1 General Comorbidity Indicators Contribute to Fracture Risk

2 Independent of FRAX: Registry-Based Cohort Study

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Short title: Medical comorbidity and fracture prediction

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- 3
- 4 Abstract
- 5
- 6 **Context**: FRAX[®] estimates 10-year fracture probability from osteoporosis-specific risk factors.
- 7 Medical comorbidity indicators are associated with fracture risk but whether these are
- 8 independent from those in FRAX is uncertain.
- 9 **Objective:** We hypothesized Johns Hopkins Aggregated Diagnosis Groups (ADG[®]) scores or
- 10 recent hospitalization number may be independently associated with increased risk for
- 11 fractures.
- 12 **Design**: Retrospective cohort study.
- 13 Setting: Manitoba BMD Registry (1996-2016).
- 14 **Participants**: Women and men age \geq 40 with at least 3 years prior health care data
- 15 **Exposures**: Using linked administrative databases, ADG[®] scores were constructed along with
- 16 number of hospitalizations for each individual. **Main measures**: Incident Major Osteoporotic
- 17 Fracture and Hip Fracture was ascertained during average follow up of 9 years; Cox regression
- 18 analysis determined the association between increasing ADG[®] score or number of
- 19 hospitalizations and fractures.
- 20 **Results:** Separately, hospitalizations and ADG[®] score independently increased the hazard ratio
- 21 for fracture at all levels of comorbidity (hazard range 1.2-1.8, all p<0.05), irrespective of
- 22 adjustment for FRAX, BMD and competing mortality. Taken together, there was still a higher
- 23 than predicted rate of fracture at all levels of increased comorbidity, independent of FRAX and
- 24 BMD but attenuated by competing mortality. Using an intervention threshold of major fracture

6 7 8 Introduction 9 Osteoporotic fractures constitute a major contributor to pain, disability, health care costs 10 (direct and indirect)¹² and mortality³. Effective anti-fracture therapies exist⁴⁵ and the present 11 medical paradigm suggests such therapies be offered to individuals at high risk of fracture⁶. 12 The primary tasks of the bone health assessment is to determine which patients are at high risk 13 for fracture, particularly in the primary prevention setting. The development of several 14 population-based and validated fracture risk assessment scores have been useful for this 15 purpose⁷⁸ although it is recognized that the existing tools have imperfect discrimination⁹¹⁰¹¹¹²¹³. 16 The characteristics of individual patients may either increase or decrease their predicted 17 fracture risk and may account for the imperfect categorization of existing risk assessment 18 systems. A number of health conditions have been studied in this regard, including diabetes¹⁴, 19 prostate cancer¹⁵, chronic kidney disease¹⁶, Parkinson's disease¹⁷, falls¹⁸ and frailty¹⁷ among 20 others. For each health condition, population fracture risk studies have shown an increased 21 fracture rate. However, in many cases, unless the study is undertaken in conjunction with 22 existing fracture risk assessment tools, it is unknown whether any observed increased risk is 23

- risk > 20%, application of the comorbidity hazard ratio multiplier to the patient population FRAX 1
- 2 scores would increase the number of treatment candidates from 8.6% to 14.4%.
- **Conclusions:** Both complex and simple measures of medical comorbidity may be used to modify 3
- FRAX-based risk estimates to capture the increased fracture risk associated with multiple 4
- comorbid conditions in older patients. 5

- 1 independent of that which might already be predicted using a more widely validated tool
- 2 comprising common risk factors or bone density (BMD).

It is therefore impractical and unrealistic, given the number of permutations for individual 3 patients' special considerations, to have a unique fracture risk tool or adjustment for every 4 5 medical problem. A more general approach would be to derive and validate fracture risk multipliers for existing risk assessment tools that may account for these additional factors. 6 7 Given the real-world complexity of patient care, it would be preferable to design such multipliers in a sufficiently broad fashion to capture medical complexity without needing to 8 account for every possible health condition and interactions amongst conditions. This may 9 involve cumulative medical comorbidity scores or, more generally, a consideration of recent 10 hospitalizations as an easily identifiable and broadly applicable marker of ill health. In 11 particular, the number of hospitalizations may be a proxy indicator of comorbidity as greater 12 healthcare use may reflect general comorbidity. As a first step to address this need, we 13 performed a fracture outcomes-based population risk analysis within a well-characterized 14 administrative database to determine whether a general index of medical comorbidity or the 15 number of recent hospitalizations might be a FRAX[®]-independent risk factor for subsequent 16 fracture. 17

18

19 Methods

20 Study population and setting

This study was approved by the Health Research Ethics Board of the University of Manitoba and
 the Health Information Privacy Committee of Manitoba Health. We used the population-based

