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The Science of Frailty: Sex differences

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Section 1. Definitions, incidences and risk factors of frailty

The aging process in an older adult is driven by multi-dimensional inputs that contribute to the individual's overall progressive decline and ultimately death. These inputs span from biological, environmental, and gene-environment interactions factors, as well as changes in an individual's social and behavioral characteristics (Figure 1). Importantly, this age-associated decline impacts multiple physiologic systems leading to a state of decreased reserve and compromised resistance to stressors, which in turn contributes to increased vulnerability and adverse outcomes. Frailty is a clinical syndrome that captures this state of vulnerability and decline frequently seen in older adults.

While frailty has many operational definitions, the majority of these definitions are embedded within two conceptual frameworks. The first framework conceptualizes frailty as a syndrome with a distinct physical phenotype with measurable clinical features. This "physical frailty" is best exemplified by the Fried Phenotype, which characterizes frailty by unintentional weight loss (5 percent of body weight in the past year), self-reported exhaustion, weakness (as measured by decreased grip strength), slow walking speed, and low physical activity¹.

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The authors have nothing to disclose.

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Specifically, those who meet 3 of these criteria are considered frail, while those meeting 1-2 criteria are pre-frail, and those without any of these characteristics are robust (Figure 1b). The second framework conceptualizes frailty as a state of vulnerability due to deficit accumulation that can be ascertained through cumulative comorbidities, disease states, functional and cognitive deficits, and psychosocial factors.^{2, 3} These deficits can be tallied to determine a Frailty Index (FI), with a higher number of deficits yielding a higher FI score.

Despite the lack of a gold-standard definition, frailty as operationally defined above, has been demonstrated to increase risks for adverse clinical outcomes including falls, surgical complications, institutionalization, disability, and death⁴. For instance, in a prospective observational study in older adults aged 85 and older, baseline frailty is found to be associated with a more than two-fold risk of mortality after 7 years, compared to those who are non-frail⁵. Moreover, frailty leads to increased healthcare utilization and associated total healthcare costs by 54-101%⁶. Thus, frailty in late life is a serious medical condition that needs to be managed carefully.

This association between older age and frailty is particularly important given that our society is rapidly aging. According to the 2019 United Nations World Population Ageing Highlights, there is an estimated 703 million persons aged 65 years and older, which is projected to double by 2050^7 . It is anticipated that this large increase in the geriatric population will correspond to a proportional increase in older adults who are frail. To this end, the epidemiology, prevalence and incidence of frailty have been determined in many population-based studies worldwide. The mean prevalence of frailty among the community-dwelling population aged 65 years and older is ~10%, but can range widely from 4.0-59.1%, depending on the frailty criteria used⁸. A recent meta-analysis of 120,805 adults 60 years or older across 28 countries, reported that the estimated global incidence of frailty as determined by the Fried Phenotype in community-dwelling older adults is 40 cases per 1,000 person-years over a median follow-up of 3 years (95% Confidence Interval [CI], 34.5-48.5; I = 98.2%). Factors that are associated with an increased prevalence of frailty include African-American or Hispanic ethnicity, lower income and education level, poorer health, and higher rates of comorbid chronic diseases and disability¹.

Given that frailty in older adults is common and leads to a multitude of adverse outcomes, a deeper understanding of the science of frailty is a critical first step to help design effective interventions that prevent or attenuate frailty-induced sequelae. Part of such in-depth understanding of frailty also involves recognizing that sex differences in frailty do exist. In community-dwelling older adults more than 65 years of age, frailty was found to be more common in women and in greater severity (as determined by FI, which is a known predictor of all-cause mortality³) compared to men for any age group¹⁰. Despite the greater likelihood of being frail however, risk of mortality was lower in women. Therefore, because such sex discrepancies in frailty exist, it is important to understand the causes of these differences so that sex-specific frailty interventions can be further developed as part of providing the best possible patient-centered care for frail older adults. Here, we will review the proposed pathophysiology of frailty in general, as well as hypothesized contributing factors of sex-specific differences in frailty. Similar reviews have been published previously^{10–12}.

