REVIEW ARTICLE





Predictive Ability of Comorbidity Indices for Surgical Morbidity and Mortality: a Systematic Review and Meta-analysis

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Abstract

Background Several contemporary risk stratification tools are now being used since the development of the Charlson Comorbidity Index (CCI) in 1987. The purpose of this systematic review and meta-analysis was to compare the utility of commonly used co-morbidity indices in predicting surgical outcomes.

Methods A comprehensive review was performed to identify studies reporting an association between a pre-operative comorbidity measurement and an outcome (30-day/in-hospital morbidity/mortality, 90-day morbidity/mortality, and severe complications). Meta-analysis was performed on the pooled data.

Results A total of 111 included studies were included with a total cohort size 25,011,834 patients. The studies reporting the 5-item Modified Frailty Index (mFI-5) demonstrated a statistical association with an increase in the odds of in-hospital/30-day mortality (OR:1.97,95%CI: 1.55–2.49, p < 0.01). The pooled CCI results demonstrated an increase in the odds for in-hospital/30-day mortality (OR:1.44,95%CI: 1.27–1.64, p < 0.01). Pooled results for co-morbidity indices utilizing a scale-based continuous predictor were significantly associated with an increase in the odds of in-hospital/30-day morbidity (OR:1.32, 95% CI: 1.20–1.46, p < 0.01). On pooled analysis, the categorical results showed a higher odd for in-hospital/30-day morbidity (OR:1.74,95% CI: 1.50–2.02, p < 0.01). The mFI-5 was significantly associated with severe complications (Clavien-Dindo ≥ III) (OR:3.31,95% CI:1.13–9.67, p < 0.04). Pooled results for CCI showed a positive trend toward severe complications but were not significant.

Conclusion The contemporary frailty-based index, mFI-5, outperformed the CCI in predicting short-term mortality and severe complications post-surgically. Risk stratification instruments that include a measure of frailty may be more predictive of surgical outcomes compared to traditional indices like the CCI.

Keywords Comorbidity indices \cdot Surgical complication \cdot Morbidity \cdot Mortality \cdot Risk \cdot CCI (Charlson-Comorbidity Index) \cdot ECI (Elixhauser comorbidity index) \cdot Age \cdot CPS (comorbidity-polypharmacy score)

Introduction

The current population is aging rapidly which contributes to the growing number of elderly patients presenting to undergo surgical procedures. It is estimated that approximately 53% of all surgeries are performed on patients greater than the age of 65. ¹ The growing number of elderly surgical patients cannot necessarily be treated in the same way as the younger patient population. Patients below the age of 65 tend to be healthier, while older patients tend to have chronic medical problems. Yet chronological age does not necessarily predict outcome; instead, physiological age should be considered. Older patients often have one or more comorbidities, ultimately changing how physicians should view and treat them.²

Developing a generalizable yet accurate method to risk stratify patients that takes into account their physiological age for treatment has been an ongoing task for many years, beginning with the Charlson Comorbidity Index (CCI). CCI was developed in 1987 as a way to risk stratify patients based on their comorbidities to predict mortality. ³ The work developed the index with patients admitted to a hospital's medical service, then validated the index in a population of women with breast cancer. ³ The index is weighted, meaning it accounts

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for not only the number of diseases but their severity as well. For example, having a mild liver disease gives a score of 1, whereas having a moderate or severe liver disease gives a score of 3. The score for each comorbidity is summed and can give a total score up to 37. CCI has been used in numerous situations including inpatient services, ^{4,5} elective surgery, ^{6,7} and surgical oncology. ^{8–10} Despite its continued use, some physicians believe that it is outdated, especially for specific populations for which the original index was not intended. ^{11,12} There are several reasons that the a newer risk stratification tool should be utilized over the CCI. First, patients now survive longer than they did in 1987 when the original weights for the CCI were developed due to advancements in treatment options.¹³ Second, we have found that the CCI score for surgical oncology patients is often homogenous and does not allow for sensitive risk stratification with regard to the commonality of comorbid conditions in those diagnosed with the same type of cancer. Current research highlights that the CCI is not accurate for specific surgical patient populations and thus researchers have developed their own scoring systems to better risk stratify particular subsets of patients. 7,14

Many variations of the CCI have been developed including the Age-Adjusted CCI (ACCI) which takes into account chronological age, the Charlson-Deyo score (CCI-D) which is a 1992 CCI revision that allowed for use with ICD-9 codes, and the Elixhauser Co-morbidity Index (ECI). The ECI is a more recent model compared to the CCU that includes 31 unique co-morbidities.¹⁵ Contemporary indices have been developed focusing on the variable measure of frailty versus categorical co-morbidities alone. Frailty is a measure is a state of limited physiological reserve that can have tremendous impact on surgical outcomes.¹⁶ One such index is the 5-item modified Frailty Index (mFI-5) which has slowly been gaining popularity since its development in 2017.¹⁷ One of the promising features of the mFI-5 over traditional options such as CCI is the inclusion of a measure of the patient's specific functional dependent status (FDS).¹⁷ Frailty and FDS has been shown in recent studies to be a strong predictor of surgical outcomes including complications, mortality, and adverse peri-operative events. ^{16,18,19} Indices that capture a patients FDS may prove to be more effective compared to co-morbidity-based indices alone.²⁰ The aim of this systematic review and meta-analysis was to identify the optimal comorbidity index that can be reliably measured from the electronic medical record for short term outcome prediction following surgical intervention.