1	Manitoba BMD program registry to identify women and men over the age of 40 years
2	undergoing a first (baseline) BMD test between January 1, 1996 to March 31, 2016 and in
3	whom at least 3 years of prior provincial health care data were available. In Manitoba, Canada,
4	all health care is provided through a single, government-payor health system such that each
5	interaction with the health system may be tabulated and interrogated. For each encounter,
6	information including demographics, date, type of service and diagnostic codes was recorded.
7	Hospital discharge abstracts containing diagnoses, procedures and physician billing claims are
8	coded using ICD-9, Clinical Modification (i.e., ICD-9-CM) prior to 2004 and ICD-10 Canadian
9	version (i.e., ICD-10-CA), thereafter. Data on dispensation of prescribed medication, available
10	from 1995 onwards, were collected via the provincial retail pharmacy system ¹⁹ . The Manitoba
11	BMD program registry has been used in many validated studies of osteoporosis risk factors and
12	fracture rates ²⁰¹²¹⁴²¹ since it can be linked through anonymous identifiers to the administrative
13	databases listed where completeness and accuracy rates of > 99% have been
14	demonstrated ²²²³²⁴²⁵ .

15

16 Definition and classification of general medical comorbidity

Two measures were used to define severity-stratified general medical comorbidity: number of
hospitalizations in the three years prior to the BMD test, and Johns Hopkins Aggregated
Diagnosis Groups[™] (ADGs[®]) score created using The Johns Hopkins Adjusted Clinical Group[®]
(ACG[®]) Case-Mix System version 9. Each patient's ADG[®] score was computed from hospital and
physician claims data for the year prior to the BMD assessment. The ADG[®] score is a patientfocused, diagnosis-based means of categorizing medical conditions²⁶²⁷. Each ICD-9-CM or ICD-

10-CA code is categorized into one of 32 clusters known as an Aggregated Diagnosis Group 1 2 based upon duration of the condition, severity, diagnostic certainty, etiology and requirement for specialty care. ICD codes in the same ADG[®] are alike in clinical aspects and demand for 3 health system utilization; any patient may have diagnoses belonging to 0 - 32 ADG[®]s. The ADG[®] 4 groupings use both inpatient and ambulatory health data so that both ICD codes and physician 5 billing codes may be combined as unique contributing sources. Although originally designed to 6 permit study of system healthcare resource use²⁸, the ADG[®] system has been validated in 7 secondary populations²⁹³⁰ and shown to predict mortality in general adult populations³¹ as well 8 as hospitalization in specific patient groups³². The ADG[®] score is potentially superior to other 9 comparable scores such as the Charlson Comorbidity Index or Elixhauser method given direct 10 comparison between methods has shown slightly higher discriminative ability for the ADG®s 11 score³³. Hospitalization was determined from the Hospital Discharge Abstract Data (DAD) 12 system and includes records of both Manitoba residents hospitalized in Manitoba facilities with 13 detailed information about inpatient and day surgery services. The Hospital Abstracts Data 14 consist of hospital forms/computerized records containing summaries of demographic and 15 clinical information completed at the point of discharge from the hospital by trained health 16 records data abstracters. 17

18

19 Fracture and outcome ascertainment

Fracture incidence was ascertained using hospital discharge abstract and physician billing claims between the index date (BMD testing) and March 31, 2016 which were assessed for evidence of occurrence of a hip fracture or major osteoporotic fracture(MOF). Fractures of the face, hands, feet and ankles were excluded as were any fractures associated with severe trauma codes as
previously described²⁴. Hip and forearm fractures were verified by the co-existence of a
fracture reduction, fixation or casting code. Duplication of fracture counting was minimized by
requiring that there be no hospital or billing code for the same fracture site in the year prior to
an incident fracture²⁵. Hospitalization was determined from the Hospital Discharge Abstract
Data and mortality verified from the registration file which is updated against Vital Statistics.

7

8 Bone densitometry and FRAX[®] score calculation

All BMD measures in the province of Manitoba are performed under the provincial BMD 9 program using cross-calibrated DXA devices under the direct supervision of a medical physicist 10 (Lunar DPX, Prodigy or iDXA; GE Health Care, Madison, WI, USA). The Manitoba database was 11 not used to generate the relevant FRAX[®]-Canada tool but has been previously used in validation 12 studies of calibration and discrimination³⁴. Prior fracture and other FRAX[®]-input variables were 13 assessed using a combination of self-report and linkage to administrative data. Weight and 14 height were measured at the time of BMD, and BMI was calculated as weight (kg) divided by 15 height (m) squared. We defined prior fragility fracture as any non-traumatic fracture that 16 occurred before the baseline BMD test examining medical records back to 1979; the mean (SD) 17 look-back period was 22.0 (6.6) years. Parental hip fracture was self-reported after 2005 and in 18 earlier years was ascertained from linkage to parental hospitalization records dating back to 19 1970.³⁵ Current smoking was self-reported after 2005 and for earlier years used data linkage to 20 a diagnosis of chronic obstructive lung disease as a proxy for significant smoking in earlier 21 vears^{36,37}. High alcohol use was by self-report of weekly alcohol intake from 2012 onwards and 22

from administrative data (i.e., alcohol substance abuse diagnosis codes in hospital and
 physician billing records) in earlier years. Rheumatoid arthritis from 2012 onwards was from

3 patient self-report followed by physician review of medical and pharmacy records, and from

4 administrative data in earlier years using a validated definition.³⁸ Prolonged oral corticosteroid

5 use (>90 days dispensed in the 1 year prior to BMD) was obtained from the provincial pharmacy

6 system.

