas SIRT4 and SIRT5 do not exhibit deacetylase activity but remove other acyl groups from lysine residues in proteins<sup>29</sup>. Notably, SIRT1, SIRT2, SIRT6 and SIRT7 appear to function as epigenetic regulators, whereas SIRT3, SIRT4 and SIRT5 are located in mitochondria<sup>29</sup>. Sirtuins have emerged as global metabolic regulators that control the response to calorie restriction and protecting against age-associated diseases, thus increasing healthspan and—in some cases—lifespan<sup>30-33</sup>.

NAD<sup>+</sup> is a critical redox coenzyme found in all living cells. It serves both as a critical coenzyme for enzymes that fuel reduction-oxidation reactions by carrying electrons from one reaction to another, and as a cosubstrate for other enzymes, such as sirtuins and polyadenosine diphosphate-ribose polymerases (PARPs). There is increasing evidence that NAD<sup>+</sup> levels and the activity of sirtuins decrease with age and during senescence or in animals on a high-fat diet. By contrast, NAD<sup>+</sup> levels increase in response to fasting, glucose deprivation, dietary restriction and exercise, which are all conditions associated with a lower energy load<sup>34–40</sup>. The fact that NAD<sup>+</sup> levels increase under conditions that increase lifespan and healthspan, such as dietary restriction and exercise, and decrease during ageing or under conditions that decrease lifespan and healthspan, such as a high-fat diet, support the working model that decreased NAD<sup>+</sup> levels might contribute to the ageing process. On the basis of this idea, it has been predicted and validated that NAD<sup>+</sup> supplementation exerts protective effects during ageing<sup>41,42</sup>.

#### **Circadian clocks**

Research on sirtuins has also helped us to understand the link between circadian clocks and ageing. NAD<sup>+</sup> levels fluctuate in a circadian manner and link the peripheral clock to the transcriptional regulation of metabolism by epigenetic mechanisms through SIRT1. The core circadian clock machinery, BMAL1 and CLOCK, directly regulates expression of NAMPT in the NAD<sup>+</sup> salvage pathway in mice<sup>38</sup>.

The deacetylase activity of SIRT1 depends on the presence of NAMPT to generate NAD<sup>+</sup>. The possibility that NAD<sup>+</sup> concentrations are regulated semi-independently in different cellular compartments suggests that changes in unique local NAD<sup>+</sup> concentrations could differentially affect the activity of distinct sirtuins.

Similarly, several other homeostatic responses are regulated by circadian clocks that are vital to maintaining health by rhythmic activity of neuronal, physiological and endocrine functions. One of the common hallmarks of ageing is the progressive loss of circadian behavioural patterns (sleep–wake cycles) and a dampening of circadian gene expression<sup>43</sup>. Given that the network of circadian clocks modulates various biological processes, it is not surprising that disruption of circadian rhythms—genetically or through environmental perturbation—is linked with age-related pathologies, including neurodegeneration, obesity and type 2 diabetes<sup>43</sup>.

Dietary restriction is also emerging as an important factor that can influence peripheral clocks, as it promotes circadian homeostasis in flies and mice by enhancing the circadian-regulated amplitude of gene expression<sup>44,45</sup>. More importantly, circadian clocks are required for the protective effects of dietary restriction on lifespan extension in both flies and mice<sup>44,45</sup>. There is an increase in the expression of rhythmic genes in the liver after dietary restriction that include targets of SIRT1, NAD<sup>+</sup> metabolites and protein acetylation<sup>46</sup>. Time-restricted feeding, in which feeding is restricted to shorter periods when an organism is active, has emerged as a potential paradigm to improve circadian and metabolic homeostasis, resulting in increased healthspan<sup>47</sup>. These findings suggest that circadian rhythms are more than just a biomarker of ageing and may be a driving factor in organismal ageing.

#### Mitochondria and oxidative stress

In the 1950s, it was theorized that endogenous production of free radical molecules arising from oxygen and generated during fundamental metabolic processes, such as respiration, represent a key factor that drives ageing<sup>48</sup>. These theories particularly focused on mitochondrial production of superoxide as a key mediator of ageing pathophysiology<sup>49</sup>. Indeed, numerous publications have shown that oxidative damage accumulates in multiple tissues and species with age. Although it is indisputable that such damage is one of the most consistent consequences of increasing age in cells and tissues, whether such damage is a cause or a consequence of ageing has proved to be hard to determine. The free radical theory of ageing has proved extremely difficult to test, at least in part because reactive oxygen species are also important signalling molecules. Numerous studies have shown that the modulation of respiration can extend lifespan in model organisms<sup>50–53</sup>.