Section 2. Pathophysiology of frailty

The pathophysiology of frailty is an active area of research. While the precise pathogenesis of frailty remains unknown, available evidence suggests that physical frailty is in part driven by dysregulation of neuroendocrine, inflammatory, and metabolic pathways (Figure 1a, 1b). For example, age-related hormonal changes that are associated with frailty include decreased levels of growth hormone (GH), insulin-like growth factor 1 (IGF-1), and dihydroepiandosterone sulfate (DHEA-S)¹³, as well as increased cortisol levels¹⁴. Additionally, due to the anabolic and immunity-modulating effects of these hormones, alterations in these hormones likely have direct or indirect impacts on skeletal muscles, therefore causing dysregulated glucose metabolism and insulin-signaling, and sarcopenia (i.e., age-related loss of muscle mass and strength)^{15, 16}. Furthermore, chronic low-grade inflammation is highly associated with frailty. This inflammatory state is measurable by elevated pro-inflammatory cytokines such as interleukin-6 (IL-6), c-reactive protein (CRP),¹⁷ elevated numbers of neutrophils and macrophages¹⁸, and activation of markers of clotting cascades such as D-dimer, in frail older adults¹⁹. The inputs that are hypothesized to drive this multisystemic physiologic dysregulation and progression to frailty development include age-related biological changes (e.g., proteostasis, mitochondrial function), genetics, and environmental exposures (Figure 1a)²⁰.

With such inputs, frail older adults enter an altered homeostatic state which results in a reduced capacity to generate an appropriate stress response to both acute or chronic stressors such as illness, hospitalization or surgery. This inability to regain homeostasis, termed homeostenosis, causes an individual to further spiral into a "cycle of frailty²¹" where each of the five frailty characteristics (i.e., decreased mobility and activity, weight loss, weakness, fatigue) can initiate a vicious cycle that perpetuates worsening of dysregulated energetics, sarcopenia, and an aggregate frailty syndrome²². Ultimately, frailty in older adults increases the risk for other common geriatric syndromes or outcomes such as falls, delirium, cognitive impairment^{23, 24}, long-term care placement, and mortality (Figure 1c)^{25, 26}.

Section 3. Sex differences in frailty phenotype and the sex-frailty paradox

3a. Sex differences in frailty prevalence, adverse outcomes and mortality

Community-dwelling women aged 65 years or older have a higher prevalence and greater burden of frailty compared to men of the same age (Table 1). In a study of 3,079 community-dwelling older adults from the 2007-2010 National Health and Nutrition Examination Survey (NHANES) database, frailty has been found to be more prevalent in women (8.8% in women vs 5.4% in men)²⁷. Moreover, a similar sex-specific trend has been observed in pre-frail older adults as determined in a recent meta-analysis of 240 studies spanning across 62 countries world-wide²⁸. Moreover, while there is great variability in frailty assessment depending on the tool being used²⁹, females were found to have higher frailty scores than men regardless³⁰. Additionally, frail women are at increased risk of developing deficits in activities of daily living (ADLs) and/or instrumental ADLs (IADLs) and institutionalization³¹. Frail older adults are also at risk of associated adverse outcomes including hospitalizations, emergency room visits³², readmissions, disability, and overall

reduced survival³³ and increased mortality rates³⁴ but thus far, sex-specific differences have only been noted in frailty prevalence, survival and mortality rates (Table 1)^{28, 30, 35}.

Interestingly, regardless of age or level of frailty, older frail women have better survival compared to men. In a meta-analysis of two large cohort studies (SHARE³⁶ and MHAS³⁷) that used the FI to determine frailty, men have higher rates of mortality compared to women until age 90¹⁰. In another study of older adults, the mortality rate in frail men (22.5%) is much higher compared to women (8.5%). In this study, sex-specific differences in the causes of death are also found. In men, the predominant causes for death are heart disease (41%) and chronic lower respiratory disease (23%), compare to nephritis/nephrosis in women $(32.3\%)^{27}$.

3b. The "sex-frailty paradox"

The sex-associated divergence in frailty prevalence and mortality has been referred to as the sex-frailty paradox¹¹. This is consistent with the long-recognized observation that women have longer lifespan than men despite having higher chronic disease burden and disability¹¹. The sex-frailty paradox is best illustrated by a meta-analysis of seven large studies of community-dwelling older adults showing that mortality rate is lower in women irrespective of their age or frailty severity¹⁰. While the reasons for this phenomenon are yet to be elucidated, some have hypothesized that this may be due to men having more "life-threatening" chronic conditions (e.g., stroke, ischemic heart disease), whereas women may experience more "non-life-threatening" chronic conditions that are associated with higher morbidity (e.g., fractures, depression, constipation, headaches)^{11, 25}.