7

8 Statistical analysis

Descriptive analyses of cohort characteristics included means +/- standard deviations (SD) for 9 continuous variables and frequency(%) for categorical data. For each individual, we determined 10 the number of hospitalizations and number of ADG[®]s and created categorical covariates in the 11 3 years preceding the index BMD. For ADG[®]s, the categories were 0-2 [none; reference], 3-5 12 [mildly increased comorbidity], 6-8 [moderately increased comorbidity] and ≧9 [markedly 13 14 increased comorbidity]. Based on prior observations regarding hospitalization and incident fractures³⁹, for the present study, hospitalizations were categorized as 0 [none; reference] and 15 1 [mildly increased], 2 [moderately increased], and 3+ [markedly increased]. Multivariable Cox 16 proportional hazards semi-parametric regression models were used to estimate the risk 17 gradient associated with incident hip fracture or MOF for the ADG[®] score and the number of 18 hospitalizations in separate models, and then in a combined model. Hazard ratios (HR) and 95% 19 20 confidence intervals (95% CI) are reported. We adjusted for the following covariates in four separate models: 1) age and sex, 2) FRAX[®] predicted 10-year MOF or HF risk including BMD, 3) 21 FRAX[®] predicted 10-year MOF or HF risk with BMD and competing mortality and 4) FRAX[®] 22

individual risk factors. There was no evidence of collinearity between the ADG® and 1 2 hospitalization measures. Secondary analyses were conducted to show effect of hospitalization over three years compared to hospitalization in the past 12 months only. These models were 3 stratified by age group(40-64 versus 65 years or older), sex (male versus female), and diabetes 4 5 mellitus diagnosis at baseline (presence versus absence). A final sensitivity analysis restricted the cohort to patients with baseline FRAX[®] 10-year predicted MOF risks < 20% and lacking prior 6 7 fracture in order to estimate the proportion in whom application of the comorbidity multiplier might re-classify the patient into a high-risk, treatment-recommended category (i.e. adjusted 8 10-year MOF risk > 20%). Statistical analyses were performed with Statistica (V13.0, StatSoft 9 Inc, Tulsa, OK) and a nominal α = 0.05 was used to define statistical significance. 10

11

12 Results

13 The study population baseline demographics are displayed in Tables 1 and 2 where it may be seen that of the entire population of 86,400, 90% were women and the average(SD) age was 14 64.6(11.0) years. The mean baseline femoral neck T-score was -1.4(1.0) and 11.7% had a T-15 score less than -2.5. Estimated 10-year hip and MOF risks by FRAX[®] with BMD were relatively 16 low on average but 9.1% had a 10-year MOF risk > 20%. The distribution of comorbidity indices 17 18 showed that 18.9% of patients had an ADG[®] score of 0-2 while 10.8% classified as having markedly increased comorbidity (i.e., ADG[®] score≥9). There was 20.1% of the population with 19 prior hospitalization, approximately half of whom were hospitalized more than once in the prior 20 3 years. Over an average follow up of 9.0(5.5) years, there were 8416 unique MOF and 2665 21 22 hip fractures, occurring in 10.1% and 3.2% of the population, respectively.

The primary analysis to test the association between incident fracture and ADG[®] score and 1 2 hospitalization (either separately or combined) is shown in Tables 3 and 4. Taken separately (Table 2), hospitalization and ADG[®] score independently increased the HR for MOF fracture at 3 all levels of comorbidity (HR range 1.2-1.8, all p<0.05), irrespective of adjustment for FRAX®, 4 BMD, competing mortality and risk factors. The same was true for hip fracture. However, after 5 adjustment for FRAX[®] predicted 10-year HF risk and BMD, an increased HR for hip fracture was 6 7 no longer associated with one prior hospitalization. In the models that contained both ADG® score and hospitalization, after controlling for age and sex (Table 4, model 1), there was still a 8 clear, statistically significant increasing gradient of risk for both hip fracture and MOF according 9 to the ADG® score and number of hospitalizations, ranging from a HR of 1.16 (95% CI 1.09-1.24) 10 in the mildly increased ADG[®] score group to a HR of 1.67 (95% CI 1.54-1.82) in the markedly 11 increased ADG[®] score group. FRAX[®]-based adjustments in models 2, 3 and 4 did not affect the 12 hazard ratios by gradient or direction of increase when applied to the ADG[®] risk scoring groups, 13 demonstrating independence of FRAX®-based factors including competing mortality for both 14 MOF and hip fracture incidence. However, in this combined analysis, increased HRs associated 15 with hospitalization were attenuated by adjustment for FRAX[®] predicted 10-year MOF risk with 16 BMD and eliminated by adjustment for FRAX[®] predicted 10-year MOF risk with BMD and 17 18 competing mortality (p=NS). The pre-specified secondary analyses showed slightly higher 19 adjusted HR when considering patients < age 65 years or men, but using number of hospitalizations in the previous 12 months (rather than 3 years) and further adjustment for 20 diabetes mellitus did not generate any difference in observed HRs (data not shown). 21