In the 1990s and early 2000s, model organisms were used to overexpress key genes involved in detoxifying free radical molecules such as superoxide. There were multiple successes that led to lifespan extension<sup>54,55</sup>, which suggests that oxidative damage arising from metabolism was limiting lifespan-at least to some degree. However, this finding was challenged by subsequent studies in mice that showed no increase in the lifespan of wild-type animals<sup>56</sup> in which the key mitochondrial antioxidant protein superoxide dismutase 2 was overexpressed. However, further studies that specifically targeted the hydrogen peroxide scavenger protein catalase to the mitochondria resulted in improved healthspan and increased lifespan in mice<sup>57-59</sup>. The contradiction between these two findings in mice suggests that simple genetic overexpression in mammalian systems is very context-specific. This is not surprising, as free radical production within the mitochondria is complex, with at least ten sites of production within the respiratory chain<sup>60</sup>, and the rate of production under diverse physiological states, at various ages and in different cell types remains relatively poorly explored and characterized<sup>61</sup>.

Although free radicals are generally implicated in cellular damage and inflammation when present at high levels, they can also potentially increase cellular defenses through an adaptive response (termed 'mitohormesis') when present at lower levels<sup>62</sup>. Mitohormesis explains the paradoxical increase in lifespan observed after disruption of mitochondrial function in worms, flies and mice<sup>63,64</sup>. Genome-wide screens for lifespan extension in C. elegans revealed that disruption of several genes involved in the electron transport chain extended lifespan<sup>52,65</sup>. Inhibition of genes in the mitochondrial electron transport chain triggers the mitochondrial unfolded protein response (UPR<sup>mt</sup>), which is also required for the extended lifespan found in these C. elegans mutants<sup>66</sup>. Disruption of mitochondrial function in neurons activates the UPR<sup>mt</sup> in distal tissues such as the intestine, which suggests the existence of circulating factors that coordinate metabolism between tissues<sup>66</sup>. Mitochondrial perturbation triggered a nuclear transcriptional response that regulates a large set of genes involved in protein folding, antioxidant defenses and metabolism. UPR<sup>mt</sup> is regulated by several factors including activating transcription factor associated with stress-1 (ATFS-1), the homeobox transcription factor DVE-1, the ubiquitin-like protein UBL-5, the mitochondrial protease ClpP and the inner mitochondrial membrane transporter HAF-1<sup>67</sup>.

Studies that demonstrate the importance of mitohormesis in extending lifespan pose several challenges to the field as it is unclear whether using antioxidants would be a good strategy for lifespan extension. As a result, there is evidence both for and against lifespan extension by increasing oxidative stress<sup>63</sup>. It is also unclear how the above findings can be reconciled with results that show that mitochondrial function is enhanced by dietary restriction in multiple species<sup>68–70</sup>. Further studies are needed to determine how differing states of mitochondrial function influence ageing in different contexts.

#### Senescence

Nearly 60 years ago, the first formal description of the limited ability of human cells to divide in culture was published<sup>71,72</sup>. This phenomenon is now known to be an example of a more general phenomenon termed cellular senescence. Senescent cells are characterized by three main features: arrested cell proliferation, resistance to apoptosis and a complex senescence-associated secretory phenotype<sup>73</sup>. The senescence that limits cell proliferation is caused mostly by the short, dysfunctional telomeres that result from repeated DNA replication in the absence of telomerase<sup>74</sup>. Dysfunctional telomeres trigger a persistent DNA-damage response, which in turn induces cell cycle arrest<sup>75</sup> and the expression of pro-inflammatory factors that are associated with the senescence-associated secretory phenotype<sup>76</sup>. Similarly, at least some of the oncogenes that induce senescence do so by causing replication stress and subsequent DNA damage<sup>77,78</sup>. However, other stressors can drive cells into senescence without a DNA-damage response, including epigenomic perturbations<sup>79</sup> and mitochondrial dysfunction<sup>80</sup>.

