TESTING MASS LOSS IN LARGE MAGELLANIC CLOUD CEPHEIDS USING INFRARED AND OPTICAL OBSERVATIONS

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ABSTRACT

It has been claimed that period-luminosity (P–L) relations derived from infrared observations of Large Magellanic Cloud (LMC) Cepheids are less dependent on the metallicity of the Cepheids. In this work, infrared observations of LMC Cepheids from the SAGE survey are combined with OGLE II optical observations to model and predict mass-loss rates. The mass-loss rates are fit to the data and are predicted to range from about $10^{-12}$ to $10^{-11} M_\odot$/yr; however, the rates depend on the assumed value of the dust-to-gas ratio. By comparing the relations derived from observations to the relations derived from predicted infrared stellar luminosities from the mass-loss model, it is shown that mass loss affects the structure and scatter of the infrared P–L relation. Mass loss produces shallower slopes of the infrared relations and a lower zero point. There is also evidence for nonlinearity in the predicted P–L relations, and it is argued that mass loss produces larger infrared excess at lower periods, which affects the slope and zero point, making the P–L relations more linear in the wavelength range of 3.6 to 5.8 μm. Because the dust-to-gas ratio is metallicity dependent and mass loss may have a metallicity dependence, infrared P–L relations have additional uncertainty due to metallicity.

Key words: Cepheids – circumstellar matter – Magellanic Clouds – stars: mass loss

1. INTRODUCTION

Cepheids are powerful standard candles because they follow a period–luminosity (P–L) relation. This relation has been determined using Cepheids in the Large Magellanic Cloud (LMC) in optical and near infrared bands (Laney & Stobie 1994). LMC Cepheids also provide insight into stellar astrophysics as they have lower metallicity relative to Galactic Cepheids, which has an effect on the pulsation of Cepheids.

Recently, infrared P–L relations have been derived using Spitzer observations from the SAGE program (Meixner et al. 2006) by Ngeow & Kanbur (2008) and by Freedman et al. (2008). These infrared P–L relations are important for extragalactic studies, and this will be even more so when the James Webb Space Telescope begins operation. The infrared P–L relations are powerful tools because metallicity does not contribute significantly (Freedman et al. 2008) and because the pulsation amplitude decreases in the infrared. However, IRAS observations have found infrared excesses in Galactic Cepheids (Deasy 1988). Interferometric observations have also detected the existence of circumstellar envelopes around a number of Galactic Cepheids (Kervella et al. 2006; Mérand et al. 2006, 2007) in the $K$ band. The observations of infrared excess imply that there may be an additional uncertainty in infrared P–L relations, and the excesses may play a role in LMC Cepheids.

One proposed mechanism for generating circumstellar shells and infrared excesses about Galactic Cepheids is a stellar wind similar to those generated from other evolved pulsating stars. Mass loss is believed to generate shells about asymptotic giant branch stars (where the mass-loss rates are related to pulsation and dust condensation in the atmospheres, in both the Milky Way and the LMC; Mattsson et al. 2008). One would not expect dust to form in the atmospheres of Cepheids because the temperatures are greater than 1500 K, and dust driving is not a plausible mechanism to generate a stellar wind. However, it has been argued that Galactic Cepheids use pulsation and shocks generated by pulsation to eject mass (Willson 1989). Neilson & Lester (2008) developed an analytic model to study the affect of pulsation and shocks, in combination with radiative-line driving, on mass-loss rates in Galactic Cepheids, predicting rates of the order $10^{-10}$ to $10^{-7} M_\odot$/yr. It is argued that at some large distance from the surface of the Cepheid, the wind cools enough that a small fraction of the gas condenses into a dust shell that produces an infrared excess. The predicted infrared excesses from the theoretical model are consistent with both interferometric observations and IRAS observations (Deasy 1988). The analytic model was also applied to theoretical models of Cepheids with the metallicities of the Small and Large Magellanic Clouds, and the Galaxy, and mass loss was found to be significant in Magellanic Cloud Cepheids as well (Neilson & Lester 2009). This result, however, has not been tested by observations.

The dust shells that surround Cepheids are optically thin because they form at large distances from the Cepheids. For instance, a Cepheid with $T_{\text{eff}} = 6000$ K will have a condensation radius of $r_c/R_\star = 0.5(T_c/T_{\text{eff}})^{-5/2} = 16$, assuming a condensation temperature of 1500 K. At the distance where dust forms, the dust shells are optically thin, and do not contribute to the extinction of starlight.