Methods

Search Strategy and Exclusion Criteria

A literature search was performed in a comprehensive manner according to the Preferred Reporting Items for Systematic Reviews and Meta-analyses guidelines (PRISMA guidelines).²¹ An electronic search of PubMed, Embase, and EBSCO databases was performed using the combinations of "comorbidity index," "comparison," "surgery," "mortality," "morbidity," "prediction," and "outcome" in the keyword and title fields. The search was limited to contemporary studies published between 2014 and 2022 unless hand-selected through citation searching, in order to include recent more clinically relevant studies. Examiners reviewed all abstracts for potential inclusion. Inclusion criteria included studies that focused upon measuring the predictive capability of comorbidity indices prior to surgical intervention. Articles were excluded according to the following criteria: comorbidity indices that are not able to be measured/extracted from medical record data, non-English language, outcomes assessed other than in surgery, and review or meta-analysis articles. The full text of each article was then reviewed for data related to the key clinical outcomes outlined below; studies not including adequate data regarding surgical outcomes after surgery or trauma were excluded from the final cohort of studies for the meta-analysis. The surgical outcome data for the remaining articles was extracted. The systematic review included retrospective studies if they measured a comorbidity index or indices able to be calculated retrospectively from hospital database data and assessed outcomes after surgery or trauma. Additionally, studies were included in the meta-analysis if they assessed at least one of the key outcomes. Non-English studies, reviews, and meta-analyses were excluded. The majority of frailty instruments were excluded from this study. Indices that rely on frailty depend heavily on factors not consistently available in the medical record. ^{22,23} The five-item modified frailty index (mFI-5) is a less complex option that has shown to be just as effective in outcome prediction when compared to the more comprehensive 11 item mFI-11 and is closer in nature to a co-morbidity index rather than a multi-dimensional frailty index.²⁴

Quality Assessment of Studies

One researcher independently reviewed each study for strength of data utilizing the following data points: author(s), year, number of patients in cohort, indication for surgery, type of procedure, and surgical outcomes following the procedure (Table 1). The studies were assigned a score using a modified scoring system for minors.²⁵ Up to two points were assigned for each of the following standards: a clearly stated aim (+2), inclusion of consecutive patients with no exclusion or information detailing the reason for exclusion (+2), prospective data collection that details a clear collection plan (+2), endpoints relevant to this study assessed (+2), an unbiased assessment of the study endpoint through proper controls (+2), proper follow-up after study period (+2 for median and range of

Table 1	Studies	assessing age	-adjusted	Charlson	Co-morbidity	Index	(ACCI)
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Author	Publication year	Total cohort	Indices assessed	Procedure	Disease type	Disease site	Specialty	Outcome(s) of interest	Grade (%)
Wong et al	2022	233	ACCI	Repair	Fracture	Femur	Orthopedics	Yes	73.4
Shinkawa et al	2020	763	ACCI	Resection	Cancer	Liver	Surgical Oncology	Yes	75
Kahl et al	2017	793	ACCI	Resection	Cancer	Gynecologi- cal	OBGYN	Yes	75
Lin et al	2019	1476	ACCI	Resection	Cancer	Gastric	Surgical Oncology	Yes	60
Takada et al	2022	236	ACCI	Resection	Cancer	Duodenum	Surgical Oncology	No	72
Maezawa et al	2019	2254	ACCI	Resection	Cancer	Gastric	Surgical Oncology	Yes	81.3
Tian et al	2017	315,464	ACCI	Resection	Cancer	GI	Surgical Oncology	Yes	75
JW Park et al	2018	228	ACCI	Resection	Cancer	Prostate	Urology	No	85
Donato et al	2019	78	ACCI,	Resection	Cancer	Vulva	OBGYN	No	80.1
Asano et al	2017	379	ACCI	Resection	Cancer	Pancreas	Surgical Oncology	No	73.4
Kang et al	2020	698	ACCI, CCI	Resection	Cancer	Kidney	Surgical Oncology	No	76
Yang et al	2018	4508	ACCI, CCI, ECI	Resection	Cancer	Lung	Surgical Oncology	No	72
Koseki et al	2021	2885	ACCI, mACCI (excludes malignan- cies other than the one being treated via gastrec- tomy)	Resection	Cancer	Gastric	Surgical Oncology	Yes	75
Lin et al	2019	2257	ACCI	Resection	Cancer	Gastric	Surgical Oncology	No	81.3
Aziz et al	2014	242	CCI, ACCI	Resection	Cancer	Kidney	Surgical Oncology	No	75
Marya et al	2016	556	CCI, ACCI	Arthroplasty	Degenerative	Knee	Ortho	Yes	68.8
Lakomkin et al	2019	2179	ACCI	Resection	Cancer	Spine	Neurosur- gery	Yes	82

Age-adjusted Charlson Co-morbidity Index (ACCI), Charlson Co-morbidity Index (CCI), Elixhauser Co-morbidity Index (ECI), Modified CCI (mCCI), Modified ACCI (mACCI – excludes extra malignancies)

 $Outcomes \ of \ Interest - 90-day \ morbidity/mortality, \ 30-day \ morbidity/mortality, \ in-hospital \ morbidity/mortality, \ severe \ complications \ (Clavien-Dindo \geq III)$

Grade – Papers were assessed for quality utilizing the modified scoring system for minors. Points were assigned for the following: clearly stated aim (+2), inclusion of consecutive patients (+2), prospective data collection that details a clear collection plan (+2), endpoints relevant to this study assessed (+2), an unbiased assessment of the study endpoint through proper controls (+2), proper follow-up after study period (+2), loss to follow-up less than 5% (+2), and prospective calculation of study size (+2)

follow-up, +1 for inexplicit information regarding follow-up), loss to follow-up less than 5% (+2 if all patients with missing medical record data were excluded), and prospective calculation of study size (+2 if they include data regarding the power of the study).

Outcomes of Interest

The primary outcome of this study was mortality within 3 months (in-hospital, 30-day, or 90-day mortality). Secondary outcomes were the rates of any complication



Fig. 1 PRISMA diagram of literature search

(in-hospital, 30-day, or 90-day morbidity) and severe complications typically defined according to Clavien-Dindo (CD) guidelines or predefined by the author. ²⁶ The outcome of overall survival (OS) was not reviewed as this measure has confounding variables that may not accurately capture morbidity and mortality due to the physical insult of surgery. For interpretation, mortality was divided into two groups (in-hospital/30-day and 90-day) as was morbidity (in-hospital/30-day and 90-day). Damhuis et al. has shown that the rate of morbidity and mortality vastly differs between the 30-day and 90-day time intervals and thus should be considered as separate groups. ²⁷ For severe complications, outcomes defined as $CD \ge III$ or IV were grouped together and CD complications < III considered minor.

