Web Material

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hospitalizatio	ns in the ARIC HF surveillance					
ICD Code	Disease Classification					
398.91	Rheumatic heart disease					
402.01	Hypertensive heart disease-malignant with CHF					
402.11	Hypertensive heart disease-benign with CHF					
402.91	Unspecified hypertensive heart disease with CHF					
404.01	Hypertensive heart disease and renal failure-malignant with CHF					
404.03	Hypertensive heart disease and renal failure-malignant with congestive heart and renal failure					
404.11	Hypertensive heart disease and renal failure-benign with CHF					
404.13	Hypertensive heart disease and renal failure-benign with congestive heart and renal failure					
404.91	Hypertensive heart disease and renal failure-unspecified with CHF					
404.93	Hypertensive heart disease and renal failure-unspecified with congestive heart and renal failure					
415	Acute cor pulmonale					
416.9	Chronic pulmonary heart disease, unspecified					
425.4	Other primary cardiomyopathies					
428.x	CHF					
518.4	Acute edema of lung, unspecified abnormalities					
786.0x	Dyspnea and respiratory					
CHF, congest Revision, Clin	CHF, congestive heart failure; ICD-9-CM, International Classification of Diseases, Ninth Revision, Clinical Modification.					
The same coc and the Natio	des were used in both the Atherosclerosis Risk in Community Study surveillance anal Inpatient Sample.					

surveillance and the National Inpatient Sample database				
Heart valve disorder	424.0, 424.1, 424.2, 424.3, 424.90, 424.91, 424.99,			
	785.2, 785.3, V42.2 V43.3			
Atrial fibrillation/atrial flutter	427.31, 427.32			
Cardiac dysrhythmias (not AF or atrial	427.0, 427.1, 427.2, 427.9, 427.60, 427.41, 427.42,			
flutter)	427.5, 427.61, 427.69, 427.81, 427.89, 427.9, 785.0,			
	785.1			
Conduction disorder	426.0, 426.10, 426.11, 426.12, 426.13, 426.2, 426.3,			
	426.4, 426.50, 426.51, 426.52, 426.53, 426.54, 426.6,			
	426.7, 426.81, 426.82, 426.89, 426.9, V45.0, V45.00			
Acute myocardial infarction	410 xx			
disease	411.0, 411.1, 411.8, 411.81, 411.89, 412 413.0, 413.1,			
uisease	415.9, 414.0, 414.00, 414.01, 414.06, 414.2, 414.5, 414.4 414.8 414.9 V458.1 V458.2			
Chronic kidney disease	585.0. 585.1. 585.2. 585.3. 585.4. 585.5. 585.6. 585.9.			
	792.5, V42.0, V45.1, V45.11, V45.12, V56.0, V56.1,			
	V56.2, V56.31, V56.32, V56.8			
Acute kidney injury	584.5, 584.6, 584.7, 584.8, 584.9, 586			
COPD exacerbation	491.21, 491.22, 494.1			
Pneumonia	480.x, 481.x, 482.x, 483.x, 484.x, 485.x, 486.x			
Other fluid and electrolyte disorders	276.0, 276.2, 276.3, 276.4, 276.6, 276.69, 276.9, 995.1			
Anemia	285.21, 285.29, 285.9			
Hypertension	401.x			
AF, atrial fibrillation; COPD, chronic obstructiv	e pulmonary disease; ICD-9-CM, International			
Classification of Diseases, Ninth Revision, Clini	ical Modification.			
The same codes were used in both the Athero	osclerosis Risk in Community Study surveillance and the			
Chronic kidney disease Acute kidney injury COPD exacerbation Pneumonia Other fluid and electrolyte disorders Anemia Hypertension AF, atrial fibrillation; COPD, chronic obstructiv <i>Classification of Diseases, Ninth Revision, Clini</i> The same codes were used in both the Athero	413.5, 414.0, 414.00, 414.01, 414.06, 414.2, 414.3, 414.4, 414.8, 414.9, V458.1, V458.2 585.0, 585.1, 585.2, 585.3, 585.4, 585.5, 585.6, 585.9, 792.5, V42.0, V45.1, V45.11, V45.12, V56.0, V56.1, V56.2, V56.31, V56.32, V56.8 584.5, 584.6, 584.7, 584.8, 584.9, 586 491.21, 491.22, 494.1 480.x, 481.x, 482.x, 483.x, 484.x, 485.x, 486.x 276.0, 276.2, 276.3, 276.4, 276.6, 276.69, 276.9, 995.1 285.21, 285.29, 285.9 401.x <i>re</i> pulmonary disease; ICD-9-CM, <i>International</i> <i>ical Modification</i> . psclerosis Risk in Community Study surveillance and the			

Web Table 2. Description of ICD codes used to define comorbidities in both ARIC heart failure

National Inpatient Sample. The codes are similar to those suggested by National Inpatient Sample clinical classification software.