Senescent cells are more abundant in aged and diseased tissues in multiple species<sup>81</sup>. Cell culture studies showed that senescent cells can fuel hallmarks of a variety of ageing phenotypes and diseases, largely through the cell non-autonomous effects of the senescence-associated secretory phenotype<sup>82</sup>. The development of two transgenic mouse models in which senescent cells can be selectively eliminated confirmed the idea that senescent cells can have a causal role in many age-related phenotypes and pathologies in vivo<sup>83,84</sup>. Both models have been used to show that senescent cells are drivers of a large number of age-related pathologies—at least in mice. These pathologies include Alzheimer's<sup>85</sup> and Parkinson's<sup>86</sup> disease, atherosclerosis<sup>87</sup>, cardiovascular dysfunction<sup>88</sup> (including cardiovascular problems caused by certain genotoxic chemotherapies<sup>89</sup>), tumour progression<sup>88,89</sup>, loss of haematopoietic and skeletal muscle stem cell functions<sup>90</sup>, non-alcoholic fatty liver disease<sup>91</sup>, pulmonary fibrosis<sup>92</sup>, osteoarthritis<sup>93</sup> and osteoporosis<sup>94</sup>.

This leads to the question of whether compounds could be identified that can eliminate senescent cells, similar to the action of the mouse transgenes, and that are therefore potentially translatable to use in humans. This approach led to the identification of a new class of drugs, termed senolytics, that is rapidly expanding<sup>90,95–99</sup>. Many senolytic drugs have been tested in mice and human cells or tissues, with promising results. However, clinical trials have only recently started and it therefore remains to be determined whether these drugs are safe and efficacious in humans.

#### **Chronic inflammation**

Senescence of the immune system (known as immunosenescence) is one of the causes of 'inflammaging', a term coined in 2000<sup>100</sup> that refers to a phenomenon in which older organisms tend to have higher levels of inflammatory markers in their cells and tissues, which results in a low-grade, sterile and chronic pro-inflammatory status. In contrast to acute, transient inflammation—an evolutionarily conserved mechanism designed to protect the host from infections and injuries—inflammaging is linked to a myriad of age-related diseases such as cancer, type 2 diabetes, cardiovascular disease, neurodegenerative diseases and frailty<sup>101–105</sup>.

Other factors that contribute to inflammaging include genetic susceptibility, obesity, oxidative stress, changes in the permeability of the intestinal barrier associated with translocation of bacterial products ('leaky gut'), chronic infection and defective immune cells<sup>104</sup> and pro-inflammatory factors that are associated with the senescenceassociated secretory phenotype of non-immune senescent cells<sup>76</sup>. In addition, numerous environmental factors—such as the chemicals identified by the Tox21 consortium<sup>106</sup>—can be cytotoxic and proinflammatory<sup>101,102</sup>. Finally, longevity-enhancing interventions such as dietary restriction reduce inflammatory biomarkers<sup>107,108</sup>. On the basis of these findings, inflammaging is now considered to be a biomarker for accelerated ageing and one of hallmarks of ageing biology.

As discussed for other variables that influence ageing, an extended lifespan and healthspan may be a result of a fine balance between proinflammatory and anti-inflammatory processes<sup>109</sup>. Consistent with this idea, it has been shown that although centenarians have an increased level of pro-inflammatory molecules (for example, interleukin-6, a commonly used marker for chronic morbidity<sup>105</sup>), the adverse consequences associated with these pro-inflammatory molecules are counterbalanced by high levels of anti-inflammatory molecules<sup>110</sup>.

#### Proteostasis

Protein homeostasis (known as proteostasis) is an essential process that maintains protein structure and function, a process that degrades during ageing. Proteome stability is associated with naturally long lifespan in organisms such as the naked mole-rat, which is characterized by high levels of homeostatic proteolytic activity<sup>111–113</sup>. During normal ageing, many hundreds of proteins become insoluble and accumulate in a wide variety of tissues. In *C. elegans*, these insoluble proteins are highly enriched for proteins that determine lifespan<sup>114,115</sup>. It appears that a proteome-wide failure in proteostasis accelerates ageing.

