



OPEN

Check point to get adequate weight loss within 6-months after laparoscopic sleeve gastrectomy for morbid obesity in Asian population

Chung-Yen Chen^{1,2,5}, Cheng-Hung Lee^{6,8}, Hui-Ming Lee^{1,4,5}, Wen-Yao Yin^{6,8}, Wei-Leng Chin^{1,3,5}, Ming-Hsien Lee^{7,9} & Jian-Han Chen^{1,2,5,9}✉

Purpose of this study is to develop a scoring system to predict the likelihood of excess body weight loss (EBWL) \geq 50% 6-months after laparoscopic sleeve gastrectomy (LSG). From April 2016 to September 2018, data was collected from 160 patients (BMI \geq 32) who underwent primary LSG with at least 6-months follow-up. They were separated into score generation (operated by one surgeon, n = 122) and validation groups (operated by 3 different surgeons, n = 38). EBWL at 6-months \geq 50% was considered adequate weight loss. Independent variables including age, gender, initial body mass index (BMI), comorbidities, life-style habits, percentage of EBWL and percentage of total body weight loss at 1-week, 1-month, and 3-months were analyzed with multivariate logistic regression to generate the scoring system. The system was applied to internal and external validation groups to determine efficacy. As results, between the score generation and internal validation groups, the only significant difference in patient characteristics was in exercise participation. EBWL at 1-month $>$ 19.5% (1 point) and EBWL at 3-months $>$ 37.7% (2 points) were identified as independent factors to predict EBWL at 6-months \geq 50%. When scores were $>$ 1, the system had 94.03% positive predictive value (PPV) and 81.82% negative predictive value (NPV) (AUC: 0.923). Internal validation scores $>$ 1 had a 95.83% PPV and 85.71% NPV (AUC: 0.975). External validation results showed 88.59% PPV and 72.00% NPV (AUC: 0.802). We concluded that this scoring system provides a reliable, objective prediction of EBWL at 6-months \geq 50%. Patients requiring more aggressive clinical follow-up and intervention can be detected as early as 1- to 3-months after LSG.

As the prevalence of morbid obesity increases worldwide, bariatric surgery is becoming increasingly common. At the onset, it is very important to identify the 10–20% of patients who are at-risk for inadequate weight loss after surgery^{1–3}. Poor postoperative weight loss may also influence the metabolic effect of bariatric surgery, limiting the expected health benefits such as improvement in diabetes management^{4,5}, hypertension remission, and resolution of dyslipidemia, sleep apnea and multiple other comorbidities⁵.

In addition to exploring risk factors, several published models are designed to predict adequate weight loss after bariatric surgery. For Roux-en-Y gastric bypass (RYGB), Moret al.⁶ found that a quartile attribution for EWL at the 1-month postoperative visit was maintained throughout the first year with 39% PPV

¹Bariatric and Metabolism International Surgery Center, E-Da Hospital, Kaohsiung, Taiwan. ²Division of General Surgery, E-Da Hospital, Kaohsiung, Taiwan. ³Department of Family Medicine, E-Da Hospital, Kaohsiung, Taiwan. ⁴Division of General Surgery, E-Da Cancer Hospital, Kaohsiung, Taiwan. ⁵School of Medicine, College of Medicine, I-Shou University, Kaohsiung, Taiwan. ⁶Department of General Surgery, Dalin Tzu Chi Hospital, Buddhist Tzu Chi Medical Foundation, Chia-Yi, Taiwan. ⁷Division of Metabolic and Bariatric Surgery, Taichung Tzu Chi Hospital, Buddhist Tzu Chi Medical Foundation, Taichung, Taiwan. ⁸School of Medicine, Tzu Chi University, Hualien, Taiwan. ⁹These authors contributed equally: Jian-Han Chen and Ming-Hsien Lee. ✉email: JAMIHAN1981@gmail.com

and 81% NPV. Al-Khyatt et al.² established a statistically significant model, with predicted %EWL = constant $- (9.2 * \text{BMI}) - (2.9 * \text{age}) + (4.8 * \text{preoperative EWL}) - (3.1 * \text{TtS}) - (6.2 * \text{DM})$, and a correlation coefficient of 0.43. The model predicted EWL at 12-months in 43% of their data. Slotman⁷ published another model to predict weight and co-morbidities at 2-, 6-, 12-, 18-, and 24-months via preoperative data. These models were generated from gastric bypass patients. There are no validation studies applying these models to LSG.

Early postoperative weight loss is reported to be an important predictive factor for overall weight loss 1- and 3-years after bariatric surgery non-Asian^{5,8,9} and Asian populations¹⁰. Kanerva et al.¹¹ demonstrated that in the short-term, considered to be 6-months after bariatric surgery, changing dietary macronutrient composition affects 10-year postoperative weight. Therefore, early postoperative detection of poor weight loss is key to clinical decision-making regarding treatment interventions. Moreover, Manning et al.⁸ reported weight loss velocity between postoperative 3- to 6-months is an independent predictor for a maximal percentage of weight loss in LSG. Their study showed that weight loss percentage is a stronger predictor in LSG patients compared to RYGB patients. We believe that predictive models generated from RYGB may not fully apply to LSG.