3c. Sex differences in frailty-associated contributing factors

Frailty and its progression is driven by multi-domain inputs (Figure 1) which may have differential impact depending on the sex of the individual. Based on growing evidence focusing on these sex-specific differences in frailty and its contributing factors, it has been hypothesized that sex-specific differences in frailty is likely due to a combined effect of biological, psychosocial and behavioral differences between women and men¹². Here, we have conceptually categorized contributing factors for sex-differences in frailty in older adults into biological, social and behavioral domains (Figure 2). While some of these contributing factors are common between both sexes, others have a more sex-specific contribution.

Biological factors that may contribute to sex-differences in frailty include chronic disease, changes in immunity, as well as endocrinologic changes which occur in part, due to aging. As noted by Gordon and Hubbard¹¹, while certain chronic medical conditions such as cardiac disease, congestive heart failure, diabetes mellitus, osteoarthritis, and glaucoma are similarly prevalent in older adults regardless of sex, differences do exist in other chronic conditions. For example, in men, a higher prevalence of hearing impairment, peripheral vascular disease, and gastrointestinal disease are reported, while in women, dementia, hip fracture, depression, headache, urinary incontinence and thyroid disease are more prevalent.

Sex-specific differences in immune response and inflammatory signaling may partially stem from differences in sex chromosomes. Women have 2 copies of X chromosome

which carries genes that encode Toll-Like Receptor and multiple cytokine receptors and genes involved in T- and B-cell activity. In comparison, men carry 1 copy each of X chromosome and Y chromosome, which encodes some inflammatory pathway genes that are expressed exclusively in men^{38, 39}. Consequently, progression to immunosenescence, which contributes to age-related decline in immune function, is known to occur at a faster rate in men than in women^{40, 41}. Epigenomic and genomic changes regulate innate and humoral immunity in a sex-specific manner³⁸. In fact, these genomic differences between sexes increase after age 65, with men having higher innate and pro-inflammatory activity, while having lower adaptive immunity, compared to women⁴².

Differences in levels and regulation of hormones also differentially contribute to frailty in a sex-specific manner. For example, estrogen reduces hepatic sensitivity to growth hormone (GH). In contrast, testosterone enhances the effect of GH which increases the risk of some age-related diseases such as prostate cancer and cardiac hypertrophy⁴³. Additionally, several autoimmune disorders including multiple sclerosis, rheumatoid arthritis, Sjogren's syndrome, and systemic lupus erythematosus are known to be more prevalent in women. This increase in susceptibility in women may be due to the reduced protective effect of some autoimmune regulatory genes that are downregulated by estrogen^{44, 45}. COVID-19 is another example of how the regulatory role of sex hormones may affect disease pathogenesis. In COVID-19, the SARS-CoV-2 binds to the ACE-2 receptor, which serves as viral entry point⁴⁶. Because testosterone upregulates, whereas estrogen inhibits ACE-2 receptor expression, sex hormone differences may partially explain the increased risk of disease severity and mortality in men⁴⁷.

Skeletal muscle changes with age, both in its overall architecture (i.e., skeletal muscle remodeling including increased intramyocellular lipid accumulation and fibrosis), as well as in its macronutrient (e.g., fat, protein, glucose) metabolism⁴⁸. As a result, the absolute and relative loss of contractile skeletal muscle tissue is a shared feature in both aging men and women⁴⁸,⁴⁹. However, the decline in resting energy expenditure in both skeletal muscle and overall adipose tissue occurs at a faster rate in women compared to men. This may partially explain why women are more prone to frailty than men⁵⁰.

Apart from biological contributory factors, differences in the social and behavioral domains may contribute to sex-specific differences in frailty (Figure 2). Within the social domain, social vulnerability is a significant contributory factor. Marital status is one important determinant of social vulnerability, and studies have found that widowhood is more frequently associated with frailty⁵², as well as being socially frail, and thereby at increased risk of mortality (HR = 2.69; 95% CI, 1.01-7.25, p < 0.05)⁵¹. However, women may be able to better cope with social vulnerability due to greater support networks, while men may be subject to increased mortality⁵³ due to a relative lack of coping mechanisms. Despite better coping mechanisms in women, widowhood is indeed a known risk factor for the development of persistent depressive symptoms⁵⁴, and this in turn may increase the risk of frailty⁵⁵. It is currently unclear whether depression can increase the risk of frailty in a sex-specific manner.