	428 Pi (n = 2	428 Primary (n = 2083)		nprimary 6936)	428 A (n = 3	bsent 3431)
	%	PPV	%	PPV	%	PPV
Eligible codes	I					_
428 in primary position	100	90			0	
428 in second position	0		28	38	0	
428 in position 3–26	0		72	30	0	
428 absent	0		0		100	16
Rheumatic HF	0		0	80	6	68
Hypertensive HF	1	95	4	55	0	56
Renal HF	1	89	4	59	1	58
Pulmonary HF	1	100	1	52	5	20
Cardiomyopathy	17	92	11	44	42	12
Pulmonary edema	0	100	0	76	4	61
Respiratory distress	3	93	3	48	41	8
Comorbid conditions	0		0		0	
Atrial fibrillation	37	93	35	38	26	21
Cardiac dysrhythmia	16	92	16	40	18	16
Conduction disorder	11	91	10	44	9	18
Myocardial infarction	4	97	8	61	4	37
COPD	9	86	12	44	8	14
Other characteristics	0		0		0	
Race	0		0		0	
Caucasian	57	90	60	32	64	14
NonCaucasian	43		38		32	
Sex	0		0		0	
Female	49	89	52	31	46	17
Male	51	91	47	34	51	16
Teaching hospital status	0		0		0	
Teaching	33	92	38	32	30	19
Nonteaching	66	89	61	31	68	15
Age group, years	0		0		0	
55-64	22	90	22	32	29	16
65-74	25	89	26	31	28	14
>75	51	90	53	32	43	18

WEB APPENDIX

1. Derivation of model to predict ADHF probability from the ARIC HF surveillance

Additional details regarding derivation of the validation models as well as additional results from model-building are provided here.

Models were developed separately for the three ICD code 428 code groups: 428 primary, nonprimary, and absent (non428 eligible ICD codes). We used a structured approach to build multivariate logistic regression models to predict the probability of ADHF. All models included age, race, sex, and teaching hospital status. We collapsed certain groups of HF codes defining conceptually similar and low prevalent conditions such as hypertensive heart failure, hypertensive-renal heart failure, rheumatic heart failure, pulmonary heart failure etc. into an 'other heart failure group'. We then identified comorbidities that are common in patients with heart failure (coronary atherosclerosis, chronic kidney disease, electrolyte imbalance-hyponatremia), those that may precipitate ADHF (atrial fibrillation, acute myocardial infarction), or may represent a treatment complication (acute kidney injury) and considered those with > 5% prevalence in at least one of the three ICD code 428 groups.

Model selection was conducted to achieve adequate model fit, discrimination and calibration while minimizing model complexity to avoid over-fitting. Variables defining presence of HF codes, position of the 428 code (second position vs. 3-26 included in the ICD code 428 nonprimary group only) and comorbidity codes were selected using a forward stepwise procedure (Wald test *P* value < 0.20) and then eliminated in a stepwise fashion until measures of model fit, discrimination and calibration (Hosmer-Lemeshow, AUC and Integrated discrimination improvement [IDI], respectively) were impacted. See Supplementary Tables 5a-c for a summary of the results. In these reduced models, we replaced comorbidity in any position variables with two code position variables (primary vs. nonprimary) to test the significance of code position. Position variables were kept only if both were significant (Wald *P* value < 0.20); otherwise the presence variable was maintained in the model. We also examined Arjas plots to assess final model fit (Supplementary Figure 2).

To assess internal validity of the final models, we examined AUC and calibration slope corrected for optimism (1000 bootstrap samples).^{12,13}. We fitted models with interaction terms and examined Arjas plots in subgroups to assess consistency of model fit across ARIC community and study year.