There are weight loss predictor models generated from LSG. Cottam et al.⁹ established a prediction model based on comorbidities, including diabetes and/or sleep apnea, and the %EWL at 1- and 3-months after LSG to predict %EWL > 55% at 1 year with a 71% sensitivity, 91% specificity, 72% PPV and 91% NPV. Van de Laaret al.³ presented bariatric weight loss charts with standard deviation and percentile curves which aims to assess weight loss, weight-regain, and poor responders up to 7 years after sleeve gastrectomy and was validated by large studies ($n > 500$), reporting weight loss results after LSG with BMI > 35 kg/m² and age ≥ 18 years with a minimum of 5-years follow-up. However, they were not validated for Asian populations.

This study aimed to generate a predictive scoring system to identify patients with more than 50% excess body weight loss (EBWL) 6-months after LSG.

Methods

This study was fully evaluated and approved by the Institutional Review Board of Eda Hospital and was conducted in accordance with the principles of the Helsinki Declaration. The institutional ethics committee waived the need for patients' written informed consent for this retrospective analysis of clinically acquired data.

From April 2016 to September 2018, data was collected from 334 consecutive adult patients who underwent laparoscopic sleeve gastrectomy (LSG) and follow-up for at least 6 months at a single-site. Patients with incomplete weight data ($n = 150$), BMI < 32 ($n = 23$) and revisional surgery ($n = 1$) were excluded from the analysis. In addition, data from 811 patients at two additional centers was used for external validation of the scoring method.

Laparoscopic sleeve gastrectomy. The surgery protocol was the same for all patients at the single-site. Under general anesthesia and in a supine position, the abdomen was prepared aseptically with betadine as usual. A 36-Fr oral gastric (OG) tube was inserted orally as a guide during gastrectomy. One small skin incision on the umbilicus created a laparotomy for 15 mm trocar insertions. After setting up the laparoscopic instruments, the left lateral segment was elevated to expose the angle of His. Gastrolysis of the greater curvature of the stomach from the greater omentum was performed, and the tip of the OG tube remained along the lesser curvature as a guide for transection. Sleeve gastrectomy was performed from the antrum, 5 cm away from the pylorus, to the angle of His along the OG tube. Routine intraoperative endoscopic examination was performed. The resected portion of the stomach was removed and all wounds were closed in layers. All patients were hospitalized for 24–48 h of postoperative observation. Follow-ups occurred 1-week, 1-month, 3-months, 6-months and 1-year after LSG.

Variables. Our primary endpoint was EBWL 6 months after LSG. Adequate weight loss 6 months post-surgery was defined as EBWL $\geq 50\%$. Parameters including age, sex, initial body mass index (BMI), comorbidities, lifestyle, and emotional status were evaluated. Patients' emotional status was evaluated with the Taiwanese Depression Questionnaire and the Chinese Health Questionnaire, which have been found appropriate for use in patients undergoing bariatric surgery¹². Diabetes was defined by antidiabetic medication or insulin use or a preoperative hemoglobin A1c level > 6.5%. Hypertension was defined by the use of anti-hypertensive medication or a preoperative blood pressure level of more than 140/90 mmHg.

Patients were divided into two groups based on the operating surgeon. One group was used to generate the predictive scoring (operated on by a single surgeon, $n = 122$) and the other group was used for internal validation of the scoring method (operated on by 3 different surgeons, $n = 38$). Ideal postoperative weight was defined as a BMI of 22. The percentage of EBWL (%EBWL) and percentage of total body weight loss (%TBWL) at 1-week, 1-month, 3-months, and 6-months were collected. After generating the scoring system, it was applied to the internal validation group to test the efficacy of the model. Finally, the scoring system was applied to the off-site patient data for external validation.

Statistical analysis. SPSS software (IBM, Chicago, IL, USA) was used for the descriptive statistics and contingency tables. The patient characteristics and covariates were analyzed with Student's *t* test, Mann-Whitney U-test, and chi-square or Fisher's exact tests. A *p* value ≤ 0.05 was considered significant. All variables were analyzed with collinearity diagnostics to identify independent variables. Independent variables in the score generation group were analyzed by logistic regression to evaluate their ability to predict adequate weight loss. The cut-off values for continuous data were decided by the receiver operating characteristic (ROC) curve. A backward stepwise logistic regression model was applied for multivariate logistic regression. All variables with *p*-values less than 0.2 were inserted into the model. To generate a score, the regression coefficient was divided by 2 and

	Score generation group ^a		Validation group ^a		p value
	N = 122		N = 38		
Age (y), mean (±SD)	35.59	(9.51)	36.05	(10.61)	0.742
Gender (no., %)					0.195
Female	70	57.38	17	44.74	
Male	52	42.62	21	55.26	
BMI Mean (±SD)	40.68	(05.77)	39.42	(05.10)	0.257
Mood status					
TDQ (±SD)	15.45	(11.88)	14.79	(11.69)	0.710
CHQ (±SD)	4.70	(2.46)	4.39	(02.84)	0.487
Comorbidity (no., %)					
Diabetes mellitus	31	25.41	13	34.21	0.304
Hypertension	75	61.48	25	65.79	0.704
Lifestyle (no., %)					
Alcohol	12	9.84	9	23.68	0.050
Smoking	36	29.51	11	28.95	1.000
Betel nut	5	4.10	3	7.89	0.396
Sports	25	20.49	15	39.47	0.030*
Postoperative results					
EBWL 1-week	15.03%	(04.64%)	14.79%	(04.51%)	0.501
TBWL 1-week	6.51%	(01.67%)	6.39%	(01.87%)	0.344
EBWL 1-month	23.44%	(06.98%)	26.18%	(07.18%)	0.033*
TBWL 1-month	10.11%	(02.06%)	11.22%	(02.68%)	0.023*
EBWL 3-month	41.02%	(11.66%)	44.30%	(12.76%)	0.182
TBWL 3-month	17.75%	(03.71%)	19.06%	(05.00%)	0.083
EBWL 6-month	56.32%	(16.44%)	58.94%	(15.65%)	0.352
TBWL 6-month	24.42%	(05.59%)	25.38%	(06.20%)	0.310