In the behavioral domain, several contributory factors may contribute to sex-specific differences in frailty. For instance, coping mechanisms may differ between men and women, perhaps by activating different brain areas, thereby using different problem-solving strategies. Specifically, when exposed to an acute stressor, men are found to engage the prefrontal cortex regions, while women have more responses in the limbic/striatal regions, and these stress responses are associated with distinct neural networks⁵⁶. Furthermore, it has been proposed that the psychological phenomenon of stress, such as life stressors from surgery or illness, emotional, physical or sexual abuse, divorce, or death of a loved one, may be related to microstructural changes in the corpus callosum of the brain⁵⁷. Accordingly, these sex-specific differences in stress perception may potentially explain differences in women's behavior around health issues, including illness perception, self-rated health, and healthcare utilization. Women are also more sensitive to small physical changes and more likely to assume the sick role⁵⁸. While women have poorer self-rated health⁵⁹, they are more likely to report either minor or major health issues⁶⁰. We should be cautiously reminded that the perception of self-rated health is influenced by other social determinants of health as well, including occupation, marital status, household income, area of residence (rural/urban), and work environment⁶¹. When it comes to risky behavior such as cigarette smoking or alcohol consumption, women also tend to be risk-averse compared to men⁶².

Other independent frailty-associated factors that are unique to, or shared between, men and women have been described^{27, 63} (Figure 2). Zhang and colleagues²⁷ showed that independent frailty-associated factors common to both men and women include sedentary lifestyle (physical inactivity) and prior history of hospitalizations. In contrast, higher family income to poverty ratio is protective against frailty in both sexes. In men, frailty is associated with additional risk factors including being widowed, divorced or separated, sleeping more than 9 hours a day, and smoking. In women, additional risk factors for frailty include obesity (BMI 30 kg/m²), elevated inflammatory markers such as CRP, sleeping less than 6 hours a day, and family history of diabetes or myocardial infarction.

Section 4. Intervention for frailty incorporating the 5Ms of geriatrics

The overall approach to caring for an older adult with frailty should aim at diagnosing frailty using validated screening tools, followed by implementing individually-tailored intervention plans⁶⁴. The diagnosis of frailty can be made with tools such as the Fried Phenotype (i.e., Hopkins Frailty tool) or the FI as determined by a comprehensive geriatric assessment (CGA). Rapid screening tools such as the FRAIL scale or the Study of Osteoporotic Fractures (SOF) frailty tool that allows quicker screening may also be used^{65, 66}. While there is currently insufficient evidence to differentiate treatment interventions for frailty in a sex-specific manner, the 5Ms (multi-complexity, mind, mobility, medications, matters) of geriatric care can be incorporated to augment frailty intervention⁶⁷.

Intervention modalities including exercise, nutrition management, and interdisciplinary geriatric models of care have been found to improve clinical features of frailty or reduce adverse outcomes. For example, Travers and colleagues have noted in their systematic review of 925 studies, that a combination of muscle strength training and protein supplementation are the most effective and easiest interventions to implement, and to

delay or reverse frailty⁶⁸. Multi-component intervention is also imperative for preventing frailty-associated adverse outcomes. Marcucci and colleagues have proposed guidelines, as a part of the FOCUS (Frailty Management Optimisation through EIP-AHA Commitments and Utilisation of Stakeholders Input) project, that interventions including exercise, nutritional management and their combination, should be implemented to prevent or delay the progression of frailty⁶⁴. Lastly, geriatric-focused interdisciplinary care programs such as GEM (Geriatric Evaluation and Management), ACE (Acute Care for the Elders Unit), PACE (Program for All-inclusive Care for the Elderly), and hospice care (Figure 3) and their impact on the health of vulnerable older adults have been extensively studied in both outpatient and inpatient settings. As an example, a meta-analysis of 7 studies including 1,009, comprehensive geriatric assessment unit interventions is found to be effective in managing physical and psychological frailty, readmission, mortality and patient satisfaction in hospitalized older adults⁶⁹. Thus, geriatric interdisciplinary models of care should be integrated whenever feasible and take an active role in the clinical care of frail older adults.