The major pathways that determine lifespan also regulate aspects of proteostatic factors. For example, insulin signalling pathways control the expression of molecular chaperones and TOR signalling pathways regulate many forms of autophagy including mitoautophagy, which is the mechanism by which damaged mitochondria are removed from the cell. Age-related failure in proteostasis may be mechanistically responsible for the processing and folding of neurotoxic peptides associated with Alzheimer's disease, Parkinson's disease and other proteotoxic diseases<sup>116</sup>. Indeed, this may be why age is such a high-risk factor for neurological diseases that are marked by protein aggregation.

#### An inflection point in ageing interventions

The rapid increase in our understanding of the molecular mechanisms that underlie ageing has created new opportunities to intervene in the ageing process. Two notable findings have emerged from these early studies. First, the number of genes that can extend lifespan is much larger than expected, which suggests a much higher level of plasticity in the ageing process than expected. Second, genes that control ageing which define cellular pathways such as the TOR and insulin signalling pathways—are remarkably conserved in yeast, worms, fruit flies and humans. The conservation of these pathways across wide evolutionary distances and the fact that targeting these pathways in model organisms increases both lifespan and healthspan has brought to the fore the idea of interventions in humans.

Rapidly ageing societies across the world are seeing an increasing healthcare burden attributable to both morbidity and cost of age-related diseases, such as heart disease, stroke, cancer, neurodegeneration, osteoarthritis and macular degeneration. However, current medical care is highly segmented as well as organ- and disease-based, and ignores the fact that age and the ageing process are the strongest risk factor for each of these diseases. According to the concept of geroscience, targeting conserved ageing pathways is anticipated to protect against multiple diseases and represents a different approach to tackling the rapidly growing burden of diseases worldwide (Table 1).

#### Using geroscience to treat age-related disease

The concept of geroscience predicts that conserved ageing pathways are part of the pathophysiology of many age-related conditions and diseases (Fig. 2). For example, multimorbidity is seen as the multisystem expression of an advanced stage of ageing rather than a coincidence of unrelated diseases<sup>117</sup>. Targeting conserved ageing pathways should, therefore, prevent or ameliorate multiple clinical problems. This hypothesis remains to be tested in clinical trials, but is supported by several lines of evidence. A wide range of animal models of specific diseases can be affected by manipulating a single ageing mechanism (such as NAD<sup>+</sup>)<sup>118</sup> or senescent cells<sup>95</sup> in the laboratory. Rates of individual age-related diseases and of multimorbidity increase nonlinearly with age, and the rate of acquiring new chronic diseases may be higher in people who have an existing chronic disease<sup>119</sup>.

Certain populations, such as people who live with HIV or are homeless, show an early onset of a wide range of age-related chronic diseases and geriatric syndromes that are not necessarily related to their specific disease risks<sup>120,121</sup>. A classic statistical analysis of human mortality showed that even curing an entire category of chronic disease, such as all types of cancer or cardiovascular diseases, would only modestly increase life expectancy owing to the expected mortality from other chronic diseases<sup>122</sup>. Conversely, humans with extreme longevity who presumably have favourable ageing mechanisms show delayed onset of most major chronic diseases<sup>123</sup>.

In clinical care, multimorbidity is increasingly viewed as an entity unto itself that requires a specific integrative management plan<sup>124</sup>, as intensive but uncoordinated treatment of individual diseases can give rise to the harmful syndrome of polypharmacy<sup>125</sup>. Frailty measures are the most widely used clinical assessments for quantifying the stage of ageing<sup>126,127</sup>, and these clinical biomarkers of ageing predict mortality while awaiting liver transplant<sup>128</sup>, complications of surgery<sup>129</sup> and whether the pathology of Alzheimer's disease manifests as clinical dementia<sup>130</sup>. Taken together, experimental data from preclinical models, epidemiological patterns of age-related conditions and the power of non-disease-specific clinical ageing assessments such as frailty to predict risk and mortality in diverse contexts all suggest that intervening in mechanisms of ageing could have broad clinical benefit.