Table 1. Clinical characteristics of the score generating and internal validation groups. *EBWL* excess body weight loss, *TBWL* total body weight loss. * $p < 0.05$. ^aAll patients are Asian.

rounded to the nearest whole number. Sensitivity, specificity, positive and negative predictive values, and ROC curves were used to evaluate the efficacy of the scoring system.

Ethical approval. For this type of study formal consent is not required.

Results

Table 1 summarizes the characteristics of the 160 patients included in the score generation ($n = 122$) and internal validation ($n = 38$) groups. There were no significant differences between the groups in age, sex, emotional status, comorbidities, and health habits, except for exercise participation (20.49% in the score generation group vs 39.47% in the validation group, $p = 0.03$).

The internal validation group had a significantly higher average 1-month %EBWL and %TBWL compared to the score generation group (26.18% vs. 23.44% [$p = 0.033$] and 11.22% vs. 10.11% [$p = 0.023$], respectively). However, there were no significant differences between the groups at 6-months.

Scoring. In the univariate analysis, preoperative BMI < 39.2 , smoking habit, 1-week EBWL $> 16.1\%$, 1-month EBWL $> 19.5\%$, and 3-month EBWL $> 37.7\%$ were independent factors in detecting adequate weight loss 6 months after LSG (Table 2). After multivariate analysis, only 1-month EBWL (regression coefficient = 1.610, $p = 0.014$; Score: 1) and 3-month EBWL (regression coefficient = 3.871, $p < 0.001$; Score: 2) were independent factors. Thus, the 6M50LSG scoring system for predicting adequate weight loss 6-months after LSG was generated.

The 6M50LSG scoring system was applied to the score generation group and evaluated by the ROC curve. When the score was > 1 , it had 86.3% (95% CI 76.25–93.23%) sensitivity, 91.84% (95% CI 80.40–97.73%) specificity, 94.03% (95% CI 85.98–97.59%) positive predictive value (PPV), and 81.82% (95% CI 71.55–88.95%) negative predict value (NPV). The area under the curve (AUC) was 0.923 ($p < 0.001$).

Internal validation. The 6M50LSG scoring system was similarly applied to the internal validation group. When the score was > 1 , it had 92.00% (95% CI 73.97–99.02%) sensitivity, 92.31% (95% CI 63.97–99.81%) specificity, 95.83% (95% CI 77.71–99.35%) PPV, and 85.71% (95% CI 61.14–95.81%) NPV. The AUC was 0.975 ($p < 0.001$).

	Univariate analysis		Multivariate analysis		B	Score
	OR	p value	Adjust OR	p value		
Preoperative						
Sex	00.648	0.246*				
Age ≤ 39.88	01.597	0.255*				
BMI ≤ 39.2	07.572	<0.001*	02.194	0.249		
Diabetes mellitus	00.636	0.281*				
Hypertension	00.657	0.276*				
Alcohol	03.730	0.099*	00.310	0.342		
Smoking	02.609	0.030*	01.745	0.486		
Betel nut	00.000	0.999*				
Exercise	02.522	0.070*	00.365	0.356		
TDQ > 6	01.875	0.135*	03.989	0.064		
CHQ < = 4	01.616	0.197*	01.484	0.579		
Postoperative						
EBWL at 1 week > 16.1%	10.667	<0.001*	01.647	0.571		
EBWL at 1 month > 19.5%	19.446	<0.001*	04.851	0.017*	1.579	1
EBWL at 3 months > 37.7%	70.875	<0.001*	48.166	<0.001*	3.875	2

Table 2. The factors influencing adequate weight loss after laparoscopic sleeve gastrectomy. *B* regression coefficient, *CHQ* Chinese Health Questionnaire, *EBWL* excess body weight loss, *OR* odds ratio, *TDQ* Taiwanese Depression Questionnaire. * $p < 0.05$.