The potential clinical implications of a general comorbidity FRAX® risk multiplier is shown in 1 2 Table 5 (ADG[®] scores) and Table 6 (prior hospitalizations). Where an intervention threshold is set at 10-year MOF risk > 20% or 10-year hip fracture risk > 3%, applying HRs for ADG[®] (Table 2, 3 Model 3 FRAX® with BMD and competing mortality) would change the decision to offer anti-4 fracture therapy in 35.8% to 100% of patients with initial 10-year MOF risk 15.0-19.9% and 5 6 39.8% to 75.9% of patients with initial 10-year hip fracture risk 2.0-2.9%. For patients with 7 lower initial predicted risk, even high comorbidity counts rarely reclassified patients to high risk. Overall, 6.4% were reclassified to MOF risk > 20% and 5.6% were reclassified to hip fracture risk 8 > 3%. Age-specific multipliers to adjust FRAX[®] MOF risk for number of past hospitalizations 9 were generated from Model 3 (FRAX[®] model with BMD and competing mortality) that included 10 a significant age*hospitalization interaction term (p-interaction = 0.004); multipliers showed a 11 gradient related to both age (larger in younger patients) and number of prior hospitalizations (12 Figure 1). Once again, almost all the risk reclassification was seen in those with initial 10-year 13 MOF risk 15.0-19.9% (range 20.7% to 67.3%), with overall 1.0% reclassified to MOF risk > 20%. 14 15

16 Discussion

The present study provides clear evidence for a FRAX® and BMD-independent increase in estimated fracture risk according to increasing levels of general medical comorbidity as defined using the ADG® score or multiple prior hospitalizations. The target population for whom a comorbidity multiplier could be most usefully applied includes young patients in whom predicted fracture risk is only slightly below the usual intervention threshold. The impact of the adjustment is substantial with a nearly 30-50% increase in observed fracture risk once a patient

1	reaches a moderate level of associated medical comorbidity. Notably, the increased fracture
2	risk persisted even after adjustment for competing mortality, an important consideration to
3	avoid over-inflation of risk estimates ⁴⁰ . This is especially surprising given that increasing
4	ADG [®] scores themselves predict increased mortality risk ³¹ and so the statistical adjustment
5	confirms the robustness of the findings with relevance to the impact of multi-comorbidity upon
6	fractures occurring prior to comorbidity-predicted death. Although ADG [®] scores are not
7	intended for bedside clinical decision making, a clinician might now choose to consider their
8	more medically complex patients as being at 30-50% higher risk for fracture than estimated
9	from FRAX [®] with BMD alone. On the other hand, number of prior hospitalizations is more
10	reliably assessed in clinical practice and is therefore more amenable to the use of FRAX $^{ m \$}$ risk
11	multipliers. The HR for fracture after hospitalization in our analysis are very similar to those
12	reported previously ³⁹ , suggesting probable agreement on the magnitude of impact that
13	hospitalization has upon incident fracture risk.

14

The use of FRAX[®] fracture risk multipliers is not new; previous population studies have 15 suggested possible adjustments based upon lumbar spine and hip BMD discordance⁴¹, 16 trabecular bone score⁴², glucocorticoid dosage⁴³, diabetes mellitus⁴⁴, type of and time since 17 prior fractures⁴⁵ and frequency of falls⁴⁶. These adjustments for FRAX[®] will shortly be 18 accessible through the FRAX[®] web site under the banner of FRAXplus[®]. It is unknown whether 19 each of these unique and independent additions to FRAX® scores are themselves independent 20 21 from each other. Additionally, there is disagreement as to the value of making certain adjustments based on risk factors such as falls, which may not be amenable to pharmacologic 22

1	fracture prevention strategies ⁴⁷ . Therefore, while it is conceivable that a single risk score
2	adjustment might be considered in uncomplicated cases (e.g., spine-hip T score discordance),
3	adjusted risk estimations become far more uncertain in the presence of multiple potentially
4	relevant additional factors. It is perhaps this type of scenario where a general medical
5	comorbidity index may prove to be of broadest use; with so many newly described independent
6	factors, some are already calling for a new approach to fracture risk estimation ⁴⁸ . In the
7	interim, it is likely unnecessary to be concerned about the precisely-adjusted numeric risk
8	estimate for a given patient unless one is following a treatment strategy whereby patients at an
9	especially high estimated risk threshold are considered for primary anabolic therapy first ⁴⁹ .
10	Rather, the greatest benefit of a comorbidity-adjusted fracture risk estimate may be to help
11	appropriately move patients into a treatment-recommended risk category where such
12	treatment is otherwise not considered based upon FRAX [®] and BMD alone.
13	
14	Other data have demonstrated that general measures of medical comorbidity have a