Table 2	Studies assessing	Co-morbidity	Polypharmacy	Score (CPS))
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Author	Publication year	Total cohort	Indices assessed	Procedure	Disease type	Disease site	Specialty	Outcome(s) of interest	Grade (%)
Khanh et al	2020	466	CPS	Various	Vascular	Various	Cardiovas- cular	No	81.3
Mubang et al	2015	5863	CPS	Trauma	Trauma	Various	Emergency Medicine	Yes	75
Justiniano et al	2013	711	CPS	Trauma	Trauma	Various	Emergency Medicine	Yes	70
Justiniano et al	2015	920	CPS	Trauma	Trauma	Various	Emergency Medicine	Yes	75
Housley et al	2015	879	CPS	Trauma	Trauma	Various	Emergency Medicine	No	68.8
Holmes et al	2014	667	CPS, CCI	Trauma	Trauma	Various	Emergency Medicine	No	72
Nossaman et al	2018	446	CPS, CCI	Trauma	Trauma	Various	Emergency Medicine	Yes	75

Co-morbidity Polypharmacy Score (CPS), Charlson Co-morbidity Index (CCI)

 $Outcomes \ of \ Interest - 90-day \ morbidity/mortality, \ 30-day \ morbidity/mortality, \ in-hospital \ morbidity/mortality, \ severe \ complications \ (Clavien-Dindo \geq III)$

Grade – Papers were assessed for quality utilizing the modified scoring system for minors. Points were assigned for the following: clearly stated aim (+2), inclusion of consecutive patients (+2), prospective data collection that details a clear collection plan (+2), endpoints relevant to this study assessed (+2), an unbiased assessment of the study endpoint through proper controls (+2), proper follow-up after study period (+2), loss to follow-up less than 5% (+2), and prospective calculation of study size (+2)

Data Extraction

The following data was extracted from all eligible studies: number of patients that underwent procedure, comorbidity indices measured, index cutoff, disease type, disease site, type of surgery, and surgical specialty. Data for each comorbidity indexes' ability in predicting the following primary surgical outcomes were extracted when applicable: post-operative 30-day morbidity and/or mortality, 90-day morbidity and/or mortality, in-hospital morbidity and/or mortality, major complications (Clavien-Dindo grade III and above or Clavien-Dindo grade II and above) and overall complications.

Statistical Analysis

Meta-analysis was performed for the results of included studies when applicable. For the chosen outcomes of interest, odds ratios and 95% confidence intervals were extracted if available. Only the standard indices with sufficient combined results from all the studies were included in the metaanalysis (ECI, CCI, ACCI, CCI-D, mFI-5). Additionally, whether the index was assessed on a continuous predictor, or a cut-off was recorded. The co-morbidity indices utilizing continuous predictors were pooled in a group labeled scale. The co-morbidity indices using a cut-off value were pooled together in group labeled categorical. The statistical programming language R was then used to generate forest plots for the extracted odds ratios.

Results

Study Selection

The initial search revealed 748 records with an additional three records attained through citation searching (PRISMA Fig. 1). From the combined 751 articles, 581 articles were excluded after being screened via title and abstract yielding 170 articles after duplicates were also removed. The group of 170 studies were then sought for retrieval and the full text reviewed for each, 7 reports were unable to be retrieved leaving 163 studies for the assessment. After reviewing the full text for 163 articles, 111 studies were included in this review (Tables 1, 2, 3, 4, 5, 6).

Study Characteristics

All 111 included studies were published between 2014 and 2022. The total cohort size of all studies assessed was 25,011,834 (cohort sizes ranged from 55 to 14,007,813). The operation of highest frequency was oncologic resection

 Table 3
 Studies assessing 5-item Modified Frailty Index (mFI-5)

Author	Publication year	Total cohort	Indices assessed	Procedure	Disease type	Disease site	Specialty	Outcome(s) of interest	Grade (%)
Gordon et al	2022	609	mFI-5	Arthroplasty	Various	Elbow	Orthopedics	Yes	70
Mah et al	2022	259	mFI-5	Resection	Cancer	Various	OBGYN	Yes	75
Panayi et al	2022	40,634	mFI-5	Reconstruc- tion	Cancer	Breast	Plastic Surgery	Yes	45
Taylor et al	2022	92,691	mFI-5	Resection	Cancer	Thyroid	General Surgery	Yes	72.5
Liu et al	2022	14,160	mFI-5	Reconstruc- tion	Various	Breast	Plastic Surgery	Yes	70
Magno-Par- don et al	2022	10,550	mFI-5	Reconstruc- tion	Various	Breast	Plastic Surgery	Yes	85
Ravivarapu et al	2022	4358	mFI-5	Resection	Cancer	Adrenal	Urology	Yes	73.3
Lee et al	2022	4290	mFI-5	Repair	Fracture	Maxillofa- cial	Maxillofacial surgery	Yes	81.3
Panayi et al	2021	3795	mFI-5	Reconstruc- tion	Various	Head and neck	Plastic Surgery	Yes	65
Pierce et al	2021	234,738	mFI-5	Various	Various	Spine	Neurosurgery	Yes	81.3
Goldwag et al	2021	18,904	mFI-5	Resection	Various	Kidney	Urology	Yes	68.8
Chambers et al	2021	141	mFI-5	Resection	Cancer	Gynecologi- cal	OBGYN	Yes	70
Elsamadicy et al	2021a	5296	mFI-5	Fusion/ decom- pression	Degenera- tive	Spine	Neurosurgery	Yes	72
Goshtasbi et al	2022	2786	mFI-5	Various	Various	Head and neck	ENT	Yes	63.8
Luo et al	2021	1254	mFI-5	Repair	Degenera- tive	Various	Plastic surgery	Yes	75
Dammeyer et al	2021	13,783	mFI-5	Resection	Cancer	Breast	Surgical Oncol- ogy	Yes	81.3
Hermiz et al	2021	22,700	mFI-5	Reconstruc- tion	Various	Breast	Plastic surgery	Yes	72
Subrama- niam et al	2021	191,939	mFI-5	Various	Various	Various	General Surgery	Yes	72
Braet et al	2020	11,530	mFI-5	Bypass	Ischemia	Lower extermity	Cardiovascular	Yes	68.8
Zreik et al	2021	23,754	mFI-5	Fusion/ decom- pression	Degenera- tive	Spine	Neuro	Yes	68.8
Andersen et al	2020	2040	mFI-5	Amputation	Various	Lower extermity	Cardiovascular	Yes	75
Lee et al	2020	575	mFI-5	Reconstruc- tion	Structural	Pannulum	Plastic surgery	Yes	72.5
Tracy et al	2020	3364	mFI-5	Trauma	Trauma	Various	Emergency medicine	Yes	73.4
Keller et al	2020	412	mFI-5	Various	Elective	Colon	General Surgery	Yes	72
Traven et al	2019b	18,957	mFI-5	Arthroplasty	Degenera- tive	Shoulder	Ortho	Yes	68.8
Al-Khamis et al	2019	295,490	mFI-5	Various	Various	GI	General Surgery	Yes	75
Holzgrefe et al	2019	9861	mFI-5	Arthroplasty	Degenera- tive	Shoulder	Ortho	Yes	75
Traven et al	2019a	58,603	mFI-5	Various	Fracture	Hip	Ortho	Yes	61.3