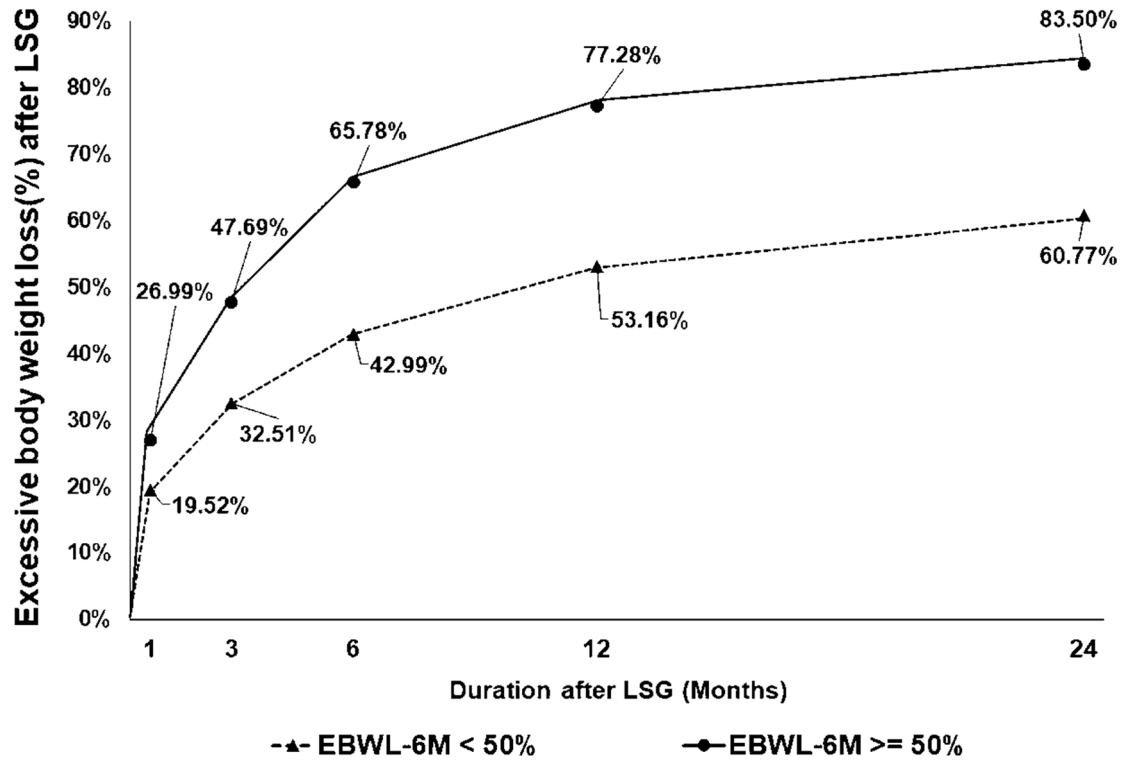
	Score > 1					
	Score generator		Internal validation		External validation	
Sensitivity	86.30%	(76.25–93.23%)	92%	(73.97–99.02%)	90.53%	(86.77–93.15%)
Specificity	91.84%	(80.40–97.73%)	92.31%	(63.97–99.81%)	68.57%	(59.51–76.01%)
PPV	94.03%	(85.98–97.59%)	95.83%	(77.71–99.35%)	88.59%	(85.78–90.90%)
NPV	81.82%	(71.55–88.95%)	85.71%	(61.14–95.81%)	72.00%	(64.77–78.25%)
AUC	0.923		0.975		0.802	

Table 3. The AUC, sensitivity, specificity, positive predictive value (PPV) and negative predictive value (NPV) of the 6M50LSG scoring system in the score generator, internal validation, and external validation groups. *AUC* area under the curve, *NPV* negative predictive value, *PPV* positive predictive value.

External validation. The 6M50LSG scoring system was applied to the external validation group, which included 493 of 811 patients at two additional sites after applying inclusion criteria (Table 3). When the score was > 1, the model had 90.35% (95% CI 86.77–93.15%) sensitivity, 68.57% (95% CI 59.51–76.01%) specificity, 88.59% (95% CI 85.78–90.90%) PPV, and 72.00% (95% CI 64.77–78.25%) NPV. The AUC was 0.802 ($p < 0.001$).

Long term followed up. The weight loss in the following period was listed in Fig. 1 and Table 4. The percentage of followed up in 1 year after LSG (POY1) is 79.4% and 53.7% in 2 years after LSG (POY2). Those patient with more than 50% EBWL 6-months after LSG had a significantly higher weight loss in POY 1 (Less 50% EBWL Group vs. more than 50% EBWL Group: EBWL 53.16% vs. 77.28%, $p < 0.001$) and POY 2 (Less 50% EBWL Group vs. more than 50% EBWL Group: EBWL 60.77% vs. 83.50%, $p < 0.001$). However, the weight difference between POY 1 and POY 2 is similar (Less 50% EBWL Group vs. more than 50% EBWL Group: Difference EBWL 2.36% vs. 2.18%, $p = 0.945$).

Applying the scoring system proactively. From 2019/01 to 2019/05, 28 consecutive patients underwent LSG in our institution. Eight of them did not meet postoperative weight loss goals, including 3 with 1 month EBWL ≤ 19.5% and 5 with 1 month EBWL > 19.5% but 3 month EBWL ≤ 37.7%. We increased the follow-up to monthly visits through postoperative month 6. Moreover, we asked these patients to complete photo food records and upload them via social media software to help dietitians correct their eating habits and food selection. Compared to previous patients who did not meet weight goals (Table 5), patients in 2019 had a higher rate of adequate weight loss but the difference was not significant. However, patients in 2019 had significantly higher 6 month EBWL than patients before 2019 (51.65% vs. 45.34%, $p = 0.026$) (Fig. 2).