meaningful albeit imperfect relationship with fracture risk. A Danish study of an older (1987) 15 and newer (2011) version of the Charlson Comorbidity Index had a receiver operating 16 characteristics (ROC) AUC of around 0.6 to predict MOF for both men and women. The authors 17 demonstrated that hip fracture prediction could be slightly improved (AUC 0.72-0.76) with a re-18 19 weighting of certain specific diagnoses (such as dementia, alcoholic liver disease, Parkinson's disease) according to their associated odds ratios for fracture. However, for MOF, a sensitivity 20 21 analysis showed that the inclusion of multiple diagnoses did not outperform an age-only index⁵⁰. The authors commented that such tools may perform better if combined with a risk 22

tool that incorporates variables more immediately associated with osteoporosis. In the same 1 2 population, a different and even more complex medical comorbidity measure (Danish Fracture Risk Evaluation Model, FREM) has been developed as a tool to predict short term (1-year) MOF 3 and hip fractures⁵¹. In a 5-year validation study for that population, the AUC was around 0.71 4 for MOF and 0.83 for hip fracture⁵². The value of the FREM tool in addition to FRAX[®] for 10-year 5 prediction has been recently confirmed in the Canadian population with hazard ratios of 1.05-6 1.49 for higher FREM scores, again with more consistent results in predicting hip fractures 7 compared to MOF and with a significant attenuating effect from competing mortality⁵³. 8 However, the FREM tool is complex and not designed for individual application in routine care⁵⁰ 9 and thus we have chosen to emphasize a more general awareness of comorbidity-related 10 impact upon estimated fracture risk. In our study, the effect of co-morbidity upon fracture risk 11 was greatest in younger individuals, possibly because a major fracture risk modifier will have a 12 larger impact in a background low-risk population. It may also be explained by the effect of 13 adjustment for competing mortality; if the comorbidity predicts death as well as fracture then 14 the full risk increment for fracture alone will appear less, in a 10-year prediction window. 15 16

Other strictly osteoporosis-oriented risk tools exist for fracture risk prediction besides FRAX[®] and some consider fewer risk factors⁷ whereas others consider even more; the QFracture tool being one of the better-known risk estimating tools that accounts for >25 potential factors including a long list of chronic medical conditions⁵⁴. Although one might speculate that a more complex tool such as QFracture may perform better than FRAX[®] in calibration and discrimination, that has not generally been the case⁵⁵. Even where slightly better performance

has been suggested, it may simply be an artifact of the tool construction⁵⁶ and validation study 1 2 design wherein an abundance of lowest-risk younger individuals exaggerates the observed discrimination⁵⁷. The hazards of comparing fracture risk prediction tools by receiver-operator-3 characteristics curves has been highlighted elsewhere⁵⁸. Clearly, there must be a difference 4 when it comes to the prediction of fracture risk, between the medical complexity ADG[®] score 5 6 and the medically complex QFracture tool, given the impressively increased hazard ratios seen independent of FRAX[®] using ADG[®] scores. We suggest that this may be explained by the 7 broader scope of diagnoses included in ADG[®] as well as the "severity" factors built into the 8 ADG[®] model. 9

10

Some have wondered why the predictive AUC is only modest (AUC 0.5-0.7) for most fracture 11 risk models and why more complicated prediction tools seem to offer only minor 12 improvements over simpler ones⁵⁵. Our data, and the data from other FRAX[®]-based risk 13 modifier studies suggest that fracture risk is a multi-factorial set of factors and circumstances; a 14 simplified, general comorbidity adjustment as shown here may represent the most practical 15 way forward to permit capturing the "excess risk" beyond a formal risk tool result, recognizing 16 that it is still just an estimate to facilitate a clinical discussion with individual patients. Indeed, 17 the patient's own view of risk and willingness to accept pharmacotherapy may show significant 18 variation compared to guideline recommendations⁵⁹ so as to add another large element to the 19 overall discussion. 20

Our study had several strengths including the use of a very large population receiving 1 2 comprehensive health care from a single-payer administration and followed over a sufficiently long time. This permitted comprehensive capture of all relevant fracture risks, medical 3 comorbidity conditions and incident fractures. The use of the ADG[®] tool for comorbidity 4 definitions took advantage of the availability of both outpatient and inpatient health 5 encounters and was ideal as a more global index of medical complexity. There were some 6 study limitations; as in many population studies of osteoporosis, men were under-represented 7 as were those using higher dose, prolonged glucocorticoids, both of which may have yielded 8 very different HRs for these subgroups if studied in larger numbers. Another limitation was our 9 categorization of ADG[®] according to baseline status; annualized over the mean of nine years' 10 observation, it is likely that population ADG[®] would change and likely in a direction that 11 favoured a higher proportion of patients moving into the modestly and markedly increased 12 comorbidity groups. However, the impact of population comorbidity shift in this analysis is 13 likely predictable and would suggest that if anything, the fracture hazard ratios might be over-14 estimated for those who remain healthy the entire time whereas the fracture hazard ratios are 15 likely under-estimated for those who start with modest comorbidity and progress to marked 16 comorbidity with age. However, change in BMD over time, while unaccounted for in this 17 18 analysis, is unlikely to have affected the results given the ability of a single BMD to predict long term fracture risk⁶⁰ and the lack of effect upon numeric risk estimates from serial BMD 19 measures⁶¹⁶². Finally, another important caveat is that ADG[®] scores are not available or even 20 intended to be used in individual clinical consultations, although they might still be useful for 21 case finding strategies in healthcare systems with electronic medical records. However, we 22