Table 3 (continued)

Author	Publication year	Total cohort	Indices assessed	Procedure	Disease type	Disease site	Specialty	Outcome(s) of interest	Grade (%)
Weaver et al	2019	23,516	mFI-5	Fusion/ decom- pression	Degenera- tive	Spine	Neuro	Yes	72
Segal et al	2018	2465	mFI-5	Augmenta- tion	Fracture	Spine	Neuro	Yes	75
Chen et al	2018	1928	mFI-5	Resection	Cancer	Liver	Surgical Oncol- ogy	Yes	72
Seilern et al	2022	165,957	mFI-5, aamFI-5	Arthroplasty	Degenera- tive	Hip	Orthopedics	Yes	73.4
Elsamadicy et al	2022b	1613	mFI-5, CCI	Resection	Cancer	Spine	Neurosurgery	Yes	75
Hersh et al	2021	322	mFI-5, CCI	Resection	Cancer	Spine	Neurosurgery	Yes	75
Khalafallah et al	2020	1692	mFI-5, CCI	Resection	Cancer	Brain	Neuro	Yes	75
Nobrega et al	2022	109	mFI-5	Revasculari- zation	Vascular	Aortoilliac	Cardiovascular	no	61.3
Jain et al	2021	11,852	mFI-5	Reconstruc- tion	Various	Breast	Plastic Surgery	no	72
Goshtasbi et al	2021	701	mFI-5	Resection	Cancer	Head and neck	Neurosurgery	no	61.3
Saadeddin et al	2020	2612	mFI-5	Bypass	Vascular	Aortoilliac	Cardiovascul;ar	no	72
Shahait et al	2021	3556	mFI-5	Resection	Cancer	Bladder	Urology	no	75

5-item Modified Frailty Index (mFI-5), Age-adjusted mFI-5 (aamFI-5), Charlson Co-morbidity Index (CCI)

 $Outcomes \ of \ Interest - 90-day \ morbidity/mortality, \ 30-day \ morbidity/mortality, \ in-hospital \ morbidity/mortality, \ severe \ complications \ (Clavien-Dindo \geq III)$

Grade – Papers were assessed for quality utilizing the modified scoring system for minors. Points were assigned for the following: clearly stated aim (+2), inclusion of consecutive patients (+2), prospective data collection that details a clear collection plan (+2), endpoints relevant to this study assessed (+2), an unbiased assessment of the study endpoint through proper controls (+2), proper follow-up after study period (+2), loss to follow-up less than 5% (+2), and prospective calculation of study size (+2)

(n = 50/111, 45%). The other procedure types were amputation (n = 1/111, 0.9%), arthroplasty (n = 10/111, 9%), augmentation (n = 1/111, 0.9%), bypass (n = 2/111, 1.8%), fusion/decompression (n = 7/111, 6.3%), graft (n = 1/111, 0.9%), interventional (n = 1/111, 0.9%), reconstruction (n = 7/111, 6.3%), repair (n = 6/111, 5.4%), revascularization (n = 1/111, 0.9%), trauma (n = 8/111, 7.2%), and various others (n = 12/111, 10.8%). There were 25/111 studies included in this review that compared multiple comorbidity indices in the same cohort.

Comorbidity Instruments

Limiting included comorbidity indices per study to only those that meet the criteria for ease of use and reproducibility yielded 12 unique co-morbidity indices. In total, there were 136 co-morbidity indices assessed. The most common index assessed was the Charlson Comorbidity Index (CCI) (n=42/136). Other indices assessed included the age-adjusted Charlson Comorbidity Index (ACCI) (n = 17/136), five-item modified frailty index (mFI-5) (n = 40/136), Elixhauser Comorbidity Index/Measure (ECI/ ECM) (n = 17/136), modified ACCI (mACCI) (n = 1/136), Charlson-Deyo Comorbidity Index (CCI-D) (n = 9/136), comorbidity-polypharmacy score (CPS) (n = 7/136), modified Charlson Comorbidity Index (mCCI) (n = 1/136), enhanced ECI (n = 1/136), and age-adjusted mFI-5 (aamFI-5) (n = 1/136).

90-Day Morbidity and Mortality

Three studies reported data for 90-day mortality. There was not enough combined data to perform meta-analysis on these results. Franko 2018 ²⁸ reported a statistically significant association between CCI-D and 90-day mortality for patients undergoing esophagectomy (OR: 1.58, 95% CI: 1.01–2.49, p=0.046). *McFerrin* 2019 ²⁹ reported a statistically significant association between CCI and oncologic cystectomy (HR: 1.42, 95% CI: 1.27–1.57, p < 0.001). *Chiu* 2015 ³⁰ reported a statistically significant association between CCI-D and between CCI-D and between CCI-D and statistically significant association between CCI-D and oncologic cystectomy (HR: 1.42, 95% CI: 1.27–1.57, p < 0.001). *Chiu* 2015 ³⁰ reported a statistically significant association between CCI-D and

 Table 4
 Studies assessing Charlson Co-morbidity Index (CCI)