Final models with optimism-corrected statistics are presented in Supplementary Tables 6a-c, ROC curves are presented in Supplementary Figure 1 and Arjas plots are presented in Supplementary Figures 2-4.

2. Variance of the Estimator of ADHF Hospitalizations Count and Rate

We applied the ADHF validation models derived in ARIC to NIS data to estimate the total number of ADHF hospitalizations. Population estimates were then used to calculate rates. The count estimator and derivation of the variance of the count estimator are presented here as well as the variance of the rate estimator.

The count estimator is composed of the sum of validation model-based predicted probabilities restricted to the domain defined by inclusion criteria described in Figure 1, summed over NIS strata, sampled hospitals within strata and hospitalizations within sampled hospitals. The validation model applied differs by ICD code 428 code group (primary, nonprimary, absent).

The set of NIS strata is $A = \{1, ..., a, ..., N_A\}$, the set of hospitals in stratum *a* is $U_{aI} = \{1, ..., i, ..., N_{aI}\}$ and the set of hospitalizations in stratum a, hospital *i* is $H_{ai} = \{1, ..., k, ..., N_{aiH}\}$. The inclusion probability for hospital *i* from stratum *a* is π_{ai} and the set of sampled hospitals is S_a .

The estimator of the number of ADHF hospitalizations for domain D is therefore given in Equation (1).

$$\hat{T}_{D} = \sum_{a=1}^{N_{A}} \sum_{i=1}^{N_{aI}} \sum_{k=1}^{N_{aiH}} \pi_{ai}^{-1} I(i \in S_{a}) \ I(k \in D) \operatorname{logit}^{-1}(x_{aik}\hat{\beta}_{c} | c, x_{aik})$$
(1)

where *D* is the domain satisfying inclusion criteria described in Figure 1. NIS data and logistic regression coefficient estimates from the ARIC validation model used to calculate predicted probabilities are represented by the vectors x_{aik} and $\hat{\beta}_c$, respectively. ICD code 428 code group is represented by *c*. I(z) is an indicator variable taking on the value 1 when *z* is true, 0 otherwise.

The variance of the estimate in (1) is therefore given by (2):

$$\operatorname{Var}(\widehat{T}_D) = \operatorname{E}\{\operatorname{Var}(\widehat{T}_D \mid \widehat{\beta}) + \operatorname{Var}\{\operatorname{E}(\widehat{T}_D \mid \widehat{\beta})\}$$
(2)

Since $\hat{\beta}$ is an unbiased estimate, $E\{Var(\hat{T}_D | \hat{\beta})\} = Var(\hat{T}_D | \beta)$.

To calculate Var $(\hat{T}_D | \beta)$, let the number of estimated ADHF hospitalizations for domain *D* in hospital *I* and stratum *a*, be represented by t_{aiD} defined in (3).

$$t_{aiD} = \sum_{k=1}^{N_{aiH}} I(k \in D) \log it^{-1}(x_{aik}\beta_c | c, x_{aik})$$
(3)

Then the variance of \hat{T}_D given β is defined in (4).

$$\operatorname{Var}(\hat{T}_{D} | \beta) = \sum_{a=1}^{A} \sum_{i=1}^{N_{aI}} \sum_{j=1}^{N_{aI}} \frac{\pi_{aij} - \pi_{ai} \pi_{ai}}{\pi_{aij}} \frac{t_{aiD}}{\pi_{ai}} \frac{t_{ajD}}{\pi_{aj}}$$
(4)

where $\pi_{aij} = Pr(hospital \ i \text{ and } hospital \ j \text{ in stratum } a \text{ are both selected}).$

Denote \tilde{t}_{aiD} as $\sum_{k=1}^{N_{aiH}} I(k \in D) \operatorname{logit}^{-1}(x_{aik}\hat{\beta}_{y_k} | y_k, x_{aik})$, and

$$\widehat{\operatorname{Var}}(\widehat{T}_{D} | \beta) = \sum_{a=1}^{A} \sum_{i=1}^{N_{al}} \sum_{j=1}^{N_{al}} \frac{\pi_{aij} - \pi_{ai} \pi_{ai}}{\pi_{aij}} \frac{\widetilde{t}_{aiD}}{\pi_{ai}} \frac{\widetilde{t}_{ajD}}{\pi_{aj}} .$$
(5)

Note: in the case of simple random cluster sampling (as in NIS),

$$\pi_{ai} = \frac{n_{as}}{N_{al}}$$

$$\pi_{aij} = \pi_{ai}, \text{ if } i = j$$

$$\pi_{aij} = \frac{n_{as} (n_{as} - 1)}{N_{al} (N_{al} - 1)}, \text{ if } i \neq j$$

Where n_{as} is the number of selected hospitals in stratum *a* and N_{aI} is the number of all hospitals in stratum *a*.