have shown number of hospitalizations to be a useful multiplier and that would be readily 1 2 available to any clinician. ADG scores certainly could be used in health informatics where a comprehensive clinical electronic record is available. As well, the importance of the analysis 3 here lies in the concept and not necessarily the actual ADG[®] scores; the online FRAX[®] tool 4 already advises users to add clinical judgement when calculating fracture risk. We have 5 demonstrated a general linear relationship between 3 simple tiers of medical comorbidity, and 6 7 it is likely that most clinicians will have sufficient clinical experience to similarly categorize their patients even without ADG[®] scoring. Thus, one only requires knowledge of the risk relationship 8 in order to improve the clinical judgement input already required. 9 Summary 10 Using a comprehensive and validated measure of general medical comorbidity, the ADG[®] score, 11 we have shown that increasing levels of co-morbidity and recent hospitalizations are each 12 associated with a clear gradient effect upon increasing fracture risk and this effect is 13 independent of the other common risk factors captured in FRAX® with BMD. ADG® scores are 14 not feasible or intended to be calculated for individual patients in routine clinical practice, but 15 rather, the general relationship between increasing comorbidity and fracture is the key feature 16 that may inform clinical decision-making. Number of hospitalizations in the past 3 years might 17 18 represent a reasonable way of denoting relevant comorbidity. Using a 20% 10-year fracture 19 risk as a treatment threshold, clinicians should consider upward adjustment of their patient's FRAX®-generated risk estimates by an additional relative 30-50% if moderate-to-severe medical 20 comorbidity is present and baseline risk is between 15-19.9%. 21

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- 14 Leslie declare they have no potential conflicts
- 15 JA Kanis led the team that developed FRAX[®] as director of the WHO Collaborating Centre for
- 16 Metabolic Bone Diseases; he has no financial interest in FRAX[®]. JA Kanis reports no additional
- 17 competing interests.
- 18 EV McCloskey has received consultancy/lecture fees/grant funding/honoraria from AgNovos,
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- 25
- 26 Data availability
- 27 Study data are not publicly available. In order to access data from the Manitoba Population
- 28 Research Data Repository housed at the Manitoba Centre for Health Policy, University of
- 29 Manitoba, an individual must prepare a research proposal, complete an accreditation process,
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- 32

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Table 1: Study population characteristics by ADG score for general medical comorbidity. Data shown includes means with standard deviations or frequency percentage as applicable. ADG, Aggregated Diagnosis Group score, BMD, bone mineral density, MOF, major osteoporotic fracture.

	All subjects,	Reference	Mildly	Moderately	Markedly
	N=86,400	(ADG 0-2),	increased	increased	increased
		N=16,211	(ADG 3-5),	(ADG 6-8),	(ADG >9),
			N=38,039	N=22,760	N=9,390
Age (years)	64.6 (11.0)	62.0 (10.0)	64.4 (10.8)	65.9 (11.2)	66.9 (11.8)
Sex (% female)	90.2%	94.3%	91.2%	88.4%	83.4%
Femoral neck T-score	-1.4 (1.0)	-1.3 (0.9)	-1.3 (1.0)	-1.4 (1.0)	-1.5 (1.1)
FRAX hip fracture risk with BMD (%)	2.4 (3.9)	1.7 (3.0)	2.2 (3.7)	2.7 (4.2)	3.3 (4.7)
FRAX MOF risk with BMD (%)	10.1 (7.2)	8.6 (5.9)	9.9 (6.9)	10.8 (7.6)	11.9 (8.3)
Observation time (years)	9.0 (5.5)	10.1 (5.5)	9.3 (5.5)	8.5 (5.4)	7.6 (5.4)
Incident hip fracture (%)	3.2	2.1	3.0	4.0	4.4
Incident MOF (%)	10.1	7.9	9.6	11.7	13.3
No hospitalization (%) in previous 3	79.9	94.3	86.3	72.2	48.0
years					
1 hospitalization (%)	8.4	1.3	5.8	12.8	20.1
2 hospitalizations (%)	7.1	3.6	5.8	8.9	14.2
≥3 hospitalizations (%)	4.6	0.8	2.2	6.1	17.8
Death (%)	19.9	11.8	18.1	24.0	32.8

Table 2: Study population characteristics by number of hospitalizations in past 3 years as a marker of medical comorbidity. Data shown includes means with standard deviations or frequency percentage as applicable. BMD, bone mineral density, MOF, major osteoporotic fracture