Author	Publication year	Total cohort	Indices assessed	Procedure	Disease type	Disease site	Specialty	Outcome(s) of interest	Grade (%)
Kushner et al	2021	55	CCI	Repair	Hernia	Peritoneum	General Sur- gery	Yes	81.3
R. Ahola et al	2022	95	CCI	Resection	Cancer	Pancreas	Surgical Oncology	Yes	75
Fragkiadis et al	2021	171	CCI	Resection	Cancer	Kidney	Surgical Oncology	Yes	81.3
Wang et al	2021	247	CCI	Resection	Cancer	GI	Surgical Oncology	Yes	65.8
Shinonara et al	2021	366	CCI	Fusion	Degenerative	Spine	Orthopedics	Yes	68.8
Aicher et al	2022	367	CCI	Resection	Obstruction	GI	General Sur- gery	Yes	75
Aicher et al	2020	439	CCI	Resection	Obstruction	GI	General Sur- gery	Yes	81.3
Dodhia et al	2021	448	CCI	Resection	Cancer	Nasal	ENT	Yes	68.8
Maffezzini et al	2021	334	CCI	Resection	Cancer	Bladder	Urology	No	65.8
Yamashita et al	2018	548	CCI	Resection	Cancer	Esophagus	Surgical Oncology	No	75
McFerrin et al	2019	31,147	CCI	Resection	Cancer	Bladder	Urology	Yes	68.8
Wada et al	2022	593	CCI	Resection	Cancer	Colon	Surgical Oncology	No	75
Sawada et al	2016	2316	CCI	Resection	Cancer	Lung	Surgical Oncology	No	72
Nakajo et al	2019	360	CCI	Resection	Cancer	Esophagus	Surgical Oncology	No	70
Bateni et al	2017	1928	CCI	Resection	Obstruction	GI	General Sur- gery	Yes	75
Khassawna et al	2021	75	CCI	Repair	Fracture	Femur	Orthopedics	No	70
Kocher et al	2020	1236	CCI	Resection	Cancer	Kidney	Urology	Yes	81.3
Iwai et al	2018	585	CCI	Resection	Cancer	Gastric	Surgical Oncology	No	75
Badgwell et al	2013	111	CCI	Resection	Cancer	GI	Surgical Oncology	Yes	81.3
Pujara et al	2015	279	CCI	Resection	Cancer	Gastric	Surgical Oncology	Yes	68.8
Meng et al	2018	1516	mCCI	Resection	Cancer	Bladder	Urology	Yes	82
Woldu et al	2019	353	CCI	Resection	Cancer	Bladder	Urology	Yes	81.3
DH Park et al	2022	657	CCI, G8 frailty	Resection	Cancer	GU	Surgical Oncology	Yes	56.3
Palumbo et al	2020	3644	CCI	Resection	Cancer	Kidney	Surgical Oncology	Yes	81.3

Charlson Co-morbidity Index (CCI), Modified CCI (mCCI)

 $Outcomes \ of \ Interest - 90-day \ morbidity/mortality, \ 30-day \ morbidity/mortality, \ in-hospital \ morbidity/mortality, \ severe \ complications \ (Clavien-Dindo \geq III)$

Grade – Papers were assessed for quality utilizing the modified scoring system for minors. Points were assigned for the following: clearly stated aim (+2), inclusion of consecutive patients (+2), prospective data collection that details a clear collection plan (+2), endpoints relevant to this study assessed (+2), an unbiased assessment of the study endpoint through proper controls (+2), proper follow-up after study period (+2), loss to follow-up less than 5% (+2), and prospective calculation of study size (+2)

Table 5	Studies	assessing	Charlson-	Deyo (Co-morbidity	Index	(CCI-D)
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Author	Publication year	Total cohort	Indices assessed	Procedure	Disease type	Disease site	Specialty	Outcome(s) of interest	Grade (%)
Chiu et al	2015	23,107	CCI-D	Resection	Cancer	Liver	Surgical Oncology	Yes	68.8
Chang et al	2017	77,971	CCI-D	Resection	Cancer	Breast	Surgical Oncology	Yes	62.5
Oba et al	2022	7849	CCI-D	Resection	Cancer	Pancreas	Surgical Oncology	No	75
Franko et al	2018	1244	CCI-D	Resection	Cancer	Esophagus	Surgical Oncology	Yes	81.3
Andreozzi et al	2020	1273	CCI-D	Arthroplasty	Degenerative	Knee	Ortho	Yes	75
Shi et al	2014	18,286	CCI-D	Trauma	Trauma	Brain	Neurosurgery	No	72
Khalafallah et al	2020	108	CCI-D	Resection	Cancer	Brain	Neurosurgery	No	75
Strombom et al	2019	1813	CCI-D, CCI- R, ECI	Resection	Cancer	Colon	Surgical Oncology	Yes	81.3
Gutacker et al	2015	129,653	CCI-D, ECI	Graft	Vascular	Heart	Cardiovas- cular	Yes	81.3

Charlson-Deyo Co-morbidity Index (CCI-D), Charlson-Romano Co-morbidity Index (CCI-R), Elixhauser Co-morbidity Index/Measure (ECI/ECM)

 $Outcomes \ of \ Interest - 90-day \ morbidity/mortality, \ 30-day \ morbidity/mortality, \ in-hospital \ morbidity/mortality, \ severe \ complications \ (Clavien-Dindo \geq III)$

Grade – Papers were assessed for quality utilizing the modified scoring system for minors. Points were assigned for the following: clearly stated aim (+2), inclusion of consecutive patients (+2), prospective data collection that details a clear collection plan (+2), endpoints relevant to this study assessed (+2), an unbiased assessment of the study endpoint through proper controls (+2), proper follow-up after study period (+2), loss to follow-up less than 5% (+2), and prospective calculation of study size (+2)

90-day mortality in patients undergoing oncologic hepatic resection (HR: 1.05, 95% CI: 1.023–1.068, p < 0.001). One study reported data for 90-day morbidity. *DH Park* 2022 ³¹ reported a statistically insignificant association between CCI and 90-day morbidity in patients undergoing genitourinary oncologic resection (OR: 1.24, 95% CI: 0.8–1.04, p=0.341). One study also reported data for 90-day major morbidity. *Pujara* 2015 ³² found a statistical association between a polypharmacy score of greater than or equal to five and 90-day major morbidity among patients undergoing oncologic gastrectomy (OR: 2.36, 95% CI: 1.08–5.17, p=0.3). The same study did not find a statistical association between CCI and 90-day major morbidity.