	POM1	POM3	POM6	POM12	POM24
Followed up Numbers	160	160	160	127	58
Total Numbers	160	160	160	160	108
Follow up %	100.0%	100.0%	100.0%	79.4%	53.7%

Figure 1. Excessive body weight loss after LSG.

	EBWL-6M < 50%		EBWL-6M ≥ 50%		p
	N = 62		N = 98		
Postoperative body weight loss					
EBWL% 1M	19.52%	(5.20%)	26.99%	(6.61%)	< 0.001*
TBWL% 1M	9.24%	(2.00%)	11.10%	(10.72%)	< 0.001*
EBWL% 3M	32.51%	(7.38%)	47.69%	(10.51%)	< 0.001*
TBWL% 3M	15.47%	(3.01%)	19.71%	(3.80%)	< 0.001*
EBWL% 6M	42.99%	(8.22%)	65.78%	(13.67%)	< 0.001*
TBWL% 6M	20.56%	(3.83%)	27.24%	(5.22%)	< 0.001*
EBWL% 1Y	53.16%	(13.37%)	77.28%	(16.19%)	< 0.001*
TBWL% 1Y	25.90%	(7.27%)	32.24%	(7.38%)	< 0.001*
EBWL% 2Y	60.77%	(18.51%)	83.50%	(17.47%)	< 0.001*
TBWL% 2Y	29.75%	(9.41%)	34.70%	(8.70%)	0.048*
Difference EBWL% POY2-POY1	2.36%	(7.45%)	2.18%	(10.35%)	0.945
Difference TBWL% POY2-POY1	1.30%	(3.81%)	1.15%	(4.04%)	0.899
Difference body weight POY2-POY1(Kg)	-1.77	(5.06)	-1.28	(4.04)	0.701

Table 4. Body weight loss after LSG. BMI body mass index, EBWL excess body weight loss. *p < 0.05.

	Before 2019		2019		p value
	N = 87		N = 8		
Age (y), mean (± SD)	36.61	(10.32)	32.64	(9.92)	0.300
Gender (no., %)					0.472
Female	55	63.22	4	50.00	
Male	32	36.78	4	50.00	
BMI mean (± SD)	43.60	(5.26)	49.29	(8.74)	0.007*
Adequate weight loss	21	24.13	3	37.50	0.412
Postoperative results					
EBWL 1-month	18.96%	(3.96%)	20.03%	(2.43%)	0.321
EBWL 3-month	32.32%	(6.02%)	34.57%	(4.77%)	0.307
EBWL 6-month	45.34%	(10.86%)	51.65%	(7.56%)	0.026*

Table 5. Clinical characteristics of patients who did not meet the goal after LSG. BMI body mass index, EBWL excess body weight loss. * $p < 0.05$.

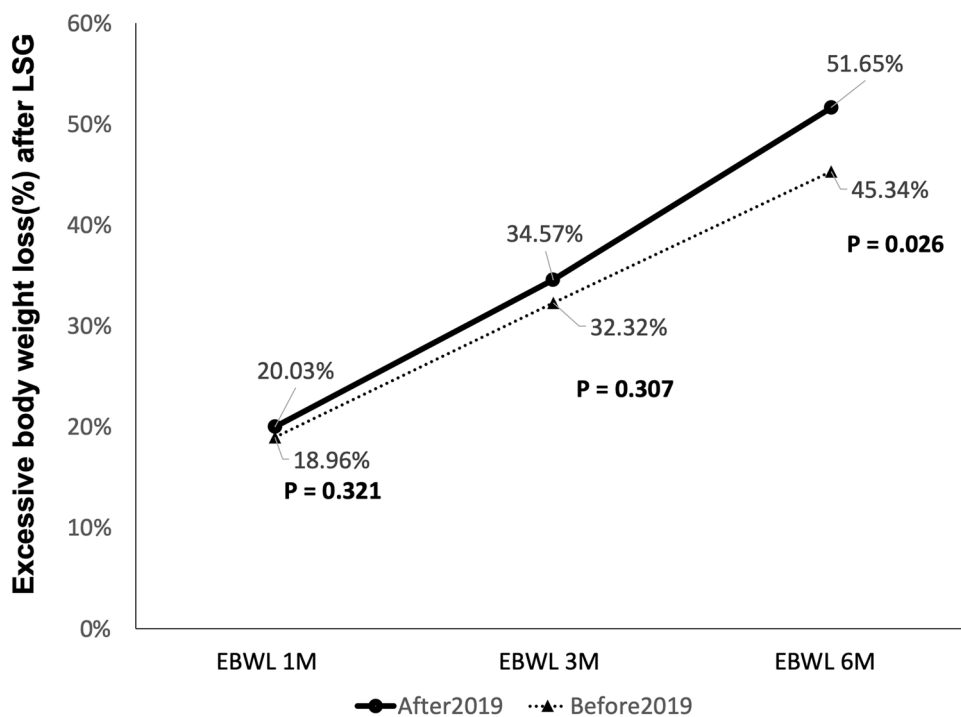


Figure 2. Excessive body weight of patients who did not meet the goal after LSG.

Discussion

In this study, we generated the 6M50LSG scoring system to predict adequate weight loss ($\geq 50\%$ EBWL) within 6 months after LSG. Results from the 3 data sets tested show that the 6M50LSG scoring system has outstanding discrimination.