For the second term in (2),

$$\mathbb{E}(\hat{T}_{D} | \hat{\beta}) = \sum_{a=1}^{N_{A}} \sum_{i=1}^{N_{aI}} \sum_{k=1}^{N_{aiH}} I(k \in D) \operatorname{logit}^{-1}(x_{aik} \hat{\beta}_{c} | c, x_{aik}).$$
(6)

To estimate the variance of (6) we apply the delta method to the asymptotic distribution of $\hat{\beta}$:

$$\widehat{\operatorname{Var}}\{\mathrm{E}(\widehat{T}_{D} | \widehat{\beta})\} = \sum_{c=1}^{3} f(\widehat{\beta}_{c}) \operatorname{AV}(\widehat{\beta}_{c}) f(\widehat{\beta}_{c})^{T}$$
(7)

Where the vector function of $\hat{\beta}_c$, $f(\hat{\beta}) = \sum_{a=1}^{N_A} \sum_{i=1}^{N_{al}} \sum_{k=1}^{N_{aiH}} I(k \in D \text{ and } k \in c) x_k \frac{\exp(x_{aik}\hat{\beta}_c)}{\{1 + \exp(x_{aik}\hat{\beta}_c)\}^2}$,

and $AV(\hat{\beta}_c)$ is the asymptotic covariance matrix of $\hat{\beta}_c$.

Thus, by combining the variance estimates in (5) and (7), we obtain the variance estimate of \hat{T}_D :

$$\widehat{\text{Var}}(\widehat{T}_{D}) = \sum_{a=1}^{A} \sum_{i=1}^{N_{al}} \sum_{j=1}^{N_{al}} \frac{\pi_{aij} - \pi_{ai}\pi_{ai}}{\pi_{aij}} \frac{\widetilde{t}_{aiD}}{\pi_{ai}} \frac{\widetilde{t}_{ajD}}{\pi_{aj}} + \sum_{c=1}^{3} f(\widehat{\beta}_{c}) \text{AV}(\widehat{\beta}_{c}) f(\widehat{\beta}_{c})^{T}$$

The rate estimator is simply the count estimator divided by the corresponding inter-censal population estimate. For the variance calculation, the population estimate is treated as fixed.

428 in primary position	428 In primary position							
Variable	Basic Model	Optimal Model	Extended Model					
Wald test P values								
Age group	0.803	0.609	0.549					
Male	0.318	0.410	0.314					
Caucasian	0.540	0.961	0.908					
Teaching hospital	0.110	0.091	0.115					
Heart valve disorder		< 0.001	< 0.001					
Acute myocardial infarction		0.002	0.002					
Atrial fibrillation		0.004	0.005					
Chronic kidney disease		0.003	0.016					
COPD exacerbation			0.110					
Anemia			0.143					
Measures of model fit, discrimination	on and calibration							
Hosmer-Lemeshow P value	0.906	0.371	0.711					
AUC	0.557	0.652	0.655					
IDI		0.042 (0.01)*	0.00 (0.01) ⁺					
\pm 1 a b b b b b c b b b b b b b b b c b b b c c b b b c c b b b c c b b b c c b b b c c b b c c c b b c c c b c c c c c c c c c c		1						

Web Table 4. Results of model selection to predict ADHF among those hospitalizations with ICD code 428 in primary position

The basic model includes variables forced into all models.

The reduced model includes variables selected through forward stepwise procedure (Wald *P* value < 0.20) and excludes those eliminated through consideration of model fit, discrimination and calibration. The reduced model forms the basis for final validation models (after consideration of position of HF codes).

The extended model includes all variables selected through forward stepwise procedure (Wald P value < 0.20).

^{*} Compared to basic model.

[†] Compared to optimal model.