In-Hospital/30-Day Mortality

Fifty-four studies reported outcomes on in-hospital/30-day mortality, twenty-one of those studies reported odds ratios that could be pooled for meta-analysis. Of the twenty-one studies, there were four studies $^{24,33-35}$ that reported unadjusted data while the remaining seventeen studies reported adjusted data. Eleven studies $^{24,35-45}$ (20%) reported odds ratios for the mFI-5

and were pooled for meta-analysis. Of the studies reporting mFI-5, there was a statistical association with an increase in the odds of in-hospital/30-day mortality (OR: 1.97, 95% CI: 1.55–2.49, p < 0.01) (Fig. 2). There were five studies ^{39,46–49} (9.4%) that reported odds ratios for CCI and were pooled for meta-analysis. Of the pooled CCI results, there was an increase in the odds for in-hospital/30-day mortality (OR: 1.44, 95% CI: 1.27–1.64, p < 0.01) (Fig. 2). Pooled results for ACCI (n=2, p=0.38), ^{33,34} CCI-D (n=1), ²⁸ and ECI (n=1) ⁵⁰ showed a positive trend but were not significant (Fig. 2).

In-Hospital/30-Day Complications

Fifty-two studies reported outcomes for in-hospital/30day morbidity. There were 26 (50%) studies that reported ORs for in-hospital/30-day morbidity that could be pooled for meta-analysis. Of the pooled studies, eleven studies ^{24,34,35,51–57} (21.2%) reported unadjusted odds ratios. Of the pooled unadjusted results, there was a statistical association between co-morbidities and an increase in the odds of in-hospital/30-day morbidity (OR: 1.62, 95% CI: 1.30–2.02, p < 0.01) (Fig. 3). Sixteen studies ^{36,38,40–45,58–64}

Author	Publication year	Total cohort	Indices assessed	Procedure	Disease type	Disease site	Specialty	Outcome(s) of interest	Grade (%)
Goltz et al	2019	10,022	ECI	Arthroplasty	Various	Joint	Orthopedics	No	81.3
Hinton et al	2021	1313	ECI, ASA	Arthroplasty	Degenerative	Knee	Orthopedics	No	72
Menendez et al	2014	14,007,813	ECI, CCI	Various	Various	Various	Orthopedics	Yes	75
Menendez et al	2015	387,973	ECI, CCI	Repair	Fracture	Humerus	Orthopedics	Yes	72
Baron et al	2020	43,930	ECI, CCI	Fusion	Injury	Spine	Orthopedics	Yes	75
Kim et al	2018	90,491	ECI, CCI	Arthroplasty	Degenerative	Shoulder	Orthopedics	Yes	81.3
Ondeck et al	2018	49,738	ECI, CCI	Various	Fracture	Hip	Orthopedics	Yes	68.8
Potts et al	2019	6,601,526	ECM	Interven- tional	Vascular	Heart	Cardiovas- cular	Yes	81.3
Tang et al	2021	8080	ECM, CCI	Various	Fracture	Hip	Orthopedics	Yes	75
Maron et al	2020	46,700	ECM, CCI	Fusion	Injury	Spine	Orthopedics	Yes	75
Ranson et al	2020	261,780	ECM, CCI	Fusion	Degenerative	Spine	Neurosurgery	Yes	75
Congiusta et al	2021	1,511,057	enhanced CCI, ECI	Various	Infection	Hand	Orthopedics	Yes	75
Vesterager et al	2022	31,443	ECI, CCI	Various	Fracture	Hip	Orthopedics	Yes	81.3
Ling et al	2021	1817	CCI, ECI	Arthroplasty	Degenerative	Shoulder	Orthopedics	No	72

 Table 6
 Studies assessing Elixhauser Co-morbidity Index/Measure (ECI/ECM)

Charlson-Deyo Co-morbidity Index (CCI-D), Charlson-Romano Co-morbidity Index (CCI-R), Elixhauser Co-morbidity Index/Measure (ECI/ ECM), Physical Status Score classified by the American Society of Anesthesiologists (ASA)

 $Outcomes \ of \ Interest - 90-day \ morbidity/mortality, \ 30-day \ morbidity/mortality, \ in-hospital \ morbidity/mortality, \ severe \ complications \ (Clavien-Dindo \geq III)$

Grade – Papers were assessed for quality utilizing the modified scoring system for minors. Points were assigned for the following: clearly stated aim (+2), inclusion of consecutive patients (+2), prospective data collection that details a clear collection plan (+2), endpoints relevant to this study assessed (+2), an unbiased assessment of the study endpoint through proper controls (+2), proper follow-up after study period (+2), loss to follow-up less than 5% (+2), and prospective calculation of study size (+2)

(30.8%) reported adjusted odds ratios that were able to be pooled for meta-analysis. It should be noted that all studies (n = 16) from which adjusted data was obtained utilized the mFI-5. Of the pooled adjusted results combining data for all of the co-morbidity indices, there was a statistical association between the co-morbidity instruments and an increase in the odds of in-hospital/30-day morbidity (OR: 1.47, 95% CI: 1.31–1.64, p < 0.01) (Fig. 3). Ten studies ^{24,34–36,42–44,51,54,56} (19.2%) reported odds ratios assessing co-morbidity instruments utilizing a continuous predictor (scale) and were pooled for meta-analysis. Pooled results for co-morbidity indices utilizing a scale-based predictor were significantly associated with an increase in the odds of in-hospital/30-day morbidity (OR: 1.32, 95% CI: 1.20–1.46, p < 0.01) (Fig. 4). Sixteen studies ^{38,40,41,45,52,53,55,57-65} (30.8%) reported odds ratios assessing co-morbidities on a categorical basis. On pooled analysis, the categorical results showed a higher odd for inhospital/30-day morbidity (OR: 1.74, 95% CI: 1.50-2.02,

p < 0.01) (Fig. 4). One study (Marya et al. 2016) reported an increased odds of 30-day morbidity utilizing the ACCI (OR: 4.16, 95% CI: 1.87–9.26) and CCI (OR: 3.35, 95% CI: 1.08–10.40) that showed increased statistical power compared to the other studies (Fig. 4).

