

## ORIGINAL ARTICLE

# Clinical and economic burden of diabetic foot ulcers: A 5-year longitudinal multi-ethnic cohort study from the tropics

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## Abstract

Diabetic foot ulcers (DFUs) present a substantial clinical and economic burden to healthcare systems around the world, with significant reductions in quality of life for those affected. We aimed to analyse the clinical and economic burden of DFU via a 5-year longitudinal multi-ethnic cohort study. A longitudinal analysis of inpatient and outpatient DFUs data over 5 years from a university tertiary hospital in Singapore was performed. Data included baseline characteristics, clinical outcomes, hospitalisation, and outpatient details. Descriptive statistics, Kaplan–Meier survival analyses, and Cox proportional hazard models were performed. Patients treated for DFUs (n = 1729, mean patient age of 63.4 years) were assessed. The cohort consists of Chinese (61.4%), Malay (13.5%), and Indian (18.4%) patients. Common comorbidities included peripheral arterial disease (74.8%), peripheral neuropathy (14.5%), and a median haemoglobin A1c of 9.9%. Patients underwent toe(s) amputation (36.4%), transmetatarsal amputations (16.9%), or major amputations (6.5%). The mean length of inpatient stay for ulcer-only, minor amputation, and major amputation was 13.3, 20.5, and 59.6 days, respectively. Mean cost per patient-year was US \$3368 (ulcer-only), US \$10468 (minor amputation), and US \$30131 (major amputation). Minor amputation-free survival was 80.9% at 1 year and 56.9% at 5 years, while major amputation-free survival was 97.4% at 1 year and 91.0% at 5 years. In conclusion, within our multi-ethnic cohort of patients from the tropics, there was significant clinical and economic burden of DFUs, with a high wound per patient ratio and escalating healthcare costs corresponding to more proximal amputation levels.

## KEYWORDS

diabetic foot, healthcare costs, inpatient, outpatient, tropics

Zhiwen Joseph Lo and Naren Kumar Surendra are both declared as first authors.

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## 1 | INTRODUCTION

In 2014, there were 422 million people across the globe living with diabetes, with a prevalence of 8.5%.<sup>1</sup> Among adults with diabetes, the lifetime risk of developing a diabetic foot ulcer (DFU) is 15% to 25%.<sup>2</sup> DFUs present a substantial clinical and economic burden to health systems around the world, with significant reductions in quality of life for those affected<sup>3</sup>. In a 2017 systematic review and meta-analysis, DFU prevalence around the world was estimated at 6.3%, with prevalence in Asia at 5.5%.<sup>4</sup> In 2016, an estimated 131 million people (1.8% of the global overall population) had diabetes related lower extremity complications (DRLEC), with overall age-standardised rates increase of 15.9% between 1990 and 2016.<sup>5</sup> The largest increases from 1990 to 2016 were in Southern Sub-Saharan Africa, South Asia, and Southeast Asia.

In 2017, within our healthcare cluster in Singapore (comprising two hospitals and six polyclinics, which service almost one third of the Singapore population),<sup>6</sup> the gross healthcare costs for all inpatient wound episodes stand at US \$216 million within hospital care and US \$596000 within primary care.<sup>7</sup> Majority of patients who suffer from neuro-ischaemic ulcers (NIU) had diabetes (97.2%) and there was a 54% increase of NIU-related admissions between 2013 (8/1000 inpatient episodes) and 2017 (12.3/1000 inpatient episodes), with 30.5% of patients requiring two or more NIU-related admission episodes for the index wound in 2017. The direct healthcare cost per patient for hospital care (inpatient and specialist outpatient) and primary care in 2017 was US \$16 920.<sup>6</sup> This evaluation provided a broad overview on the healthcare burden of DFU, with no granular analysis. Hence, building upon our previous study, we aimed to analyse the clinical and economic burden of DFUs via a 5-year longitudinal multi-ethnic cohort study.

## 2 | MATERIALS AND METHODS

### 2.1 | Study design, population, and setting

An observational analysis of inpatient and outpatient data from January 2013 to December 2017 was performed at a university tertiary hospital in Singapore with over 1700 acute inpatient beds and 9000 healthcare staff, 2700 outpatient visits, and 450 emergency department attendances daily.<sup>6</sup> Data of Clinical, administrative, and healthcare costs were retrieved from the Population Health Registry by the Health Services Outcomes Research Unit using International Classification of Diseases (ICD9 and ICD10) diagnosis codes, surgical procedure codes, and service codes

### Key Messages

- we present here the largest longitudinal cohort of patients with DFU published within the literature
- in our multi-ethnic cohort of patients from the tropics, there was significant clinical and economic burden of DFUs, with a high wound per patient ratio and escalating healthcare costs corresponding to more proximal amputation levels
- demonstration and quantifying the significant clinical and economic burden of DFU will help guide public health policies in the prevention and early detection of DFUs, especially for the subgroup of patients with poor blood sugar control