	All subjects,	Reference (no	1 hospitalization,	2 hospitalizations,	\geq 3 hospitalizations,
	N=86,400	hospitalizations),	N=7215	N=6134	4014
		N=69,037			
Age (years)	64.6 (11.0)	64.3 (10.7)	66 (11.8)	65.8 (11.6)	66.1 (12.5)
Sex (female)	90.2%	91.8%	85.1%	85.9%	78.9%
Femoral neck T-	-1.4 (1.0)	-1.3 (1.0)	-1.4 (1.1)	-1.4 (1.0)	-1.6 (1.1)
score					
FRAX hip fracture	2.4 (3.9)	2.1 (3.6)	3.1 (4.6)	3.0 (4.7)	3.9 (5.5)
risk with BMD (%)					
FRAX MOF risk with	10.1 (7.2)	9.7 (6.7)	11.7 (8.3)	11.2 (8.2)	12.7 (9.2)
BMD					
Observation time	9.1 (5.5)	9.4 (5.5)	7.9 (5.2)	8.4 (5.3)	7.4 (5.2)
(years)					
Incident hip	3.2	3.0	3.6	4.5	4.9
fracture (%)					
Incident MOF (%)	10.2	9.7	11.5	12.6	14.2

Adjustment	ADG score	Hospitalizations	ADG score	Hospitalizations			
model, per	HR for MOF	HR for MOF	HR for HF	HR for HF			
comorbidity	(95% CI)	(95% CI)	(95% CI)	(95% CI)			
marker category							
Model 1: age/sex							
Mild increase	1.18 (1.11-1.26)	1.36 (1.27-1.47)	1.25 (1.10-1.41)	1.27 (1.12-1.46)			
Moderate increase	1.48 (1.39-1.59)	1.43 (1.33-1.55)	1.55 (1.36-1.76)	1.60 (1.41-1.82)			
High increase	1.90 (1.76-2.06)	1.82 (1.67-1.99)	1.88 (1.62-2.18)	1.88 (1.62-2.18)			
Model 2: FRAX wi	th BMD						
Mild increase	1.19 (1.11-1.27)	1.24 (1.15-1.34)	1.29 (1.14-1.46)	1.14 (1.00-1.30)			
Moderate increase	1.47 (1.38-1.58)	1.37 (1.27-1.47)	1.59 (1.40-1.81)	1.47 (1.29-1.67)			
High increase	1.82 (1.68-1.97)	1.54 (1.41-1.68)	1.80 (1.55-2.09)	1.40 (1.21-1.63)			
Model 3: FRAX wi	Model 3: FRAX with BMD and competing mortality						
Mild increase	1.13 (1.06-1.21)	1.11 (1.03-1.19)	1.19 (1.06-1.35)	0.95 (0.84-1.09)			
Moderate increase	1.33 (1.24-1.42)	1.20 (1.11-1.29)	1.35 (1.19-1.54)	1.20 (1.05-1.36)			

Table 3: Adjusted Hazard ratios (HR) for incident major osteoporotic fracture (MOF) or hip fracture (HF), <u>separate</u> assessment of ADG score and hospitalizations.

Comorbidity marker categories: ADG score referent = 0-2. ADG mild increase = score 3-5, ADG moderate increase = score 6-9, ADG high increase = score 9+. Hospitalization referent = 0. Hospitalization mild increase = 1, moderate increase = 2, high increase = 3+. Bold numbers denote p < 0.05.

1.20 (1.09-1.31)

1.17 (1.09-1.26)

1.28 (1.19-1.39)

1.66 (1.53-1.81) 1.36 (1.24-1.49)

1.35 (1.16-1.57)

1.23 (1.09-1.40)

1.44 (1.26-1.64)

1.60 (1.37-1.86)

0.99 (0.85-1.15)

1.06(0.93-1.22)

1.41 (1.24-1.60)

1.30 (1.11-1.53)

1.50 (1.38-1.63)

1.16 (1.09-1.24)

1.40 (1.31-1.50)

Model 4: FRAX individual risk factors

High increase

Mild increase

High increase

Moderate increase

FRAX individual risk factors include age, sex, BMI, smoking history, alcohol excess, rheumatoid arthritis, maternal hip fracture, secondary osteoporosis.