Mass loss may also be a solution to the Cepheid mass discrepancy problem. The Cepheid mass discrepancy is the difference between Cepheid mass estimates based on stellar evolution isochrones and those based on stellar pulsation calculations. The mass discrepancy is about 10%–20% in the Milky Way (Caputo et al. 2005), about 17%–25% in the LMC, and about 20% in the SMC (Brocato et al. 2004; Keller & Wood 2006). Keller & Wood (2006) determined that the mass discrepancy increases as the metallicity decreases, and Caputo et al. (2005) argue that the discrepancy may also be a function of mass, though Keller (2008) provides evidence against this result. For mass loss to
be a solution to the mass discrepancy, a Cepheid that starts on its first crossing with mass of 5\(M_\odot\) would need to lose about 1\(M_\odot\) or have an average mass-loss rate in the range of \(10^{-8}\) to \(10^{-6}\) \(M_\odot/\text{yr}\).

The purpose of this work is to model infrared excess in LMC Cepheids using SAGE observations in the IRAC bands combined with OGLE II observations of \(B, V,\) and \(I\) (Udalski et al. 1999a, 1999b). The next section outlines the observations and the model describing circumstellar dust created in a stellar wind that causes infrared excess. The process for determining the mass-loss rates is also described. The results are given in Section 3 and the predicted infrared P–L relations are described in Section 4. The fifth section will explore possible driving mechanisms for mass loss in LMC Cepheids, testing if the mass loss behavior is similar to that proposed in Neilson & Lester (2008, 2009).

2. THE DATA AND MASS-LOSS MODEL

We use OGLE II and SAGE observations of LMC Cepheids to determine mass-loss rates. The OGLE II data are for \(B, V,\) and \(I\) magnitudes while the SAGE magnitudes are in IRAC bands at wavelengths 3.6, 4.5, 5.8, and 8.0 \(\mu\)m. The SAGE data we used are adopted from Ngeow & Kanbur (2008), which consist of 730 OGLE II LMC Cepheids with \(\log P > 0.4\). However, we only use 488 of these Cepheids that have at least three IRAC bands and two of the \(BV\) bands from this data set. The SAGE data are compiled by matching the position of OGLE II Cepheids with positions of infrared sources in the SAGE observations. Ngeow & Kanbur (2008) match sources if they are within 3.5 arcsec of the position of the OGLE II Cepheids. Figure 1 shows the infrared P–L relations constructed using the IRAC magnitudes. A number of (mostly short period) Cepheids appear to deviate from the infrared P–L relations, implying there is some infrared excess.

There are three possible causes of the infrared flux excess: (1) blending of stars in SAGE observations, (2) false matches of the infrared sources to the OGLE II Cepheids, (3) or circumstellar dust shells forming at a significant distance from the Cepheids in a stellar wind. It is possible that false matches contaminate the sample, and we check this in Figure 2 where the magnitude residuals of the IR P–L relations determined by Ngeow & Kanbur (2008) are shown as a function of the separation between the OGLE II and SAGE positions. Although the search radius used in Ngeow & Kanbur (2008) is rather large, most of the matched objects have a separation less than 0.77 arcsec (as demonstrated in the Figure 1 and Table 1 in Ngeow & Kanbur (2008)).

The potential for false matches is only significant for a small fraction of the total sample of Ngeow & Kanbur (2008), and in the sample used here, only 10 of the 488 Cepheid matches have a separation greater than 1.3 arcsec, which is the separation where the matches almost all have large residuals to the fit of the P–L relation. There is another asymmetry apparent in Figure 2 where the residuals have a separation less than 0.4 arcsec. In this work, we keep the two samples, but identify them in the figures when important.

We can test if the infrared excess is due to mass loss by calculating the sum of the infrared luminosity of the Cepheid and the luminosity of the dust that is generated in the wind, given by

\[
L_{\nu,\text{Shell}} = \frac{3}{4\pi} \langle a^2 \rangle \rho_v d \int_{R_0}^\infty B_\nu(T_d)(1 - W(r)) dr.
\]

The dust shell luminosity is proportional to the ratio of the mean cross section, \(\langle a^2 \rangle\), and volume, \(\langle a^3 \rangle\), of the dust particles, and inversely proportional to the mass density of dust particles, \(\rho_v\). The dust mass-loss rate is given by \(\dot{M}_d\), the dust velocity is \(v_d\), and \(Q_\nu^A\) is the absorption efficiency. The term in the integral is the product of the blackbody radiation of the dust with temperature \(T_d\) and the geometric dilution factor \(W(r) = [1 - \sqrt{1 - (R_c/r)^2}]^2\) at a distance \(r\) from the surface of the Cepheid.