Multi-complexity:

The complex health care needs of frail older adults necessitate utilizing multi-modal interventions that encompass management of chronic comorbidities, behavioral and psychosocial needs, and lifestyle modification that may be of benefit to reduce or prevent frailty. In a recent prospective cohort study of 6,357 adults followed longitudinally for 20 years, healthy habits exercised at age 50 are associated with a lower risk of frailty later in life. These habits include not smoking (HR 0.68; 95% CI, 0.52-0.89, p=0.01), moderate alcohol consumption (HR 0.76; 95% CI, 0.59-0.98, p<0.001), physical activity of at least 2.5 hours per week (HR 0.66; 95% CI, 0.48-0.88, p=0.0001), and consuming fruits and vegetables more than twice daily (HR 0.70; 95% CI, 0.53-0.92, p=0.01)⁷⁰. Frailty risk is reduced by 70% if all 4 healthy habits are present. Additionally, in this same study, the cumulative effect of multiple healthy habits and behavioral modification implemented at or before age 50 are shown to help prevent frailty later in life with a 31% reduction in frailty incidence for each additional healthy behavior. These findings indicate that early intervention with modification of risk factors can indeed prevent frailty.

Mind:

As introduced briefly in the previous sections, frailty is impacted by multi-faceted inputs which include psychosocial variables such as cognition and mood (e.g., psychological wellness). First, frailty is associated with cognitive impairment²⁴ and dementia⁷¹, and indeed, cognitive training has been associated with improved frailty score and reduced frailty prevalence⁷². Second, older adults with depression are at risk of frailty⁷³, and specifically in women, depressive symptoms increase the likelihood for frailty⁷⁴. In men, more traumatic life events and perceived level of post-traumatic psychological stress are associated with increased likelihood of frailty. Thus, providers need to remain cognizant of these sex-specific differences in psychosocial correlates of frailty for both assessment and intervention, in order to better address the "mind" component of the 5Ms-oriented geriatric care.

Mobility:

Many single- and multi-component physical activity programs improve gait speed, muscle strength, mobility and physical performance in frail older adults⁷⁵ although modalities in which exercise interventions are implemented in frailty studies vary significantly⁷⁶. In one study, a home-based video exercise program for frail older women >75 years of age has shown to improve overall quality of life as measured by EuroQoL-5D⁷⁷, including measures of mobility, self-care, usual activities, pain or discomfort, and anxiety or depression, as well as self-rated health⁷⁸. Thus, providers should consider the exercise training options that may be available to a frail older adult, and prescribe an exercise intervention that best meet the individual's need and ability.

Medications:

The impact of polypharmacy, and its associated adverse outcomes, on frail older adults, need to be considered when devising a care plan. In a systematic review of 25 studies, polypharmacy is associated with frailty. Significant associations are found with every medication added to the treatment (OR 1.13–1.20), with polypharmacy (OR 1.77–2.55), and hyperpolypharmacy (10 drugs, OR 4.47–5.8)⁷⁹. Frail older adults subjected to polypharmacy also have a 13-fold longer hospital stay and a five-fold greater risk for hospital readmission⁸⁰. Furthermore, providers should be cognizant of how sex-specific differences in drug metabolism⁸¹ can affect pharmacokinetics. Thus, extra efforts should be made to address polypharmacy in frail older adults.

Matters most:

The routine assessment of a frail older adult's priorities and goals of care including treatment preferences and quality of life, as well as psychosocial resources⁷⁴, have become exceedingly important as we aim to provide improved 5Ms-focused patient-centered care. This approach allows providers to recommend the most appropriate intervention strategy along the spectrum of frailty^{82, 83}. Specifically, it enables timely integration of the management of distressing symptoms, as well as ensuring appropriate caregiver support. Moreover, multi-component interventions such as exercise training tailored towards the need and ability of the patient, as well as geriatric interdisciplinary models of care corresponding to the level of patient's need, should be integrated into patient care in order to optimize outcomes^{64, 69}. Finally, older adults who are severely frail should be provided with necessary access to palliative and hospice care and related resources⁸⁴.

Section 5. Conclusions and future directions

Frailty is a clinical syndrome that leads to a progressive, multisystem decline in function and physiologic reserve, and increased vulnerability to adverse outcomes. Various biological, psychosocial and behavioral inputs contribute to the development of frailty. Moreover, some of these inputs may contribute to sex-specific differences in frailty and associated adverse outcomes. Future research efforts should focus on development of screening tools and therapeutic interventions that best incorporate sex-specific differences in frailty in order to reduce mortality and optimize outcomes in frail older adults.