	1	1	1	1		
Adjustment	ADG score	Hospitalizations	ADG score	Hospitalizations		
model, per	HR for MOF	HR for MOF	HR for HF	HR for HF		
comorbidity	(95% CI)	(95% CI)	(95% CI)	(95% CI)		
marker category						
Model 1: age/sex						
Mild increase	1.16 (1.09-1.24)	1.20 (1.12-1.30)	1.19 (1.05-1.34)	0.99 (0.86-1.13)		
Moderate increase	1.40 (1.31-1.50)	1.32 (1.22-1.43)	1.37 (1.20-1.56)	1.26 (1.11-1.44)		
High increase	1.67 (1.54-1.82)	1.56 (1.42-1.70)	1.43 (1.22-1.67)	1,21 (1.03-1.41)		
Model 2: FRAX wit	th BMD					
Mild increase	1.17 (1.10-1.25)	1.10 (1.02-1.19)	1.28 (1.13-1.45)	1.02 (0.89-1.16)		
Moderate increase	1.42 (1.33-1.53)	1.26 (1.16-1.36)	1.55 (1.36-1.76)	1.36 (1.19-1.55)		
High increase	1.67 (1.54-1.82)	1.32 (1.20-1.44)	1.68 (1.43-1.96)	1.23 (1.05-1.44)		
Model 3: FRAX wit	th BMD and compet	ting mortality				
Mild increase	1.13 (1.06-1.20)	1.01 (0.93-1.09)	1.20 (1.06-1.36)	0.89 (0.77-1.02)		
Moderate increase	1.31 (1.23-1.41)	1.12 (1.04-1.21)	1.37 (1.20-1.56)	1.14 (1.0-1.30)		
High increase	1.47 (1.35-1.60)	1.06 (0.97-1.16)	1.38 (1.18-1.61)	0.91 (0.78-1.07)		
Model 4: FRAX individual risk factors						
Mild increase	1.16 (1.08-1.23)	1.06 (0.98-1.15)	1.19 (1.05-1.34)	0.86 (0.75-0.99)		
Moderate increase	1.37 (1.28-1.47)	1.20 (1.11-1.30)	1.34 (1.17-1.52)	1.12 (0.98-1.28)		
High increase	1.58 (1.45-1.72)	1.21 (1.10-1.33)	1.33 (1.14-1.56)	0.93 (0.79-1.09)		

for hospitalization numbers and vice versa). ADG, Aggregate Diagnosis Group.

Comorbidity marker categories: ADG score referent = 0-2. ADG mild increase = score 3-5, ADG moderate increase = score 6-9, ADG high increase = score 9+. Hospitalization referent = 0. Hospitalization mild increase = 1, moderate increase = 2, high increase = 3+. Bold numbers denote p < 0.05.

FRAX individual risk factors include age, sex, BMI, smoking history, alcohol excess, rheumatoid arthritis, maternal hip fracture, secondary osteoporosis.

Table 5: Reclassification from ADG scores – (A) percentage of patients with FRAX+BMD predicted 10-year MOF risk of < 20% in whom adjustment for ADG comorbidity level reclassifies 10-year MOF risk to \geq 20%. (B) percentage of patients with FRAX+BMD predicted 10-year hip fracture (HF) risk < 3% in whom adjustment for ADG comorbidity level reclassifies 10-year HF risk to \geq 3%. BMD, bone density, MOF, major osteoporotic fracture, HF hip fracture, ADG, Aggregated Diagnosis Group

FRAX+ BMD 10-year	ADG comorbidity	% of 75,856 patients	% Reclassified to
MOF risk	level	with initial MOF <	MOF risk <u>></u> 20%
		20%	
0 – 4.9%	None	5.8%	0%
	Mild	11.1%	0%
	Moderate	5.8%	0%
	High	2.1%	0%
5.0-9.9%	None	9.1%	0%
	Mild	19.9%	0%
	Moderate	11.2%	0%
	High	4.2%	0%
10.0-14.9%	None	3.4%	0%
	Mild	9.3%	0%
	Moderate	5.8%	0%
	High	2.5%	26.4%
15.0-19.9%	None	1.4%	0%
	Mild	4.2%	35.8%
	Moderate	2.9%	98.6%
	High	1.4%	100.0%
FRAX+ BMD 10-year	ADG comorbidity	% of 63,958 patients	% Reclassified to HF
HF risk	level	with initial HF risk <	risk <u>></u> 3%
		3 %	
0 – 0.9%	None	14.6%	0%
	Mild	29.7%	0%
	Moderate	15.9%	0%
	High	5.7%	0%
1.0-1.9%	None	4.2%	0%
	Mild	9.9%	0%
	Moderate	5.7%	0%
	High	2.3%	0%
2.0 - 2.9%	None	2.0%	0%
	Mild	5.3%	39.8%
	Moderate	3.3%	73.0%
	High	1.4%	75.9%

Table 6: Reclassification from prior hospitalizations – percentage of patients with FRAX+BMD predicted 10-year MOF risk of < 20% in whom adjustment for number of previous hospitalizations reclassifies 10-year MOF risk to > 20%. BMD, bone density, MOF, major osteoporotic fracture.

FRAX+ BMD 10-year	Hospitalization	% of 75,856 patients	% Reclassified to
	events	20%	
0 – 4.9%	None	20.6%	0%
	1	1.8%	0%
	2	1.6%	0%
	≥3	0.9%	0%
5.0-9.9%	None	36.6%	0%
	1	3.3%	0%
	2	2.9%	0%
	≥3	1.6%	0%
10.0-14.9%	None	16.5%	0%
	1	1.9%	0%
	2	1.5%	0%
	≥3	1.1%	2.9%
15.0-19.9%	None	7.4%	0%
	1	1.0%	20.7%
	2	0.8%	39.0%
	≥3	0.6%	67.3%



Figure 1: MOF Risk multiplier according to age categories and number of hospitalizations in the preceding 36 months; estimates based upon baseline FRAX plus BMD-estimated risk of MOF and with competing mortality. MOF, major osteoporotic fracture