(Appendix 1). These data were then matched with an institutional wound-specific electronic medical record system (eWounds), which contained more than 500 000 wound-related entries between 2013 and 2017. The direct healthcare costs were calculated from a patient's perspective (prior to government subsidies), which include physician fees, inpatient hospital stay, procedures, supportive dressings, and adjuvant therapy. Singapore's healthcare system adopts a mixed financing system, whereby healthcare subsidies are derived from nationalised life insurance schemes and deductions from the compulsory savings plan via the Central Provident Fund.<sup>8</sup>

The study population consisted of patients with a diagnosis of DFU, who were treated at the hospital between January 2013 and December 2017. In general, a patient with DFU presented to the hospital either at Specialist Outpatient Clinic (SOC) or Emergency Department (ED) and received subsequent treatments in inpatient or outpatient care settings. Patients were included in the study if they had  $\geq 1$  SOC visit or  $\geq 1$  inpatient episode. Only SOC visits and inpatient episodes relating to DFU treatments were considered. These included DFU-related admissions such as surgical debridement, minor or major amputations, antibiotic therapy, or revascularisation. DFU-related SOC visits to podiatry, wound nurses, vascular surgery, orthopaedics surgery, or endocrinology were also included in the analysis. Patient's age, sex, race, wound anatomy, comorbidities, and clinical biochemical markers present at the date of index DFU diagnosis are reported.

**TABLE 1** Patient characteristics (at date of index DFU diagnosis)

Characteristics	All (n = 1729)		Ulcer only (n = 1108)		Minor amputation (n = 513)		Major amputation (n = 108)		P value
	n	%	n	%	n	%	n	%	
<b>Age, mean (SD), years</b>	63.4 (12.59)		63.9 (12.97)		62.0 (12.09)		65.2 (10.09)		<b>.004<sup>a</sup></b>
18 to 34	22	1.3	14	1.3	8	1.6	0	0	
35 to 44	97	5.6	64	5.8	31	6.0	2	1.9	
45 to 54	318	18.4	192	17.3	108	21.1	18	16.7	
55 to 64	529	30.6	335	30.2	164	32.0	30	27.8	
65 to 74	448	25.9	275	24.8	134	26.1	39	36.1	
75+	315	18.2	228	20.6	68	13.3	19	17.6	
<b>Sex</b>									<b>&lt;.001<sup>b</sup></b>
Male	1113	64.4	675	60.6	366	63.6	72	70.1	
Female	616	35.6	433	39.4	147	36.4	36	29.9	
<b>Ethnicity</b>									.626 <sup>b</sup>
Chinese	1061	61.4	670	60.9	317	61.6	74	69.0	
Indian	318	18.4	211	18.9	91	18.2	16	16.6	
Malay	234	13.5	147	13.2	75	14.5	12	11.0	
Others	116	6.7	80	7.0	30	5.7	6	3.5	
<b>Comorbidities</b>									
Diabetic retinopathy	764	44.0	469	42.5	248	48.3	47	39.0	.076 <sup>b</sup>
Hypertension	1534	88.7	963	86.7	468	91.9	103	95.2	<b>.003<sup>b</sup></b>
Dyslipidaemia	1618	93.6	1034	93.5	481	94.0	103	95.1	.695 <sup>b</sup>
Ischaemic heart disease	855	49.9	519	47.1	262	51.6	74	68.9	<b>&lt;.001<sup>b</sup></b>
History of stroke	425	25.6	271	26.3	121	23.0	33	30.1	.307 <sup>b</sup>
Chronic kidney disease	1031	61.6	661	61.3	318	64.4	52	50.6	<b>.029<sup>b</sup></b>
End-stage renal failure	408	23.2	233	20.9	127	24.3	48	40.5	<b>&lt;.001<sup>b</sup></b>
Peripheral arterial disease	1292	74.8	703	62.8	482	95.1	107	99.2	<b>&lt;.001<sup>b</sup></b>
Peripheral neuropathy	261	14.5	177	15.5	66	12.2	18	15.9	.238 <sup>b</sup>
<b>Biochemical markers</b>									
Cholesterol (median, IQR), n = 1341	4.8 (2.1)		4.9 (2.0)		4.6 (2.0)		4.8 (2.2)		.062 <sup>a</sup>
HbA1c (median, IQR), n = 1542	9.9 (14.8)		9.8 (4.3)		10.1 (4.2)		10.0 (3.7)		.127 <sup>a</sup>
CRP (median, IQR), n = 1596	43.4 (378.1)		31.5 (98.4)		58.6 (136.0)		70.7 (134.0)		<b>&lt;.001<sup>a</sup></b>
<b>Documented wound anatomy (n = 10 490)</b>									
Toes	4109	39.2	—	—	—	—	—	—	—
Foot plantar	3613	34.4	—	—	—	—	—	—	—
Foot dorsum	1187	11.3	—	—	—	—	—	—	—
Heel	1008	9.6	—	—	—	—	—	—	—
Ankle	573	5.5	—	—	—	—	—	—	—

<sup>a</sup>Kruskal-Wallis test.<sup>b</sup>Chi-square test.