In the literature, the target for adequate weight loss after LSG has been reported as 50% EBWL within 6-months¹³, 50% EBWL within 1-year⁵, 55% EBWL within 1-year⁹, 50% EBWL within 2-years^{14,15}, and even 50% EBWL within 3-years¹⁰. Our results used a relatively shorter follow-up period in comparison. However, it was reported that the strength of association between maximum weight loss and %EBWL in the immediate postoperative period and the first 3-months after LSG is twice as strong as in RYGB⁸. Moreover, Kanerva et al.¹¹ demonstrated that in the short-term, considered 3 months after bariatric surgery, changing dietary macronutrient composition was associated with 10-year weight change. Better weight loss at 10 years was seen with diets higher in the proportion of protein than fat, higher in carbohydrate than fat, and higher in protein than carbohydrates.

Reported predictors for poor postoperative weight loss have included older age^{2,16,17}, male sex¹⁵, earlier age of onset of obesity¹⁸, higher baseline BMI, preoperative weight gain, wait time before surgery, hypertension and diabetes^{2,17,18}. In addition, biomarkers associated with weight loss outcomes include alanine transaminase (ALT), aspartate transaminase (AST), white blood cell counts (WBC), insulin and hemoglobin A1c (HbA1c) levels¹⁹, preoperative triglyceride level¹⁴. Specific genotypes¹⁵ and race/ethnicity independent of health status and lifestyle

behaviors²⁰ have also been associated with postoperative weight loss. Preoperative mental status measured by pre-surgical cognitive function, personality, mental health, composite psychological variables, binge eating²¹, emotional food cravings²², history of physical abuse²³, and egoism²⁴ are also predictors. Some mental health diagnoses, including binge eating disorder¹⁶, can also predict long-term weight loss effects. However, these risk factors were identified from patients who received gastric band, Roux-en-Y gastric bypass, or one-anastomosis gastric bypass surgery.

Predictors for weight loss after LSG include gender, diabetes, preoperative obstructive sleep apnea (OSA), retired status²⁵, the bougie size²⁶, and the speed of contrast pass in the postoperative swallow study²⁷. Patients with less than 12 months from surgery to steady-state, defined as the month when the patient has $\leq 3\%$ EBWL, had a significantly lower weight loss at the 3- to 4-year follow-up compared to those with more than 12 months to steady-state²⁸. Postoperative clinic non-attendance was also reported as a weight loss predictor. Missing at least 50% of postoperative visits was associated with less weight loss at 2-years²⁹. Huang et al.³⁰ also presented patients who had age less than 50 years old, preoperative alcohol consumption, without psychiatric history. Since many of these factors are not known before or immediately after surgery, it is difficult to advise caregivers when to implement more aggressive interventions to help patients achieve adequate weight loss.

Our scoring system uses a follow-up period as short as 1-month after LSG to more quickly identify patients with poor treatment response. For these patients, clinicians can intervene with more intensive clinic follow-ups, dietary education and evaluation, exercise programs, behavior modification, and support groups. Moreover, the scoring system can be used to assess EBWL associated with barriers to good habits and review the current treatment regimens to control depression, anxiety, and binge eating^{31–34}. We believe these interventions offer better results in short-term weight loss as well as a higher chance of comorbidity remission, lower comorbidity recurrence, and lower risk of weight regain^{4,5,35}.

There are weight loss predictor models generated from LSG. Cottam et al.⁹ established a prediction model based on comorbidities, including diabetes and/or sleep apnea, and the %EWL at 1-and 3-months after LSG to predict %EWL > 55% at 1 year. It had a 71% sensitivity, 91% specificity, 72% PPV and 91% NPV, but has not been validated. Van de Laar et al.³ presented bariatric weight loss charts with standard deviation and percentile curves based on weights measured after LSG from 3 large bariatric centers in the Netherlands. It aims to assess weight loss, weight-regain, and poor responders up to 7 years after sleeve gastrectomy and was validated by large studies ($n > 500$), reporting weight loss results after LSG with BMI > 35 kg/m² and age ≥ 18 years with a minimum of 5-years follow-up. Although these are useful tools for predicting weight loss after LSG, they are not validated in Asian patients. Our results were generated from Asian populations, validated by Asian population and similarly showed that the weight loss in postoperative months 1 and 3 is important to identify patients who may be responding poorly to bariatric surgery. We believed the scoring system, 6M50LSG scoring system, can provide a reliable and objective evaluation to Asian patients who receive LSG.

There were limitations to our study. First, the retrospective, single-center non-randomized series design had a relatively small sample size, limiting the generalizability of our findings. Secondly, we excluded about half of the patients (150/334) due to incomplete data, which was not ideal for optimizing the model. To overcome this limitation, we separated the patients into two groups based on the surgeon to eliminate potential bias. Also, we included data from another hospital to strengthen the validity of our findings. Finally, we did not apply regular polysomnography to identify patients with OSA. However, we applied this scoring to patients with preoperatively diagnosed OSA and the model still had an acceptable ability to predict $\geq 50\%$ EBWL after LSG.