#### Challenges ahead

However, to move from simple organisms to humans several key difficulties need to be overcome, as discussed below. First, it is already clear from the study of model systems that interventions that are beneficial in a given genetic environment might not work in another. For example, analyses of dietary restriction in multiple recombinant inbred mice strains found both an increase and a decrease in lifespan, which was dependent on the strain<sup>131</sup>. Similar results have been obtained using more than 150 strains of flies<sup>132</sup>. The molecular basis for these differences in response to what had been assumed to be a universally beneficial intervention has not been established. Future studies in invertebrates such as yeast, worms and flies hold promise for systematically explaining the genetic basis of lifespan extension by dietary restriction.

The human population is also characterized by a large genetic heterogeneity that has a critical role in disease susceptibility, lifespan and the response to drugs of an individual. This heterogeneity is the basis for the current field of precision medicine, which aims to identify critical genetic determinants of disease and to customize interventions and treatments to unique genetic variants. In the future, the field of

Intervention	Target or process	Major effects
Rapamycin	mTOR	Geroprotective effects in mice and dogs. Human clinical trials with rapamycin and rapalogs are underway.
Senolytics	Cellular senescence	Protective against age-related disease in mice. Ongoing clinical trials in human diseases, including arthritis and eye degeneration.
NAD precursors	NAD metabolism	Geroprotective in animal models. Supplements available for human consumption, but no clinical trials have been reported yet.
Sirtuin-activating compounds	Sirtuins	Geroprotective in rodents and non-human primates but mixed results in humans; SRT2104 may have effects beyond mitigating some age-associated conditions.
Metformin	Mitochondrial respiration	Associated with increased lifespan in human patients with diabetes and decreased risk of cancer. TAME trial is planned to test effects in individuals without diabetes.
Exercise	Unknown	Associated with reduced risk of age-related disease, improved quality of life and increased lifespan in humans.
Calorie restriction	Several targets, including mTOR and sirtuins	Enhanced lifespan and protection from disease in worms, flies, mice, rats and non-human primates. Associated with decreased risk factors for disease in humans.

Several key interventions that are currently under investigation in human trials for their potential to increase healthspan and lifespan are described (see text for further details).

precision medicine and geroscience will have to interact closely. As discussed above, *FOXO3* is related to the DAF–insulin pathway, and unique polymorphisms in FOXO3 are found in centenarians around the world<sup>17</sup>. Furthermore, the *APOE* gene is involved in cholesterol metabolism, and unique alleles are associated with longevity and a lower risk of developing Alzheimer's disease<sup>133,134</sup>. Many additional genes<sup>135</sup>, such as *SIRT6*<sup>136</sup>, are now known to be associated with human longevity.

Just as several animal studies have challenged the universality of the benefits of dietary restriction<sup>137–139</sup>, it is likely that pharmacological interventions will work with different success in distinct humans, owing to the natural genetic variation in the population<sup>138</sup>. As in mice, it has been hypothesized that selective pressures on the response to nutrient availability may vary across different human populations, resulting in genetic differences that may influence diabetes and obesity<sup>140</sup>. Furthermore, most of the interventions have arisen from research to show protection against ageing in animals. Thus, it is possible that humans that have optimized their nutrition and exercise are unlikely to derive much benefit from these interventions. Future studies on tailoring interventions based on personalized medicine approaches are likely to be most successful in deriving the most benefit from these interventions.

Additionally, it is clear that studies in mice are not always predictive for humans. Many important discoveries in mice have been translated successfully in humans, but many others have not. This can be due to intrinsic biological differences between mice and humans. In addition, the complexity of biology and the multiplicity of recognized and unrecognized variables that affect biological phenotypes have caused reproducibility problems between different laboratories that study the same organisms, not only in studies of mice but also other model systems<sup>141</sup>.

Although there are many examples of a connection between long lifespan and increased healthspan, more-recent studies in mice<sup>142,143</sup>, flies<sup>132</sup> and worms<sup>144–146</sup> have questioned the assumption that lifespan extension is always accompanied by an increase in healthspan. Future studies will need to address the effects of interventions on both of these aspects before attempting to translate these interventions into the treatment of human patients.