428 in nonprimary position								
Variable	Basic Model	Optimal Model	Extended Model					
Wald test P values								
Age group	0.682	0.327	0.303					
Male	0.019	0.229	0.239					
Caucasian	0.391	0.715	0.783					
Teaching hospital	0.300	0.002	0.002					
Acute myocardial infarction		<0.001	<0.001					
Other heart failure		<0.001	<0.001					
Pneumonia		<0.001	<0.001					
Heart failure code in 2nd position		<0.001	<0.001					
Acute kidney injury		<0.001	<0.001					
Atrial fibrillation		<0.001	<0.001					
Chronic obstructive pulmonary		<0.001	<0.001					
disease								
Heart valve disorder		<0.001	<0.001					
Cardiomyopathy		<0.001	<0.001					
Other fluid and electrolyte disorders		<0.001	<0.001					
Dyspnea and respiratory		<0.001	<0.001					
abnormalities								
Uncomplicated hypertension		<0.001	0.006					
Conduction disorder		0.002	0.002					
Cardiac dysrhythmias (not AF or atrial		0.005	0.005					
flutter)								
Chronic kidney disease			0.182					
Measures of model fit, discrimination a	nd calibration							
Hosmer-Lemeshow P value	0.636	0.109	0.246					
AUC	0.513	0.727	0.726					
IDI		0.063 (0.002) ^a	0.001 (0.002) ^b					
The basic model includes variables force	The basic model includes variables forced into all models.							

Web Table 5. Results of model selection to predict ADHF among those hospitalizations with ICD code

The reduced model includes variables selected through forward stepwise procedure (Wald P value < 0.20) and excludes those eliminated through consideration of model fit, discrimination and calibration. The reduced model forms the basis for final validation models (after consideration of position of HF codes).

The extended model Includes all variables selected through forward stepwise procedure (Wald P value < 0.20).

^{*} Compared to basic model.

[†] Compared to optimal model.

absent with other eligible codes							
Variable	Basic Model	Reduced Model	Extended Model				
Wald test P values							
Age group	0.066	0.099	0.075				
Male	0.617	0.419	0.309				
Caucasian	0.490	0.707	0.605				
Teaching hospital	0.005	0.020	0.021				
Other heart failure		<0.001	<0.001				
Acute myocardial infarction		< 0.001	<0.001				
Chronic kidney disease		<0.001	<0.001				
Other fluid and electrolyte disorders		< 0.001	<0.001				
Atrial fibrillation		0.002	0.002				
Cardiomyopathy in primary position		0.002	0.003				
Coronary atherosclerosis or other heart							
disease			0.049				
Measures of model fit, discrimination and c	alibration						
Hosmer-Lemeshow P value	0.362	0.018	0.159				
AUC	0.548	0.799	0.800				
IDI		0.147 (0.004)*	0.002 (0.003) ⁺				
The basic model includes variables forced in	nto all models						

Web Table 6. Results of model selection to predict ADHF among those hospitalizations with ICD code 428

s variables forced into all models.

The reduced model includes variables selected through forward stepwise procedure (Wald P < 0.20) and excludes those eliminated through consideration of model fit, discrimination and calibration. The reduced model forms the basis for final validation models (after consideration of position of HF codes).

The extended model Includes all variables selected through forward stepwise procedure (Wald *P* < 0.20). ^{*} Compared to basic model.

[†] Compared to reduced model.

			5 2040)		2014)	
		ARIC (200 Weighted /	15-2010) 1 = 52 065	NIS (1998–2011) Weighted n = 57 Million		
Code	Description	Primary	Anv	Primary	Anv	
		Position	Position	Position	Position	
428	HF	19.47	89.46	22.00	87.88	
398	Rheumatic HF	0	4.62	0.02	1.62	
402	Hypertensive HF	0.21	4.71	0.13	3.38	
404	Renal HF	0.16	2.6	0.10	1.97	
415/416	Acute/chronic pulmonary heart disease	0.16	5.41	0.28	1.85	
425	Cardiomyopathy	2.96	10.45	3.72	14.78	
518	Acute lung edema	0.01	0.74	0.01	0.40	
786	Dyspnea and respiratory	0.51	2.88	0.26	3.83	
Total*		23.49	120.87	26.52	115.70	
*Some ho ADHF, acu	ospitalizations had more than one el ute decompensated heart failure; Af Database	igible code. RIC, Atheroscler	osis Risk In Co	ommunities; NI	S, National	