Severe Complications

Eighteen studies ^{34,41,44,65–79} reported outcomes on severe complications. Severe complications were typically defined as CD grade III/IV and higher. ²⁶ Eleven studies ^{34,41,44,65,68,71–74,77,78} (61%) reported odds ratios that were able to be pooled for meta-analysis (Fig. 5). Six studies ^{41,43,65,68,77,78} (33%) reported odds ratios for mFI-5 that were able to be pooled for metaanalysis. Of the pooled results, mFI-5 was significantly associated with severe complications (OR: 3.31, 95% CI: 1.13–9.67, p < 0.04) (Fig. 5). Pooled results for ACCI (n=3, p=0.19) and CCI (n=2, p=0.38) showed a positive trend toward severe complications but were not significant (Fig. 5).

Odds Ratio for 30d Mortality

Study	Index	Odds Ratio	OR	95%-CI	Weight
Index = ACCI Bateni 2018 Lakomkin 2019 Overall Effect Heterogeneity: $I^2 = 60\%$, Test for effect in subgroup	ACCI ACCI p = 0.11 $b: t_1 = 1.49 (p = 0.3)$	38)	2.18 1.24 1.47	[1.09; 4.36] [1.14; 1.35] [0.05; 40.21]	3.7% 6.6% 10.2%
Index = CCI Aicher 2020 Aicher 2022 Khallafallah 2020 Nossaman 2018 Palumbo 2020 Overall Effect Heterogeneity: $I^2 = 0\%$, p Test for effect in subgroup	CCICCICCICCICCICCICCICCICCICCI	D1)	1.46 1.60 1.32 1.23 1.49 1.44	[1.06; 2.02] [1.08; 2.36] [0.42; 4.12] [0.78; 1.94] [0.78; 2.85] [1.27; 1.64]	5.7% 5.3% 2.1% 4.9% 3.9% 21.9%
Index = CCI-D Franko 2018	CCI-D		1.77	[0.99; 3.18]	4.2%
Index = ECI Potts 2019	ECI	+	5.13	[4.76; 5.53]	6.6%
Index = mFI-5 Andersen 2020 Braet 2020 Goshtasbi 2022 Khallafallah 2020 Pierce 2021 Segal 2018 Seilern 2022 Subramaniam 2021 Tracy 2020 Traven 2019a Traven 2019b Weaver 2019 Overall Effect Heterogeneity: I^2 = 96%, Test for effect in subgroup	mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5	.01)	1.60 3.80 1.90 2.56 3.06 3.39 1.97 1.13 1.34 2.11 1.59 1.97	$ \begin{bmatrix} 1.19; & 2.16] \\ [1.69; & 8.54] \\ [0.82; & 4.40] \\ [1.41; & 4.64] \\ [2.23; & 3.00] \\ [1.04; & 9.00] \\ [2.08; & 5.53] \\ [1.89; & 2.04] \\ [1.01; & 1.26] \\ [1.29; & 1.39] \\ [1.45; & 3.09] \\ [0.57; & 4.45] \\ [1.55; & 2.49] $	5.8% 3.2% 3.0% 4.2% 6.4% 2.2% 4.7% 6.6% 6.6% 5.4% 2.4% 57.1%
Overall Effect Heterogeneity: $I^2 = 98\%$, Test for overall effect: t_{20} Test for subgroup differen	p < 0.01 = 6.97 ($p < 0.01$) cces: $\chi_4^2 = 470.96$, c	$ \begin{array}{c c} & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \\ &$	1.91	[1.57; 2.32]	100.0%

Fig.2 Comparative performance of indices for in-hospital/30-day mortality. Shown: age-adjusted Charlson (ACCI), Charlson Co-morbidity Index (CCI), Charlson-Deyo score (CCI-D), Elixhauser Co-

morbidity Index (ECI), and 5-item Modified Frailty Index (mFI-5). The overall effect of mFI-5 and CCI showed a statistical association with in-hospital/30-day mortality

Discussion

In this systematic review and meta-analysis of 111 studies, we found that, the mFI-5 outperformed the other traditional comorbidity indices (CCI, ACCI, ECI, CCI-D) in predicting in-hospital/30-day mortality and severe complications postoperatively. There was a great degree of statistical reporting heterogeneity among studies included which prevented two of the key outcomes (90-day mortality and morbidity) from being included in meta-analysis. Additionally, studies

Study	Index	Odds Ratio	OR	95%-CI	Weight
Predictor = Scale Koseki 2021 Lakomkin 2019 Elsamadicy 2022b Andersen 2020 Elsamadicy 2022b Luo 2022 Pierce 2021 Subramaniam 2021 Tracy 2020 Traven 2019a Traven 2019a Traven 2019b Overall Effect Heterogeneity: I^2 = 97% Test for effect in subgro	ACCI ACCI CCI mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5	¢ (<i>p</i> < 0.01)	1.30 1.15 1.52 1.21 1.17 1.68 1.46 1.09 1.30 1.60 1.32	$ \begin{bmatrix} 1.24; & 1.37 \\ 1.10; & 1.20 \\ 1.22; & 1.90 \\ 1.07; & 1.39 \\ 1.03; & 1.42 \\ 1.03; & 1.33 \\ 1.61; & 1.75 \\ 1.44; & 1.49 \\ 1.02; & 1.16 \\ 1.26; & 1.33 \\ 1.51; & 1.70 \\ 1.20; & 1.46 \end{bmatrix} $	4.5% 4.5% 3.6% 4.2% 4.0% 4.2% 4.5% 4.5% 4.5% 4.5% 4.5% 4.5%
Predictor = Category Marya 2016 Marya 2016 Chen 2018 Dammeyer 2021 Elsamadicy 2021a Goldwag 2021 Goshtasbi 2022 Hermiz 2021 Holzgrefe 2019 Lee 2020 Lee 2022 Liu 2022 Magno-Pardon 2022 Segal 2018 Seilern 2022 Weaver 2019 Zreik 2021 Overall Effect Heterogeneity: I^2 = 83%	ACCI CCI mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5 mFI-5	+ (p < 0.01)	- 4.16 - 3.35 1.41 1.30 1.77 2.26 1.29 1.32 2.40 1.34 1.98 1.92 1.37 1.99 1.90 1.45 2.64 1.74	$ \begin{bmatrix} 1.87; & 9.26 \\ [1.08; & 10.40] \\ [1.02; & 1.95] \\ [1.09; & 1.55] \\ [1.36; & 2.31] \\ [1.95; & 2.61] \\ [1.10; & 1.52] \\ [1.08; & 1.62] \\ [1.08; & 3.10] \\ [0.95; & 1.88] \\ [1.06; & 3.70] \\ [1.40; & 2.63] \\ [1.09; & 1.72] \\ [1.16; & 3.43] \\ [1.78; & 2.02] \\ [1.30; & 1.62] \\ [2.10; & 3.31] \\ [1.50; & 2.02] \\ \end{bmatrix} $	1.1% 0.6% 2.9% 3.9% 3.3% 4.1% 4.0% 3.8% 3.4% 2.9% 1.5% 3.0% 3.6% 4.5% 4.3% 3.6% 52.3%
Overall Effect Heterogeneity: $I^2 = 95\%$ Test for overall effect: t_j Test for subgroup differ	6, p < 0.01 27 = 8.37 (p < ences: γ_{*}^{2} = 1	$\begin{array}{c c} & & & & \\ 0.01) & 0.5 & 1 & 2\\ 0.66, df = 1 (p < 0.01) \end{array}$	1.52	[1.37; 1.69]	100.0%