#### Drugs undergoing clinical trials

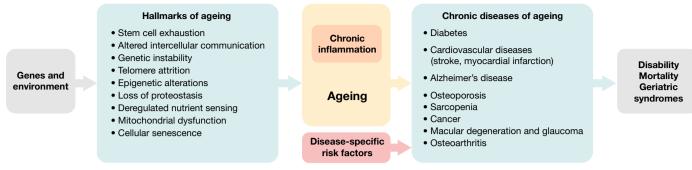
Both drugs that are being developed to target ageing and some drugs that are commonly used behave as geroprotectors in animal models. The multicentre Intervention Testing Program (ITP), which is supported by the National Institute for Ageing, has identified five drugs that reproducibly increase lifespan in genetically heterogenous mice<sup>147</sup>, including rapamycin, acarbose, nordihydroguaiaretic acid,  $17-\alpha$ -oestradiol and aspirin<sup>147</sup>. Some of these drugs also improve healthspan measures in some tissues of animal models<sup>148–150</sup>. Drugs found in other studies to extend rodent lifespan include metformin<sup>151</sup> (although it did not repeat in the ITP at the same dose), drugs targeting the angiotensin-converting enzyme and the aldosterone receptor, and the sirtuin activators SRT2104<sup>152</sup> and SRT1720<sup>153</sup>. Further work will be necessary to validate that these drugs act as true geroprotectors in model organisms.

A key question is how these interventions will be tested and eventually used clinically in humans. Geroscience predicts that ageing therapies will ameliorate or prevent several age-related diseases and conditions simultaneously. Clinical trials to test this hypothesis should therefore use clinical outcomes that inherently depend on multiple age-related diseases or conditions. Examples include multimorbidity, or the combination of several age-related chronic diseases; the multifactorial geriatric syndromes such as frailty or delirium; or resilience to health stressors such as surgery or infection<sup>154</sup>. Multimorbidity and frailty are also widely incorporated into measures of age-related risk that inform clinical decision-making<sup>155</sup>. Other examples of such measures that could be useful trial outcomes include grip strength, gait speed<sup>156</sup>, timed-up-and-go and activities of daily living.

These clinical measures of ageing could be useful for selecting patients at higher age-related risk to receive interventions. For example, the risk of multimorbidity increases steeply with age<sup>119</sup>; however, developing one chronic disease increases the risk of developing another by several fold<sup>157</sup>. How early or late in the ageing process interventions can be effective remains to be seen, although animal studies of drugs and human studies of exercise provide some reassurance that the window of opportunity extends quite late in life. At least five major classes of drugs are currently being tested in humans for their geroprotective potential.

Metformin. Metformin is a widely prescribed antidiabetic drug that has been found to target several molecular mechanisms of ageing<sup>158</sup>. A retrospective analysis of patients with diabetes who received metformin showed increased lifespan in comparison to individuals without diabetes<sup>159</sup>. In randomized trials, metformin prevented the onset of diabetes, improved cardiovascular risk factors and reduced mortality<sup>160,161</sup>. Epidemiological studies have suggested that metformin use might also reduce the incidence of cancer and neurodegenerative disease<sup>158</sup>. These data underpin the proposed Targeting Aging with MEtformin (TAME) study, a large randomized controlled trial of metformin given to 65- to 80-year-old individuals without diabetes who are at high risk for the development of chronic diseases of ageing. The primary outcome of TAME is a composite of death or new major age-related chronic diseases, including cardiovascular disease, cancer and dementia. Other outcomes include geriatric measures such as mobility, independence in activities of daily living and cognitive function<sup>162</sup>.

*Rapamycin analogues.* The compound identified by the ITP that has perhaps the most reproducible effects on lifespan is rapamycin. Rapamycin inhibits the TOR pathway, extends the lifespan of yeast



**Fig. 2** | **The concept of geroscience and its approach to age-related disease.** Environmental and genetic factors exert influences on a number of key cellular processes and pathways, which have recently been defined as the hallmarks of ageing<sup>193</sup>. Many of these pathways contribute to the creation of a chronic inflammatory stage and to ageing. These in turn

increase the risk for chronic diseases of ageing together with diseasespecific risk factors (for example, cholesterol level and high-blood pressure can lead to cardiovascular diseases such as stroke and myocardial infarction).