National Inpatient Sample						
	ARIC (2005–2010)	NIS (1998–2011)				
n (weighted)	12,450 (52065)	11.6M (57.0M)				
Age group, y						
55-64	0.20	0.16				
65-74	0.25	0.25				
≥ 75	0.55	0.60				
Male	0.45	0.45				
Caucasians ⁺	0.72	0.60**				
Heart valve disorder	0.13	0.14				
Rheumatic HF	0.01	0.02				
Hypertension	0.45	0.40				
Hypertensive HF	0.03	0.03				
Diabetes	0.45	0.36				
Coronary atherosclerosis	0.50	0.48				
Acute myocardial infarction	0.07	0.08				
Cardiomyopathy	0.15	0.15				
Atrial fibrillation	0.27	0.34				
Other arrhythmias (non-AF)	0.16	0.13				
Conduction disorders	0.10	0.14				
Chronic kidney disease	0.29	0.15				
Acute kidney injury	0.19	0.12				
Fluid and electrolyte disorder	0.10	0.06				
Renal HF	0.03	0.02				
Dyspnea and respiratory abnormalities	0.07	0.04				
COPD exacerbation	0.11	0.10				
Pneumonia	0.18	0.16				
Pulmonary heart disease	0.02	0.02				
Anemia	0.25	0.16				
Teaching hospital	0.37	0.40				

Web Table 8. Characteristics of heart failure eligible* hospitalizations in ARIC ADHF surveillance and National Inpatient Sample

Abbreviations: ADHF, acute decompensated heart failure; AF, atrial fibrillation; ARIC, Atherosclerosis Risk in Communities; COPD, chronic obstructive pulmonary disease; HF, heart failure.

^{*} Eligible sample of hospitalizations among age ≥55 years are defined by hospital ICD codes as detailed in methods and Web Table 1.

⁺ Estimated among those with nonmissing values as race is missing for 23% hospitalizations in the NIS.

Web Table 9. Multivariable model to predict ADHF among hospitalizations with ICD code 428						
in primary position						
	Beta Coefficient	Odds Ratio	95	% CI	P Value	
Intercept	1.683				<.0001	
Age 65-74 years vs. 55-64 years	-0.222	0.80	0.49	1.32	0.38	
Age 75 years or older vs. 55-64 years	-0.225	0.80	0.50	1.27	0.35	
Females vs. male	0.145	1.16	0.82	1.64	0.41	
Caucasians vs. others	-0.009	0.99	0.68	1.49	0.96	
Teaching vs. nonteaching hospital	0.351	1.42	0.95	2.12	0.09	
Heart valve disorder	1.166	3.21	1.86	5.52	<.0001	
Chronic kidney disease	0.609	1.84	1.24	2.74	< 0.01	
Acute myocardial infarction	2.258	9.57	2.24	40.84	< 0.01	
Atrial fibrillation	0.574	1.78	1.20	2.64	<0.01	
Optimism-corrected AUC = 0.631	Optimis	sm-corrected c	alibrati	on slope	= 0.864	

Web Table 10. Multivariable model to predict ADHF among hospitalizations with ICD code 428 in nonprimary position

	Beta	Odds Ratio	95% CI		P Value
Intercent					< 0001
Age $65-74$ years vs. $55-64$ years	-1.554	0.88	0 73	1.06	0.17
Age 75 years or older vs. 55-64 years	-0.131	0.88	0.75	1.00	0.17
Age 75 years of older vs. 55-04 years	-0.095	1.06	0.77	1.00	0.29
	0.002	1.00	0.94	1.21	0.54
Caucasians vs. others	0.001	0.99	0.88	1.15	0.99
Teaching vs. nonteaching hospital	0.215	1.24	1.08	1.42	<0.01
Acute myocardial infarction	1.424	4.16	3.24	5.32	<.0001
Other heart failure in primary position	2.961	19.31	12.22	30.52	<.0001
Other heart failure in nonprimary position	0.642	1.90	1.48	2.43	<.0001
Pneumonia	0.743	2.10	1.79	2.47	<.0001
Heart failure code 428 in 2nd position	0.771	2.16	1.87	2.49	<.0001
Acute kidney injury	0.522	1.69	1.45	1.96	<.0001
Atrial fibrillation	0.416	1.52	1.33	1.74	<.0001
Chronic obstructive pulmonary disease	0.644	1.90	1.58	2.29	<.0001
Heart valve disorder	0.477	1.61	1.33	1.95	<.0001
Cardiomyopathy	0.501	1.65	1.35	2.02	<.0001
Other fluid and electrolyte disorders	0.417	1.52	1.25	1.85	<.0001
Dyspnea and respiratory abnormalities	1.478	4.38	2.21	8.69	<.0001
primary					
Dyspnea and respiratory abnormalities	0.591	1.81	1.18	2.76	<0.01
nonprimary					
Uncomplicated hypertension	-0.253	0.78	0.68	0.89	<0.001
Conduction disorder	0.310	1.36	1.17	1.67	<0.01
Cardiac dysrhythmia (not AF or atrial	0.252	1.29	1.09	1.53	<0.01
flutter)					
Optimism-corrected AUC = 0.734		Optimism-	corrected ca	alibration s	lope = 1.00