Odds Ratio for 30d Morbidity

Fig. 3 Comparative performance of indices using a continuous predictor (scale) and studies that use a cut-off (categorical) for in-hospital/30-day morbidity. Shown: age-adjusted Charlson (ACCI),

utilizing CPS were unable to be included in the meta-analysis due to how few studies reported data and based on their level of heterogeneity.

Additionally, it was found that Marya et al. 2016 reported extremely high ORs for 30-day morbidity utilizing the CCI and ACCI (Fig. 3). The reason for the high statistical power in this study are probably related to the fact that it

Charlson Co-morbidity Index (CCI), and 5-item Modified Frailty Index (mFI-5). The overall effect of scaled and categorical indices showed a statistical association with in-hospital/30-day morbidity

represents one of the largest single-center, single-surgeon bilateral simultaneous total knee arthroplasty (BSLKA) studies done in the Asian population. Thus, the variation in management was kept for the most part homogenous among all participants which could have allowed for a more controlled study environment to measure CCI and ACCI. It was found that the ACCI out-performed CCI probably



Fig. 4 Comparative performance of adjusted and unadjusted study results for in-hospital/30-day morbidity. Shown: age-adjusted Charlson (ACCI), Charlson Co-morbidity Index (CCI), and 5-item Modi-

fied Frailty Index (mFI-5). The overall effect for adjusted and unadjusted data predicted in-hospital/30-day morbidity

due to the inclusion of age since this is a major risk factor in BSLKA. ⁵² Unfortunately, there was limited reporting of studies utilizing the ACCI that were able to be included in the meta-analysis making the comparison to mF-5 somewhat limited. However, our meta-analysis still found the mFI-5 to be superior to the ACCI in predicting severe complications and in-hospital/30-day mortality.

To date, this is the first systematic review and metaanalysis to compare the effectiveness of co-morbidity indices versus the newer mFI-5 index. Functional dependent

Odds Ratio for Severe Complications



Fig. 5 Comparative performance of indices for severe complications. Shown: Age-adjusted Charlson (ACCI), Charlson Co-morbidity Index (CCI), and 5-item Modified Frailty Index (mFI-5). The overall effect for the mFI-5 showed a statistical association with severe complications

status (FDS) captured by mFI-5 could be the reason it outperformed the other indices on meta-analysis. FDS could better capture health status and risk for complications than traditional co-morbidity lists. The role of frailty in surgical outcomes has been highlighted in a recent well conducted systematic review and meta-analysis that found frailty indices significantly associated with 30-day mortality, adverse discharge disposition, post-operative complications, longterm mortality, and hospital length of stay. ¹⁶

The strengths of this study include the comprehensive nature of the literature search and the sound statistical comparisons made when available. Limitations of this review include the fact that the meta-analysis was limited to studies reporting ORs and thus many important data points may have not been included. The heterogeneity among reporting styles included in this study signal a need for more uniformity among the studies investigating frailty and co-morbidity indices in surgical

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patients. This would allow a more comprehensive meta-analysis to be performed to compare each index. Additionally, there may have been cohort overlap between studies which could have potentiated a bias in the results and our conclusions. In the severe complications category, some studies used their own definition and severe and this could have differed from the CD grading system of complications. Determining the best index per specialty would provide more value to this work. However, while attempting to make a statistical comparison of the different indices within a specialty, we realized that we do not have the data to make such a quantitative analysis. Within each specialty group, we only have multiple papers for mFI-5 but not any of the other indices. This is something that we would like to address in a future literature review as more publications become available. Finally, quality assessment of the studies found that generally the studies included were sound in methodology.

The results of this review highlight the value of newer frailty indices like mFI-5 in predicting surgical outcomes. There is a need for an increased degree of statistical homogeneity among studies attempting to validate co-morbidity indices. Specifically, the co-morbidity polypharmacy score (CPS) needs for studies to be conducted to allow a better comparison of the predictive capability of an index focused on capturing polypharmacy. As society ages, both frailty and polypharmacy are becoming significant factors in surgical performance and are in need of simple, yet accurate tools for their measure.

Conclusion

In conclusion, the cumulative data of this study suggest that frailty indices like mFI-5 are more predictive over traditional co-morbidity indices that do not include a capture of functional dependent status regarding surgical outcomes. Further studies are warranted to obtain a wider picture of how mFI-5 compares to other indices in predicting surgical outcomes including a comparison of both frailty and polypharmacybased indices.

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4. Agreement to be accountable for all aspects of the work in ensuring that questions related to the accuracy: Noah A. Clements, Jeremy T. Gaskins, PhD, Robert C.G. Martin II, MD, PhD.

Declarations

Not applicable since a meta-analysis.

Conflict of Interest The authors declare no competing interests.

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