and flies and increases mean and maximum lifespan in mice from multiple genetic backgrounds<sup>163–165</sup>. These basic research data led to a unique clinical trial that studied the effects of rapamycin on heart function, cognition, cancer and lifespan in household companion dogs as a preclinical model<sup>166</sup>. Rapamycin (also known as sirolimus) and its analogue everolimus are approved for clinical use as immunosuppressants in solid organ transplantation. Healthy older adults given a non-immunosuppressive dose of everolimus for six weeks showed an improved immunological response to influenza vaccination<sup>19</sup>. A subsequent clinical trial found that six weeks of low-dose everolimus plus a second TOR inhibitor improved vaccine response and, provocatively, reduced infection rates by over a third during the subsequent nine months<sup>167</sup>. These were two of the first examples of clinical trials that target a syndrome of ageing—immunosenescence—with a drug that targets the mechanisms of ageing.

*Senolytics*. As discussed above, senolytic drugs—drugs that selectively target and eliminate senescent cells—have showed great geroprotective potential in animal models<sup>95</sup>. Some of these drugs are natural products<sup>96,97</sup>, whereas others are synthetic small molecules<sup>90,98,99</sup>. A growing number of biotechnology companies and research laboratories are developing new or repurposed senolytics that have just begun to be tested for safety in humans, with no results—thus far—regarding efficacy.

*Sirtuin activators*. Sirtuin-activating compounds (STACs) enhance sirtuin activity and increase healthspan in mice and non-human primates<sup>168</sup>. However, mixed conclusions have been observed in clinical trials. Resveratrol (a natural STAC) and SRT1720 (an early synthetic STAC) have shown promising results in preclinical trials but failed in clinical trials, owing to low bioavailability, potency and limited target specificity<sup>169</sup>. The most promising synthetic STAC so far is SRT2104, a highly specific SIRT1 activator; the compound has completed several small clinical studies of effects on cardiovascular and metabolic markers, including in type 2 diabetes, cigarette smokers and the elderly, with larger trials underway<sup>118</sup>.

*NAD<sup>+</sup> precursors*. NAD<sup>+</sup> precursors such as nicotinamide riboside and nicotinamide mononucleotide aim to supplement the age-associated decrease in cellular NAD levels<sup>69</sup>. In animal models, both precursors have shown geroprotective activity against a number of ageing-associated diseases. Several companies are currently selling nicotinamide riboside and nicotinamide mononucleotide as supplements online. Although these supplements increase NAD levels in humans<sup>170</sup>, no efficacy or geroprotective effects for humans have been demonstrated thus far.

#### Exercise improves healthspan

Although much hope and investment are currently focused on drug development, it is important to note that exercise behaves as a true and

effective geroprotector. In the absence of suitable treatments for agerelated dysfunction, exercise is currently the only intervention that has shown a remarkable efficacy for reducing the incidence of age-related disease<sup>171,172</sup>, improving the quality of life<sup>173</sup> and even increasing mean and maximum lifespan in humans<sup>174,175</sup>. Its benefits can be seen even with modest implementation<sup>173</sup>. Although the key molecular players that mediate the protective effects of exercise against age-related disease are unknown, efforts are underway to identify the molecular players and whether we can harness such knowledge to improve the health of the ageing population.

#### Nutrition and ageing

Diet is probably one of the most important influences on health and ageing. However, it is an enormously complicated topic and beyond the scope of this Review (extensive discussion on this topic has previously been published<sup>176</sup>). The field of ageing has focused almost exclusively on the lifespan and healthspan effects of dietary restriction but, at the other end of the spectrum, overeating and the accompanying obesity shortens lifespan and decreases healthspan. In between these two extremes, there is strong evidence that optimal eating is associated with increased life expectancy and a reduction in the risk of all types of chronic disease. Many claims have been made for the competitive merits of different diets relative to one another. However, it is very difficult to conduct rigorous, long-term studies that compare different diets for their lifespan and healthspan effects using methodology that is devoid of bias and confounding variables. Without such direct comparisons, no specific diet can claim superiority over any others. However, a number of themes have emerged from studies that compare different diets and from the study of populations that are geographically associated with increased longevity (so-called 'blue zones'). Diets that favour longevity and healthspan are generally characterized by minimally processed foods, being predominantly plant-based, low alcohol consumption and a lack of overeating.