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KEY POINTS

- Frailty is an important clinical syndrome of age-related decline in physiologic reserve and increased vulnerability, and is associated with numerous adverse clinical outcomes
- Frailty is driven by dysregulation of neuroendocrine, inflammatory, and metabolic pathways
- Frailty is more prevalent in older women
- Sex-specific differences in frailty is an emerging area of investigation
- The 5Ms (multi-complexity, mind, mobility, medications, matters most) of geriatric medicine can be integrated in the clinical management of frail older adults to improve care

SYNOPSIS

Frailty is an important clinical syndrome of age-related decline in physiologic reserve and increased vulnerability. In older adults, frailty leads to a progressive multisystem decline and increased adverse clinical outcomes. The pathophysiology of frailty is hypothesized to be driven by dysregulation of neuroendocrine, inflammatory, and metabolic pathways. Moreover, sex-specific differences in the prevalence of frailty have been observed and various biological, psychosocial and behavioral factors may contribute to these differences. Treatment interventions, focusing on the 5Ms (multi-complexity, mind, mobility, medications, matters most) of geriatric care, can be applied to the care of frail older women with these sex-specific differences in mind. As additional evidence regarding sex-specific differences in frailty emerges, future research efforts should encompass the development of screening tools and therapeutic interventions that optimize outcomes in older adults who are frail.

THE AGING OLDER ADULT



Figure 1. Model pathway for frailty and contributing factors.

a) input, **b**) modifiers, and **c**) outcomes. Also shown in panel b is the progression of frailty (yellow shaded area) from robust to pre-frail to frail, as physiologic reserve (blue shading) declines.



Figure 2. Contributory domains and factors for frailty and sex-specific associations.

Depicted within each circle of the venn diagram are the contributing factor domains (biological, social and behavioral) that are color-coded as blue, orange and yellow shading. For each domain, contributing factors common to both genders (or are of equal prevalence) are listed inside the circle, and those that have gender-specific associations are depicted outside the circle in boxes that are outlined in pink (female-specific), or blue (male-specific). Note: for <u>Behavioral</u>: only female-specific associations are shown in the boxes (*males have the opposite characteristics which are not shown)

Frail and depressed (29.5% frail vs 17.8% prevalence in non-frail p<0.001, Mantovani et al 2015), Frail females 22.7% vs. Frail males 15.4% (p<0.001)

Depression -> Frailty Risk OR 4.73 (2.62-8.55, p<0.01) Chang et al 2010



Figure 3. Interventions for older adults along the frailty spectrum.

Shaded areas depict possible interventions for the frail older adults [purple: early/midstage frailty, green: end-stage frailty]. <u>GEM</u>: Geriatric Evaluation and Management. <u>CGA</u>: Comprehensive Geriatric Evaluation. <u>PACE</u>: Program for All Inclusive Care of the Elderly. <u>ACE</u>: Acute Care for the Elders unit. Author Manuscript

Table 1.

Sex-specific associations in pre-frailty, frailty and frailty-associated adverse outcomes.

Please note that other adverse outcomes including readmission rate, ED visits, hospital admissions are not shown as those outcomes have not yet been shown to have sex-specific associations.

		Finding	Reference
	Pre-frailty Prevalence	Women > Men Women: 15% (95% CI, 14-17%; $n = 143$, $P = 99\%$; $P < 0.005$) Men: 11% (95% CI, 10-12%; $n = 145$, $P = 97\%$; $P < 0.005$)	Meta-analysis (O'Caoimh et al. 2020)
		Women: 39.0% (95% CI, 38.1-39.9%) Men: 37.3% (95% CI, 36.6-38.0%; v2 = 8,629, df = 1, P = 0.003)	Systematic Review (Collard et al. 2012)
	Frailty Prevalence	Women > Men Women: 9.6% (95% CI, 9.2-10%) Men: 5.2% (95% CI, 4.9-5.5%; P < 0.001)	Systematic Review (Collard et al. 2012)
		Women: 49% (95% CI, 14-17%; $P < 0.005$) Men: 45% (95% CI, 44-47%; $n = 119$, $P = 97\%$; $P < 0.005$)	Meta-analysis (O'Caoimh et al. 2020)
Frailty- associated adverse	Survival	 HR 0.43 (95% CI, 0.299-0.561), P < 0.0001 Survival rate of women > men independent of frailty status 	 Observational, 10 yr longitudinal study (Corbi et al. 2019) Secondary analysis of the Survey of Health, Ageing, and Retirement in Europe (SHARE) (*Theou et al. 2014)
outcourtes	Mortality	Mortality rate lower in women vs. men (up to age 90, after which mortality rate increases to above 30% in women).	Meta-analysis (Gordon et al. 2017)