## 2.2 | DFU management protocol

The study site adopts a multi-disciplinary team (MDT) approach in managing patients with DFU, with podiatry, vascular surgery, and endocrinology as core care team members. Support members included wound nursing, physiotherapy, occupational therapy, prosthesis and

**TABLE 2** Costs and healthcare utilisation

Components	Costs
Total healthcare costs, US \$ (SGD\$)	
Cumulative 2013 to 2017	33 077 183 (46908742)
Mean cost per year	6 615 437 (9381748)
Costs, per patient year, US \$ (SGD\$)	
Mean	7152 (10142)
Per ulcer	3368 (4776)
Per minor amputation	10 468 (14845)
Per major amputation	30 131 (42730)

Components	Episodes	Mean utilisation
Services		
Emergency department	4605	1.0
Specialist outpatient clinic	37 447	8.1
Inpatient admission	2679	0.58
30-day re-admission rate	12.7%	—
Mean inpatient length of stay (days)	16.6	—
Per ulcer only	13.3	—
Per minor amputation	20.5	—
Per major amputation	59.6	—

Components	Episodes
Interventions	
Debridement	1803
Revascularisation	667
Minor amputation	
Toe(s) amputations	630 (36.4%)
Transmetatarsal	293 (16.9%)
Major amputation	113 (6.5%)

orthosis department, and plastics and reconstructive surgeons. At SOC, patients were reviewed by the MDT lower extremity amputation prevention program clinic.<sup>9</sup> During inpatient episodes, patients were managed under the local diabetic mellitus foot inpatient pathway. As per international working group for diabetic foot guidelines, patients with neuropathic ulcers received medical optimisation, wound care, and appropriate off-loading; while patients with ischaemic ulcers received medical optimisation, revascularisation, wound care, and appropriate off-loading.<sup>10</sup> When indicated, patients underwent surgical debridement, toe amputations, or transmetatarsal amputations (TMA). In accordance with definitions within the literature, a lower extremity “minor amputation” was defined as amputations distal to the ankle (eg, toe amputations or TMA), while a lower extremity “major amputation” was defined as amputation proximal to the ankle (eg, below knee trans-tibial amputation [BKA] or above knee trans-femur amputation [AKA]).

## 2.3 | Outcomes measurements

The incidence of hospitalisations (including length of stay), ED visits, SOC visits, and surgeries attributable to DFU, were filtered from the Population Health Registry based on clinical expert guidance and patient pathway. For instance, admissions for amputation or surgical debridement in the foot were considered relevant to DFU, whereas admissions for arteriovenous fistula creation or coronary artery bypass were considered not related. For SOC visits, only those visits to vascular surgery, orthopaedic surgery, and podiatry were included. The gross amount charged per visit and/or admission and its related procedures were retrieved from the Population Health Registry for cost calculations. Economic outcomes evaluated include total healthcare resource utilisation and costs during the 5-year follow-up period for DFU patients, with resource utilisation and costs categorised by inpatient care, SOC visit, ED visits, and DFU-related procedures. Clinical factors and outcomes evaluated include baseline patient characteristics and comorbidities, wound status, amputation rates (wound status, major, and minor), and survival rates (amputation-free and all-cause). Hospitalisation and outpatient details evaluated include procedures performed, length of stay, re-admissions, and clinic visits.

## 2.4 | Statistical analysis

All continuous data were expressed as mean  $\pm$  standard deviation (SD) for normally distributed data and median + interquartile range (IQR) for data not normally

distributed. Categorical data were expressed as percentages (%). No data imputations were conducted for reported clinical biochemical markers. The number and costs of resource utilisations were reported as the total for the study period and per patient-year. All DFU-related services were calculated as the count of discrete inpatient stay, ED visits, SOC visits, and procedures performed. Patient-year was calculated as the number of days a patient added to the denominator (ie, days from index date until cessation of therapy, death, or end of study period) divided by 365. The unadjusted survival probabilities for all-cause mortality and major

amputation were estimated using the Kaplan–Meier method. In addition, the stepwise Cox-proportional hazard model was performed to identify the risk factors for major amputation and all-cause mortality. Risk factors investigated include age, sex, peripheral arterial disease (PAD), history of stroke, ischaemic heart disease (IHD), end-stage renal failure (ESRF), and major amputation. A dummy coding of 0 and 1 was used to enter the nominal independent variables except for age. The proportional hazards (PH) assumption was met and was tested using statistical tests and graphical diagnostics based on the scaled Schoenfeld residuals. Variance inflation factor