Exciting recent developments are emerging in the nutrition field, such as intermittent fasting<sup>177</sup>, diets that mimic fasting<sup>178</sup> and time-restricted feeding<sup>179</sup>. Recently, interest has grown in a ketogenic diet that is characterized by the endogenous production of high levels of the ketone body  $\beta$ -hydroxybutyrate. This diet has long been used as a treatment for childhood epilepsy and was recently shown to increase healthspan in two separate studies in mice<sup>180–182</sup>. The studies are supported by recent findings that  $\beta$ -hydroxybutyrate modulates the enzymatic activity of the epigenetic regulators, histone deacetylases, and thereby activates the expression of FOXO3<sup>183</sup>. Future research will focus on the healthspan and possible lifespan of these dietary interventions and the identification of their interactions with pathways that regulate ageing.

#### The need for biomarkers of ageing

The field of geroscience needs biomarkers to assess the ageing process and the efficacy of interventions to bypass the need for large-scale longitudinal studies. Medicine has undergone a progressive transformation during the past 40 years, changing from 'sick care'—that is, care primarily focused on treating diseases after they occurred—to 'healthcare', in which unique risk factors for disease development are recognized and suppressed before disease onset. For example, neither high plasma cholesterol nor high blood pressure is a disease by itself but both are important risk factors for the development of myocardial infarction and strokes.

Similarly, ageing is not a disease but a notably strong risk factor for multiple diseases that include myocardial infarction, stroke, some ageing-associated cancers, macular degeneration, osteoarthritis, neurodegeneration and many other diseases. For example, cardiovascular risk doubles every 10 years past the age of 40, even after adjustment for other risk factors-the rough equivalent of adding a major new risk factor (smoking, hypertension and so on) every decade<sup>184</sup>. Decades of cardiovascular studies identified risk factors and showed that treating risk factors even when patients are asymptomatic prevented harm. Treatment guided by these cardiovascular biomarkers now extends earlier and earlier in life. The availability of true biomarkers of ageing, and associated clinical health outcomes and malleability to interventions<sup>162</sup>, would allow geroprotectors to be tested on an accelerated time scale. They would further allow for early identification of patients at high age-related risk throughout life and in various clinical contexts to target geroprotective treatments.

Early efforts to identify such markers have been unsuccessful, but recent developments using newer technologies such as high-throughput proteomics, transcriptomics and epigenomics indicate that such biomarkers do exist and could be of high clinical importance<sup>185</sup>. One possible biomarker, the epigenetic clock, is based on the measurement of DNA methylation at multiple sites and appears to correlate with biological age and age-related risk more than chronological age<sup>186-188</sup>. Advanced glycation end products represent another potential biomarker that accumulates with age and in several age-related diseases<sup>189</sup>. Furthermore, increased levels of some advanced glycation end products are also associated with increased mortality in humans<sup>190</sup>. There already is evidence that ageing biomarkers can be modified by interventions that target ageing, such as in the CALERIE study of calorie restriction in humans<sup>191</sup>. The identification of further biomarkers that predict biological age and disease risk will represent a huge stride forward in the efforts to combat age-related disease and dysfunction in humans.

We are now entering an exciting era for research on ageing. This era holds unprecedented promise for increasing human healthspan: preventing, delaying or—in some cases—reversing many of the pathologies of ageing based on new scientific discoveries. Whether this era promises to increase the maximum life span of humans remains an open question<sup>192</sup>. What is clear is that, 30 years after the fundamental discoveries that link unique genes to ageing, a solid foundation has been built and clinical trials that directly target the ageing process are being initiated. Although considerable difficulties can be expected as we translate this research to humans, the potential rewards in terms of healthy ageing far outweigh the risks.

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# This paper argues that there is at present no evidence that the maximum life span of humans (and by inference other complex, as opposed to simple, organisms) is malleable.

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**Competing interests** J.C. is a scientific founder of Unity Biotechnology, a company that develops senolytics. G.J.L. and S.M. are scientific founders of Gerostate Alpha, a drug-development company focused on creating novel pharmaceuticals that mitigate age-related disease and dysfunction. J.C.N. and E.V. are scientific founders of BHB Therapeutics, a company focused on the therapeutic effects of the ketone body  $\beta$ -hydroxybutyrate. E.V. is a scientific founder of Napa Therapeutics, a company that studies NAD metabolism during ageing.

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