absent with other eligible codes						
	Beta	Odds Patio	05	الا	Р	
	Coefficient			% CI	Value	
Intercept	-2.904				<.0001	
Age 65-74 years vs. 55-64 years	-0.396	0.67	0.47	0.97	0.03	
Age 75 years or older vs. 55-64 years	-0.262	0.77	0.54	1.09	0.14	
Females vs. male	-0.021	0.98	0.75	1.28	0.88	
Caucasians vs. others	-0.004	1.03	0.79	1.35	0.98	
Teaching vs. nonteaching hospital	0.291	1.34	1.01	1.77	0.04	
Other heart failure in primary position	4.469	87.29	43.96	173.30	<.0001	
Other heart failure in nonprimary position	1.888	6.61	4.70	9.30	<.0001	
Acute myocardial infarction	1.322	3.75	2.37	5.92	<.0001	
Chronic kidney disease	0.701	2.02	1.48	2.75	<0.001	
Other fluid and electrolyte disorders	0.849	2.34	1.62	3.37	<.01	
Atrial fibrillation	0.455	1.58	1.19	2.08	<0.01	
Cardiomyopathy in primary position	1.581	4.86	2.49	9.48	< 0.001	
Cardiomyopathy in nonprimary position	0.361	1.44	1.03	2.00	0.03	
Optimism-corrected AUC = 0.807	Optimi	sm-corrected c	alibratio	n slope =	1.03	

Web Table 11. Multivariable model to predict ADHF among those hospitalizations with ICD code 428 absent with other eligible codes

Web Figure 1. Area under the receiver operating characteristic (ROC) curve (AUC) for risk score to predict hospitalized ADHF with predictors that include age, sex, teaching hospital status, and comorbidity defined with discharge codes for 428 primary (A), nonprimary (B), and absent (C).



Web Table 12. Frequency of hospitalization by ICD-9-CM code 428 group							
	Code 428 ir	Code 428 in Primary Code 428 in Nonprimary		Code 4	Code 428		
Year	Posit	ion	Pos	ition	Abser	nt	
	Frequency	SD	Frequency	SD	Frequency	SD	
1998	890962	34535	2189319	88402	567203	24827	
1999	868367	34115	2190989	89011	553378	24457	
2000	895087	35014	2296143	94560	565858	24324	
2001	916546	35887	2379843	96417	596250	25758	
2002	913181	36710	2502076	103384	557740	24176	
2003	964841	39065	2734050	112220	426636	17873	
2004	944326	37776	2832909	115963	394506	17061	
2005	929129	37709	2928677	120616	421119	19224	
2006	923017	37926	2974077	122685	458451	21310	
2007	860950	34604	2868838	116465	466020	20548	
2008	869330	35320	2842275	117832	533613	24845	
2009	880859	36794	2860827	120034	488718	22745	
2010	841580	34792	2874857	120209	430999	18955	
2011	850855	34708	3097806	131097	455369	20509	
ADHF,	acute decomp	pensated he	art failure; ICD	-9-CM, Internati	onal Classifica	tion of	
Diseas	ses, Ninth Revis	sion, Clinica	l Modification;	SD, standard de	viation.		
Data f	rom the Natio	nal Inpatien	t Sample.				