**TABLE 3** Survival probabilities for major amputation, major amputation, and overall

Variables	Probability of surviving, % (event-major amputation)			Probability of surviving, % (event-minor amputation)			Probability of surviving, % (event-death)		
	1-year	3-year	5-year	1-year	3-year	5-year	1-year	3-year	5-year
Overall	97.4	94.7	91.0	80.9	67.9	56.9	93.8	79.5	62.1
Gender									
Male	97.5	94.9	90.8	79.3	65.0	52.7	94.2	80.0	62.6
Female	97.1	94.2	91.5	83.7	73.0	64.2	92.9	78.6	61.2
Age groups									
18 < 35	100	100	100	77.3	72.7	62.3	100	100	94.7
35 < 45	99.0	99.0	95.7	84.5	66.2	61.9	97.9	92.2	87.0
45 < 55	97.4	96.2	91.6	78.9	66.4	53.6	96.1	88.3	72.4
55 < 65	97.5	95.1	92.3	81.2	69.5	58.2	95.8	85.2	70.0
65 < 75	97.2	92.7	87.7	81.2	65.8	53.1	94.7	78.1	58.0
≥75	96.6	93.3	91.7	81.1	69.4	62.9	84.8	56.5	33.8
Amputation									
Major	—	—	—	—	—	—	88.8	61.7	32.9
Minor	—	—	—	—	—	—	94.7	83.0	62.8
None	—	—	—	—	—	—	93.8	79.5	64.7
IHD									
Yes	96.1	92.8	87.6	81.0	65.4	51.8	92.3	72.9	50.1
No	98.6	96.6	94.5	80.8	70.3	62.0	95.2	86.4	76.6
PAD									
Yes	96.5	92.9	88.5	75.6	59.2	47.0	93.2	76.9	58.9
No	99.5	99.5	99.5	96.8	94.3	89.5	95.5	87.7	74.1
Stroke									
Yes	96.6	92.8	90.2	81.5	67.5	55.0	91.9	71.8	52.3
No	97.6	95.3	91.3	80.7	68.0	57.4	94.4	82.1	65.8
ESRF									
Yes	94.4	91.0	83.5	83.0	67.1	49.3	92.0	74.6	50.8
No	98.3	95.9	93.6	80.3	68.2	59.7	94.3	81.1	66.6

(VIF) analysis was also performed to check for multicollinearity, but none was observed. The significance level was predetermined at  $P < .05$  for all tests. All statistical analyses were performed using Microsoft Excel 2016 (Microsoft, Redmond, Washington) and R software version 3.6.1 (R Foundation, Vienna, Austria).

### 2.5 | Role of the funding source

The funders had no role in study design, data collection, data analysis, data interpretation, or writing of the study report. Both first authors and the corresponding author had full access to all the data in the study and had final responsibility for the decision to submit for publication. This study had been approved by the institution ethics review board (National Healthcare Group Domain Specific Review Board 2019/00813).

## 3 | RESULTS

### 3.1 | Patient demographics

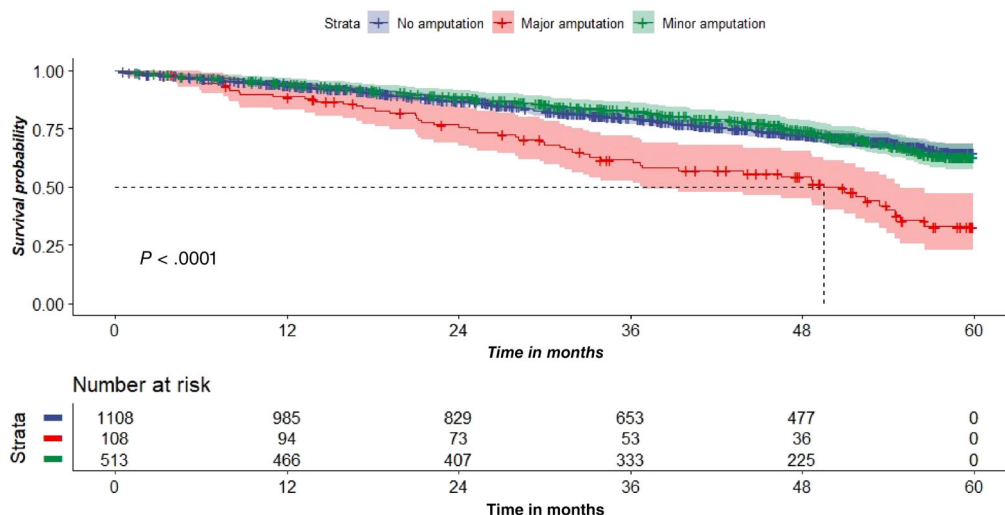
Between January 2013 and December 2017, there were a total of 1729 patients who underwent treatment for DFU (see Table 1). Mean age was 63.4 years (SD 12.59), with more than half aged between 55 and 74 years (56.5%). The average follow-up time of patients during the 5-year observation period was 2.9 years. Most of the patients were male (64.4%) and there was a greater proportion of patients of Indian ethnicity (18.4%), as compared to the Singapore general population (9.0% in 2018).<sup>11</sup> Almost

three quarters of patients had underlying PAD (74.8%) and one sixth of patients (14.5%) had peripheral neuropathy. The study population generally had good lipid control with median cholesterol level at 4.8 mmol/L (IQR 2.1) but poor glycaemic control with median haemoglobin A1c (HbA1c) at 9.9% (IQR 14.8). Each patient had a mean of 6.1 documented wounds (total wound documentation  $n = 10\,490$ ), with majority of documented wounds occurring at the toes (39.2%) or foot plantar surface (34.4%). In this cohort, on average, one patient had 2.12 DFUs per year.

Subgroup analysis of patient characteristics for patients with either ulcer only, minor amputations, or major amputations showed that patients who underwent major amputations were more likely to be older (mean age 65.2 years,  $P = .004$ ), male (70.1%,  $P < .001$ ), with comorbidities of hypertension (95.2%,  $P = .003$ ), IHD (68.9%,  $P < .001$ ), chronic kidney disease (50.6%,  $P = .029$ ), ESRF (40.5%,  $P < .001$ ), PAD (99.2%,  $P < .001$ ), and with raised C-reactive protein (CRP) levels (median 70.7 mg/L,  $P < .001$ ).