Conclusions

The 6M50LSG scoring system presented in this study provides a reliable and objective evaluation to closely monitor patients as early as 1- to 3-months post LSG, and apply more aggressive clinical follow-up, nutrition education, and lifestyle interventions to ensure an adequate EBWL in Asian population.

Received: 15 January 2020; Accepted: 17 July 2020

Published online: 30 July 2020

References

1. Livhits, M. *et al.* Preoperative predictors of weight loss following bariatric surgery: systematic review. *Obes. Surg.* **22**, 70–89. <https://doi.org/10.1007/s11695-011-0472-4> (2012).
2. Al-Khyatt, W., Ryall, R., Leeder, P., Ahmed, J. & Awad, S. Predictors of inadequate weight loss after laparoscopic gastric bypass for morbid obesity. *Obes. Surg.* **27**, 1446–1452. <https://doi.org/10.1007/s11695-016-2500-x> (2017).
3. van de Laar, A. W. *et al.* The Dutch bariatric weight loss chart: a multicenter tool to assess weight outcome up to 7 years after sleeve gastrectomy and laparoscopic Roux-en-Y gastric bypass. *Surg. Obes. Relat. Dis.* **15**, 200–210. <https://doi.org/10.1016/j.soard.2018.11.024> (2019).
4. van de Laar, A. W., de Brauw, L. M. & Meesters, E. W. Relationships between type 2 diabetes remission after gastric bypass and different weight loss metrics: arguments against excess weight loss in metabolic surgery. *Surg. Obes. Relat. Dis.* **12**, 274–282. <https://doi.org/10.1016/j.soard.2015.07.005> (2016).
5. Obeidat, F. & Shanti, H. Early weight loss as a predictor of 2-year weight loss and resolution of comorbidities after sleeve gastrectomy. *Obes. Surg.* **26**, 1173–1177. <https://doi.org/10.1007/s11695-015-1903-4> (2016).
6. Mor, A., Sharp, L., Portenier, D., Sudan, R. & Torquati, A. Weight loss at first postoperative visit predicts long-term outcome of Roux-en-Y gastric bypass using Duke weight loss surgery chart. *Surg. Obes. Relat. Dis.* **8**, 556–560. <https://doi.org/10.1016/j.soard.2012.06.014> (2012).
7. Slotman, G. J. Prospectively validated preoperative prediction of weight and co-morbidity resolution in individual patients comparing five bariatric operations. *Surg. Obes. Relat. Dis.* **13**, 1590–1597. <https://doi.org/10.1016/j.soard.2017.04.013> (2017).
8. Manning, S. *et al.* Early postoperative weight loss predicts maximal weight loss after sleeve gastrectomy and Roux-en-Y gastric bypass. *Surg. Endosc.* **29**, 1484–1491. <https://doi.org/10.1007/s00464-014-3829-7> (2015).