rates, estimated ADHF, and estimated ADHF rate by ICD-9-CM code 428 group								
		1998–2004	2005-2011					
		Annual % change (95% CI)						
Hospitalizations								
	Primary	1.4 (0.8, 2.1)	-1.5 (-2.2, -0.8)					
	Nonprimary	4.6 (3.7, 5.4)	0.3 (-0.8, 1.2)					
	Absent	-6.5 (-10.1, -4.5)	0.6 (-2.4, 2.3)					
Hospitalization rate								
	Primary	-0.7 (-1.3, -0.1)	-4.2 (-4.8, -3.5)					
	Nonprimary	2.4 (1.8, 3.1)	-2.5 (-3.4, -1.5)					
	Absent	-8.5 (-11.6, -5.4)	-2.2 (-4.5, 0.2)					
Estimated ADHF								
	Primary	1.5 (0.9, 2.9)	-1.2 (-1.8, -0.5)					
	Nonprimary	5.8 (4.6, 7.1)	0.6 (-1.0, 2.1)					
	Absent	-17.2 (-21.9, -12.1)	-8.9 (-13.2, -4.4)					
	Total	2.0 (1.6, 2.5)	-0.5 (-1.4, 0.3)					
Estimated ADHF rate								
	Primary	-0.7(-1.2, -0.1)	-3.9(-4.5, -3.3)					
	Nonprimary	3.6 (2.6, 4.7)	-2.2(-3.7, -0.7)					
	Absent	-19.0 (-23.8, -14 .0)	-11.4 (-15.6, -7.0)					
	Total	-0.1(-0.6, 0.3)	-3.2 (-4.1, -2.4)					
Estimates were based on I	National Inpatient Sa	mple of hospitalizations with	ICD code 428.xx in the					

Web Table 13. Annual percentage change in the estimates for hospitalizations, hospitalization

primary position, vs. nonprimary position, vs. other absent with other eligible ICD code. ADHF frequency and rates are based on estimations using validated models in the ARIC study. US Census data were used for estimation of rates. Figure 3 shows the trends. CI, confidence interval.

Web Table 14. Estimated ADHF hospitalizations by ICD-9-CM codes 428 groups and overall											
Year	Code 428 in Primary Position		Code 428 in Nonprimary Position		Code 428 Absent		Total				
	Frequency	SD	Frequency	SD	Frequency	SD	Frequency	SD			
1998	791297	31056	632198	26633	212324	10372	1635819	64967			
1999	771369	30695	641004	27459	195154	9557	1607527	64867			
2000	793680	31465	666960	28893	194341	9356	1654981	66997			
2001	813457	32255	693758	29665	198836	9535	1706050	68857			
2002	811669	33027	745516	32418	174935	8370	1732119	71702			
2003	859092	35189	850516	36323	94614	4584	1804223	74271			
2004	841276	34034	879857	37458	82981	4190	1804115	73973			
2005	830608	34163	915668	39892	89447	5023	1835723	77273			
2006	832442	34623	942714	40849	101516	5705	1876672	79151			
2007	781585	31755	909107	39013	102259	5152	1792950	74071			
2008	788655	32367	865644	37916	107813	5838	1762112	74079			
2009	801146	33806	894866	39611	80416	4184	1776427	76107			
2010	767130	32011	911541	40057	59579	2894	1738251	73646			
2011	777056	32009	1005922	44911	63915	3235	1846892	78651			
ADHF, acute decompensated heart failure; ARIC, Atherosclerosis Risk in Communities; ICD-9-CM, International Classification of Diseases, Ninth Revision, Clinical Modification; SD, standard deviation.											
Estimates were obtained by application of models derived in an ARIC ADHF validation study to the National											

Inpatient Sample.

WEB FIGURES 2 AND 3



Web Figure 2. Predicted versus observed probability of acute decompensated heart failure (ADHF) hospitalization by decile of risk scores derived for 428 primary (A), nonprimary (B), and absent (C), separately.



Web Figure 3. Comparison of hospitalizations with ICD-9-CM code 428 primary with acute decompensated heart failure (ADHF) in the United States during 1998–2011, by age group. Panels show discharge code 428 in primary position (A), estimated ADHF hospitalizations (B), and corresponding rates per 1000 persons for 428 primary (C), and estimated ADHF (D). Trends for 1998–2004 and 2005–2011 are shown as annual percent change.