### 3.2 | Mean healthcare costs for DFU care

Within the study population, the mean healthcare cost for hospital (inpatient and outpatient) DFU care was US \$6615437 (SG \$9381748) per year, with respective mean cost per patient-year for ulcer only, minor amputation, and major amputation at US \$3368 (SG \$4776), US \$10468 (SG \$14845), and US \$30131 (SG \$42730) (see Table 2). Mean ED visit was 1.0 per patient-year, mean SOC visit at 8.1 per patient-year, and mean inpatient



**FIGURE 1** Survival analysis comparing patients with ulcers only, minor amputations, and major amputation



admission at 0.58 per patient-year, with 30-day re-admission rates at 12.7%. The mean inpatient length of stay (LOS) for ulcer only, minor amputation, and major amputation was 13.3, 20.5, and 59.6 days, respectively. More than one in three patients underwent toe(s) amputation (36.4%), more than one in six patients underwent TMA (16.9%) while more than one in 15 patients underwent major amputation (6.5%).

### 3.3 | Patient 1-year and 5-year survival outcomes

In terms of time to event (survival outcomes), major amputation-free survival was 97.4% at 1 year and 91.0% at 5 years, while minor amputation-free survival was 80.9% at 1 year and 56.9% at 5 years (see Table 3,  $P < .001$ ). Overall survival was 93.8% at 1 year and