9. Cottam, A. *et al.* Long-term success and failure with SG is predictable by 3 months: a multivariate model using simple office markers. *Surg. Obes. Relat. Dis.* **13**, 1266–1270. <https://doi.org/10.1016/j.soard.2017.03.016> (2017).
10. Chew, C. A. Z. *et al.* Early weight loss after laparoscopic sleeve gastrectomy predicts midterm weight loss in morbidly obese Asians. *Surg. Obes. Relat. Dis.* **13**, 1966–1972. <https://doi.org/10.1016/j.soard.2017.05.016> (2017).
11. Kanerva, N., Larsson, I., Peltonen, M., Lindroos, A. K. & Carlsson, L. M. Changes in total energy intake and macronutrient composition after bariatric surgery predict long-term weight outcome: findings from the Swedish Obese Subjects (SOS) study. *Am. J. Clin. Nutr.* **106**, 136–145. <https://doi.org/10.3945/ajcn.116.149112> (2017).
12. Changchien, T. C., Tai, C. M., Huang, C. K., Chien, C. C. & Yen, Y. C. Psychiatric symptoms and leptin in obese patients who were bariatric surgery candidates. *Neuropsychiatr. Dis. Treat.* **11**, 2153–2158. <https://doi.org/10.2147/NDT.S88075> (2015).
13. Madan, A. K., Dhawan, N., Coday, M. & Tichansky, D. S. Patients who are delayed from undergoing bariatric surgery do not have improved weight loss. *Obes. Surg.* **18**, 278–281. <https://doi.org/10.1007/s11695-007-9385-7> (2008).
14. Lee, Y. C. *et al.* Prediction of successful weight reduction after bariatric surgery by data mining technologies. *Obes. Surg.* **17**, 1235–1241 (2007).
15. Lee, Y. C. *et al.* Prediction of successful weight reduction after laparoscopic adjustable gastric banding. *Hepatogastroenterology* **56**, 1222–1226 (2009).
16. Marek, R. J., Ben-Porath, Y. S., Dulmen, M., Ashton, K. & Heinberg, L. J. Using the presurgical psychological evaluation to predict 5-year weight loss outcomes in bariatric surgery patients. *Surg. Obes. Relat. Dis.* **13**, 514–521. <https://doi.org/10.1016/j.soard.2016.11.008> (2017).
17. Ma, Y. *et al.* Predictors of weight status following laparoscopic gastric bypass. *Obes. Surg.* **16**, 1227–1231. <https://doi.org/10.1381/096089206778392284> (2006).
18. Sillén, L. & Andersson, E. Patient factors predicting weight loss after Roux-en-Y gastric bypass. *J. Obes.* **2017**, 3278751 (2017).
19. Lee, Y. C. *et al.* Obesity and the decision tree: predictors of sustained weight loss after bariatric surgery. *Hepatogastroenterology* **56**, 1745–1749 (2009).
20. Coleman, K. J. & Brookey, J. Gender and racial/ethnic background predict weight loss after Roux-en-Y gastric bypass independent of health and lifestyle behaviors. *Obes. Surg.* **24**, 1729–1736. <https://doi.org/10.1007/s11695-014-1268-0> (2014).
21. Wimmelman, C. L., Dela, F. & Mortensen, E. L. Psychological predictors of weight loss after bariatric surgery: a review of the recent research. *Obes. Res. Clin. Pract.* **8**, e299–313. <https://doi.org/10.1016/j.orcp.2013.09.003> (2014).
22. Janse Van Vuuren, M. A., Strodl, E., White, K. M. & Lockie, P. D. Emotional food cravings predicts poor short-term weight loss following laparoscopic sleeve gastrectomy. *Br. J. Health Psychol.* **23**, 532–543. <https://doi.org/10.1111/bjhp.12302> (2018).
23. Wedin, S. *et al.* Emotional eating, marital status and history of physical abuse predict 2-year weight loss in weight loss surgery patients. *Eat. Behav.* **15**, 619–624. <https://doi.org/10.1016/j.eatbeh.2014.08.019> (2014).
24. Larsen, J. K. *et al.* Personality as a predictor of weight loss maintenance after surgery for morbid obesity. *Obes. Res.* **12**, 1828–1834. <https://doi.org/10.1038/oby.2004.227> (2004).
25. Jambhekar, A., Maselli, A., Robinson, S., Kabata, K. & Gorecki, P. Demographics and socioeconomic status as predictors of weight loss after laparoscopic sleeve gastrectomy: a prospective cohort study. *Int. J. Surg.* **54**, 163–169. <https://doi.org/10.1016/j.ijsu.2018.04.025> (2018).
26. Abd Ellatif, M. E. *et al.* Long term predictors of success after laparoscopic sleeve gastrectomy. *Int. J. Surg.* **12**, 504–508. <https://doi.org/10.1016/j.ijsu.2014.02.008> (2014).
27. Goitein, D. *et al.* Postoperative swallow study as a predictor of intermediate weight loss after sleeve gastrectomy. *Obes. Surg.* **23**, 222–225. <https://doi.org/10.1007/s11695-012-0836-4> (2013).
28. Kindel, T., Lomelin, D., McBride, C., Kothari, V. & Thompson, J. The time to weight-loss steady state after gastric bypass predicts weight-loss success. *Obes. Surg.* **26**, 327–331. <https://doi.org/10.1007/s11695-015-1754-z> (2016).
29. Shilton, H. *et al.* Pre-operative bariatric clinic attendance is a predictor of post-operative clinic attendance and weight loss outcomes. *Obes. Surg.* **29**, 2270–2275. <https://doi.org/10.1007/s11695-019-03843-2> (2019).
30. Huang, C.-W. *et al.* Predicted weight loss result of laparoscopic sleeve gastrectomy: review of the first 82 consecutive patients in an Asian bariatric unit. *Asian J. Surg.* **42**, 373–378 (2019).
31. Cook, C. M. & Edwards, C. Success habits of long-term gastric bypass patients. *Obes. Surg.* **9**, 80–82 (1999).
32. Livhits, M. *et al.* Exercise following bariatric surgery: systematic review. *Obes. Surg.* **20**, 657–665. <https://doi.org/10.1007/s11695-010-0096-0> (2010).
33. van de Laar, A. W., de Brauw, M., Bruin, S. C. & Acherman, Y. I. Weight-independent percentile chart of 2880 gastric bypass patients: a new look at bariatric weight loss results. *Obes. Surg.* **26**, 2891–2898. <https://doi.org/10.1007/s11695-016-2200-6> (2016).
34. Herpertz, S., Kielmann, R., Wolf, A. M., Hebebrand, J. & Senf, W. Do psychosocial variables predict weight loss or mental health after obesity surgery? A systematic review. *Obes. Res.* **12**, 1554–1569. <https://doi.org/10.1038/oby.2004.195> (2004).
35. Karmali, S. *et al.* Weight recidivism post-bariatric surgery: a systematic review. *Obes. Surg.* **23**, 1922–1933. <https://doi.org/10.1007/s11695-013-1070-4> (2013).

Acknowledgements

The authors gratefully acknowledge the grant support of the E-Da Hospital, Taiwan and IRB (EDAHP-107-011, EDAHI-109-001).

Author contributions

Conceptualization: C.H.L., W.Y.Y., M.H.L., J.H.C., C.Y.C. Methodology: M.H.C., J.H.C., C.Y.C., W.L.C. Data curation: J.H.C., W.L.C., C.Y.C. Writing articles: C.Y.C., J.H.C. Preparing tables and Figures: H.M.L., W.L.C.

Competing interests

The authors declare that they have no competing interests.

Additional information

Correspondence and requests for materials should be addressed to J.-H.C.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2020