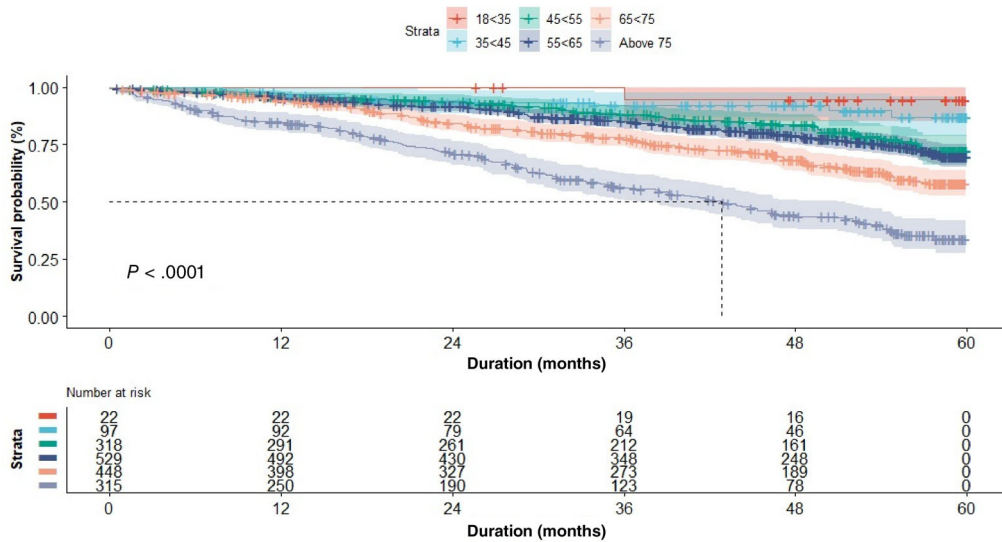


FIGURE 2 Survival analysis by age groups

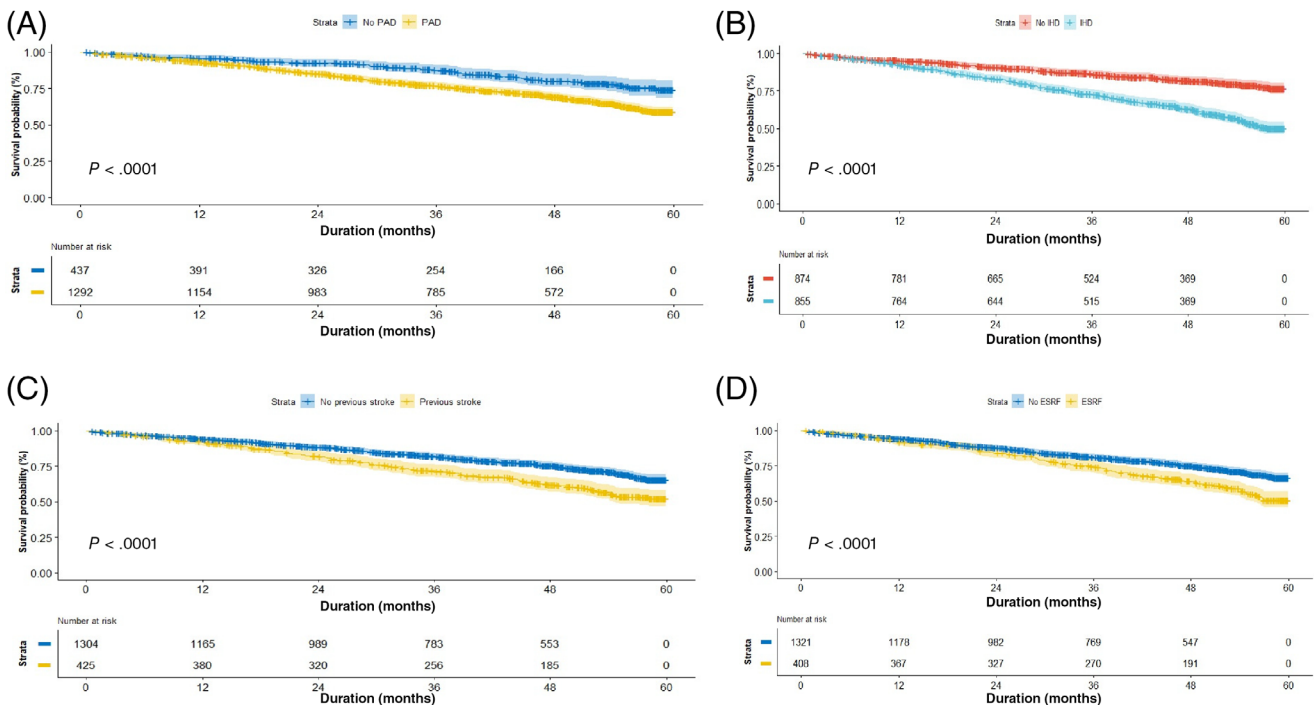


FIGURE 3 Survival analysis in patients with and without PAD (A), IHD (B), previous stroke (C), and ESRF (D)

Covariates	exp (coef)	95% CI		z	P value
		Lower	Upper		
<b>All-cause mortality<sup>a</sup></b>					
Age (years)	1.07	1.05	1.08	9.53	<.001
Major amputation	1.80	1.35	2.40	4.03	<.001
PAD	1.37	1.06	1.77	2.43	.015
IHD	10.77	3.28	35.34	3.92	<.001
Previous stroke	1.22	1.01	1.48	2.05	.041
ESRF	1.37	1.12	1.68	3.04	.002
Age*IHD	0.97	0.96	0.99	-2.99	.003
<b>Major amputation<sup>b</sup></b>					
Age (years)	1.04	1.01	1.07	3.04	.002
IHD	12.27	1.21	124.19	2.12	.033
PAD	27.95	3.98	200.64	3.31	<.001
ESRF	1.92	1.27	2.90	3.11	.002
Age*IHD	0.97	0.94	1.00	-1.85	.064
<b>Minor amputation<sup>c</sup></b>					
PAD	7.39	5.15	10.61	10.84	<.001
Male	1.35	1.13	1.60	3.34	<.001

Abbreviations: ESRF, end-stage renal failure; IHD, ischaemic heart disease; PAD, peripheral arterial disease.

<sup>a</sup>Likelihood ratio test = 279.3,  $P < .001$ ; Wald test = 228.6,  $P < .001$ .

<sup>b</sup>Likelihood ratio test = 80.6,  $P < .001$ ; Wald test = 36.7,  $P < .001$ .

<sup>c</sup>Likelihood ratio test = 232.9,  $P < .001$ ; Wald test = 130.1,  $P < .001$ .

62.1% at 5 years. Subgroup survival analysis showed higher mortality signals among patients who underwent major amputations (5-year survival at 32.9%) (see Figure 1,  $P < .001$ ) were older (see Figure 2,  $P < .001$ ) with PAD (5-year survival at 58.9%), IHD (5-year survival at 50.1%), previous stroke (5-year survival at 52.3%), and ESRF (5-year survival at 50.8%) (see Figure 3,  $P < .001$ ).

### 3.4 | Independent predictors for mortality and amputation

Independent predictors for all-cause mortality were age (hazard ratio [HR] 1.1,  $P < .001$ ), major amputation (HR 1.8,  $P < .001$ ), PAD (HR 1.4,  $P = .015$ ), IHD (HR 10.8,  $P < .001$ ), previous stroke (HR 1.2,  $P = .041$ ), and ESRF (HR 1.4,  $P = .002$ ) (see Table 4).

With regard to major amputations, overall rate was 6.5% with independent predictors being age (HR 1.0,  $P = .002$ ), PAD (HR 27.9,  $P < .001$ ), IHD (HR 12.3,  $P = .033$ ), and ESRF (HR 1.9,  $P = .002$ ) (see Table 4). With regard to minor amputations (including toes or TMA), overall rate was 53.3% with independent predictors being male (HR 1.3,  $P < .001$ ) and PAD (HR 7.4,  $P < .001$ ) (see Table 4).

**TABLE 4** Multivariate Cox proportional-hazards model for all-cause mortality, minor, and major amputation

## 4 | DISCUSSION

DFUs present a substantial burden to global health systems and patients. In 2017, within our healthcare cluster, the direct healthcare cost per patient for hospital care (inpatient and specialist outpatient) and primary care in 2017 was US \$16 920 with 30.5% of patients requiring two or more NIU-related admission episodes.<sup>6</sup> This initial evaluation provided a broad overview on the burden of DFUs; however, a DFU-focused analysis of patient data was needed. We present clinical and economic analysis of the largest longitudinal cohort of patients in the tropics with DFUs to date with Faglia et al's Italian series of 993 patients as the next largest single-centred series.<sup>12</sup>

Similar to the global prevalence of DFU, we report a larger proportion of male patients with DFU.<sup>4</sup> This cohort subset included a significantly higher percentage of patients who underwent major amputations. Across the world, a higher proportion of male patients with DFU had been consistently reported from both developed countries<sup>13</sup> and developing countries,<sup>14-15</sup> with a possible hypothesis in the gender difference due to increased physical work in males.<sup>16</sup> The patient population analysed showed a high percentage of patients with Indian ethnicity. This is consistent with a 2008 study examining the epidemiology of diabetic foot problems in



another Singapore hospital.<sup>17</sup> Nather et al reported a significantly increased incidence of diabetic foot problems in patients of Indian descent. This is likely secondary to the higher prevalence of diabetes among Indians within the local Singapore population.<sup>18</sup>

Patients within our study population had poor glycaemic control with median HbA1c at 9.9% (IQR 14.8) with a significant proportion suffering from macro (IHD, stroke, ESRF, PAD) and micro (diabetic retinopathy, peripheral neuropathy) vascular complications. In a meta-analysis of six studies with 109 933 patients, Zhou et al found that the odds ratio for lower extremity amputations incidence was 1.229 (95% CI: 1.169–1.292) for every 1% HbA1c increase.<sup>19</sup> Specifically, it has been reported that for each 1.0% point increase in HbA1c, the daily wound-area healing rate decreased by 0.028 cm<sup>2</sup>/day (95% CI: 0.003, 0.0054,  $P = .027$ ).<sup>20</sup> As result of poor glycaemic control, it was not surprising that each patient within our study population had a mean of 6.1 documented wounds within the 5-year study period. A majority of DFUs also occurred on the toes or plantar region. In a review of 19 compatible studies on incidence rates for DFU recurrence, Armstrong et al estimated that 40% of patients have DFU recurrence within 1 year after ulcer healing, almost 60% within 3 years and 65% within 5 years.<sup>21</sup> Within the multi-centre prospective Eurodiale study, significant independent predictors for recurrence were plantar ulcer location; presence of osteomyelitis; HbA1c > 7.5%, and CRP > 5 mg/L.<sup>13</sup> Hence, a holistic approach of home monitoring of foot temperature, pressure-relieving therapeutic footwear, and certain surgical interventions may be effective in preventing up to 60% to 75% of DFU recurrence.<sup>21</sup>

In terms major amputations, overall rates within our study cohort was 6.5%, with independent risk factors being age, PAD, IHD, and ESRF. These risk factors are similar to those reported within the literature. Within United States, up to 20% of moderately or severely infected DFU eventually lead to some level of amputation.<sup>22</sup> It is known that the presence of PAD independently increases the risk of non-healing ulcers, infection, and amputation. Similarly within Asia, data from the Japanese OLIVE registry revealed that age, body mass index, ESRF, and Rutherford grade 6 classification were identified as predictors of major amputation or death.<sup>23</sup> Within patients of Chinese ethnicity, overall amputation rate among DFU was 21.5%, with stepwise logistic regression analysis revealing PAD (as one of four significant risk factors).<sup>24</sup> Traditionally, it is well known that ESRF patients have a higher risk of limb loss after revascularisation and a poorer survival.<sup>25</sup> Significantly, mortality after DFU-related amputation exceeds 70% at 5 years, with mortality rates even higher at 74% at 2 years for patients with ESRF.<sup>26</sup> However, it is still unclear if

such high mortality rates are due to a combination of premorbid conditions (including amputation perioperative risks), lack of activity, and/or deconditioning.

With regard to mortality, data within the literature states that 5-year mortality rates were estimated at 45%, 18%, and 55% for neuropathic, neuroischaemic, and ischaemic ulcers, respectively.<sup>26</sup> Similarly, for patients post minor and major amputations, 5-year mortality was estimated at 46% and 57%, respectively, which is comparable to 5-year pooled mortality rates for all reported cancer at 31%.<sup>22</sup> Within our study population, overall 5-year mortality was 37.9%, with subgroup analysis showing higher mortality signals among patients who underwent major amputations, were older, with PAD, IHD, previous stroke, and ESRF. It is known that patients with DFU were older, had a longer diabetic duration, and had more hypertension, diabetic retinopathy, and smoking history than patients without DFU.<sup>4</sup> Earlier data from our institution also revealed that patients with neuroischaemic ulcers also had multiple comorbidities and were the frailest group of patients.<sup>7</sup> Globally, between 1990 and 2016, age-standardised years lived with disability rates of all DRLECs increased by 14.6% to 31.0% from 1990 estimates. DRLECs are a large and growing contributor to the disability burden worldwide and disproportionately affect males and middle- to older-aged populations.<sup>5</sup> Thankfully, contemporary data on 5-year follow-up on patients with DFU from 2009 to 2010 in France showed a lower than expected mortality rates, suggesting that with increasing awareness, international guidelines, and multi-disciplinary team approach, progress has been and can be made in the management of patients with DFU.<sup>27</sup>

In Singapore, the cost of diabetes mellitus was estimated at US \$700 million (SG \$1 billion) in 2010, with the figure projected to rise to US \$1.75 billion (SG \$2.5 billion) by 2050.<sup>28</sup> The cost per working-age person with diabetes in Singapore is also projected to increase from US \$5400 (SG \$7678) in 2010 to US \$7423 (SG \$10596) in 2050. Within our current study, we found that the mean healthcare cost for hospital (inpatient and outpatient) DFU care was US \$6615437 (SG \$9381748) per year, with respective mean cost per patient-year for ulcer only, minor amputation, and major amputation at US \$3368 (SG \$4776), US \$10468 (SG \$14845) and US \$30131 (SG \$42730). These data are similar to that from the United States. In 1998, the total direct cost for healing of infected DFUs not requiring amputation was estimated at US \$17 500 per patient while the cost for lower-extremity amputations, depending on the level of amputation, was between US \$30 000 and \$33 500 per patient.<sup>29</sup> In a patient with DFU, the potential economic benefits of lower extremity amputation prevention strategies are estimated between US \$2900 and \$4442 per patient over 3 years.

Similarly, within our study population, the difference in the mean cost per patient-year between ulcer only and minor amputation was US \$7100 while the difference between minor and major amputations was US \$19663. When comparing against other diseases, direct cost of care for patients with DRLEC are comparable with cancer. In 2017, direct cost of care for diabetes in general was estimated at US \$237 billion, with up to one-third attributed to the lower extremity, while direct costs of care for cancer in 2015 was estimated at US \$80 billion.<sup>22</sup> Hence, active measures to prevent DFU will help to decrease the economic burden of diabetic foot disease. Evidence and guideline-based management of DFU improves survival, reduces DRLEC, and is cost-effective when compared with standard care.<sup>30</sup>

Limitations of our study include its registry-based retrospective design from a single healthcare cluster, with associated selection and information biases. Local healthcare structure meant that DFU-related admissions at hospitals were well coded, but DFU-related presentations at primary care was lacking. Hence, contrary to studies from other global data,<sup>3-5</sup> our study population was identified from tertiary care, instead of primary care. In addition, there are multiple and often overlapping diagnosis codes for diabetic foot ulcers, related aetiology (such as peripheral arterial disease, critical limb ischaemia, and neuropathy), and complications (such as gangrene, foot abscess, and osteomyelitis). Coupled with the fact that patients often have comorbidities with active issues (such as ESRF, diabetes, and IHD), this may result in underreporting on the true clinical burden of DFU or result in misclassification bias in terms of diagnosis codes, surgical procedure codes, or service codes.

## 5 | CONCLUSION

Similar to global data, there is a high clinical and economic burden of DFU within Southeast Asia and the tropics. Within our study cohort, patients have poor DM control, resulting in high wounds per patient ratio with escalating healthcare costs corresponding to more proximal amputation levels. Patients have a high re-admission rate and required multiple SOC visits. Primary prevention via DM control should be a focus for population health interventions. Patients with PAD are at a significantly higher risk for mortality, major, and minor amputations and should be the subset of patients for early and aggressive limb salvage interventions.

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## CONFLICT OF INTEREST

All authors contributed to and approved the final manuscript. The authors declare no conflict of interest and all authors contributed sufficiently to be credited as co-authors.

## AUTHOR CONTRIBUTIONS

All authors contributed to and approved the final manuscript. **Zhiwen Joseph Lo** and **Naren Kumar Surendra**: data analysis and writing the manuscript. **Zhiwen Joseph Lo**: guarantor. **Akshar Saxena** and **Josip Car**: data analysis, reviewing, and editing the manuscript.

## DATA AVAILABILITY STATEMENT

The datasets generated during and/or analysed during this study are available from the corresponding author on reasonable request.

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## APPENDIX A

**TABLE A1** International Classification of Diseases (ICD9 and ICD10) diagnosis codes, surgical procedure codes, and service codes utilised for data retrieval

Categories	ICD9	ICD10	Surgical codes	Service codes
Inpatient discharge primary diagnosis and secondary diagnosis	2507'	E09.0		
	25 070'	E09.01		
	25 071'	E09.02		
	25 072'	E09.5		
	25 073'	E09.51		
	4402'	E09.52		
	44 020'	E10.51		
	44 021'	E10.52		
	44 023'	E10.73		
	44 024'	E11.51		
	44 029'	E11.52		
	4403'	E11.73		
	44 030'	E13.51		
	44 031'	E13.52		
	44 032'	E13.73		
	443'	E14.51		
	4438'	E14.52		
	44 389'	E14.73		
	4439'	I70.2		
	4442'	I70.20		
	7854'	I70.21		
		I70.23		
		I70.24		
	I73			
	I73.8			
	I73.9			
	I74.3			
	I74.4			
	I79.2			
Tertiary outpatient wound nurse care				WC001 WC006
Primary care wound visits				NBF017 NHF018 NBF026 NBF030
				SD720A SD721A SD722A XRM019
				SD713A SD714A SD810V SD814V SD807A
Angioplasty				
Surgical bypass				
Minor amputations			SB708T SB830T SB707T SB829T	
			SB809L	
				VS0020 VS0005 VS0006
Major amputations				
ABPI arterial duplex				

Abbreviation: ABPI, arterial-brachial pressure index.