To predict the dust shell luminosity, we need to specify the properties of the dust. The dust grain size is assumed to range from 0.005 \(\mu\)m to 0.25 \(\mu\)m, which yields a value \(\langle a^2 \rangle/\langle a^3 \rangle \approx 40 \mu\)m based on the method of Mathis et al. (1977). Assuming the dust is primarily graphite, the absorption will be concentrated at optical wavelengths, giving an absorption efficiency of \(Q_\nu^A \approx 2\). This further implies that the mean density of the grains is \(\rho = 2.2 \text{ g cm}^{-3}\). The dust velocity, equivalent to the terminal velocity of a wind, is about 100 km s\(^{-1}\), approximately equivalent to the escape velocity of a Cepheid. The integral is computed from the surface of a Cepheid but dust does not form in the wind until the material is at a condensation distance \(r_c = (R_c/2)(T_d/1500K)^{5/2}\), where dust condenses at a temperature of 1500 K. The dust temperature at distance \(r\) from the star, greater than the condensation distance, is \(T_d(r) = T_0W(r)^{1/3}\). This leaves the dust mass-loss rate, stellar radius, and effective temperature as unknowns in Equation (1).

The gas mass-loss rate is found by assuming a dust-to-gas ratio. The typical ratio assumed for the Milky Way ISM is
1/100, and this ratio was used in previous studies for mass loss in Galactic Cepheids (McAlary & Welch 1986). The dust-to-gas ratio in the LMC must be significantly smaller than 1/100 because the formation of dust depends on the metallicity of the gas. For this work, a value of the LMC dust-to-gas ratio is assumed to be 1/250 found by scaling the Milky Way dust-to-gas ratio by the ratio of the average LMC metallicity of $Z = 0.008$ to the standard solar metallicity $Z_\odot = 0.02$. This choice of dust-to-gas ratio leads to a gas mass-loss rate that is a lower limit. The dust-to-gas ratio in the LMC has been observed to be approximately one-quarter the Galactic value (Clayton & Martin 1985) to about one-tenth the Galactic value (Weingartner & Draine 2001). Therefore a gas mass-loss rate may be smaller than would be predicted using other dust-to-gas ratios. The dust velocity, which is also the terminal velocity of the gas wind, is chosen to be approximately the escape velocity, but the dust velocity may range from about 75–150 km s$^{-1}$, leading to an uncertainty of about 50%.

The mean luminosity of a Cepheid at frequency $\nu$ is given by

$$L_{\nu,\text{Star}} = 4\pi R_\star^2 \pi B_\nu(T_{\text{eff}}),$$

meaning the stellar luminosity is dependent on the radius and effective temperature. We check if a blackbody is a reasonable approximation by comparing blackbody $B$, $V$, $I$ brightnesses with the $B$, $V$, and $I$ magnitudes from an ATLAS stellar atmosphere model Kurucz (1979) with an effective temperature of 6000 K and $\log g = 1$. The model atmosphere is consistent with Cepheid properties and the $B$, $V$, $I$ magnitudes agree with blackbody brightnesses to within a few tenths of a magnitude. The infrared observations are well approximated by a blackbody brightness because these wavelengths are in the tail of the blackbody function at 6000 K. The different predicted brightnesses will affect the uncertainty of the mass-loss model but not greatly. This leaves three unknown variables for fitting the observations: the dust mass-loss rate, the stellar radius, and the effective temperature. The effective temperature may be determined using the relation determined by Beaulieu et al. (2001)

$$\log T_{\text{eff}} = 3.930122 + 0.006776 \log P - 0.2487(V - I)_0.$$

The relation is dependent on the pulsation period and de-reddened color.

To compare the predicted total luminosity (stellar plus shell) of the LMC Cepheids with the observed fluxes, we need to adopt a distance modulus. Our choice is $18.5 \pm 0.1$ for the LMC, which is approximately the mean distance modulus (e.g., Catelan & Cortés 2008; Clement et al. 2008), although the value ranges from 18.4 to 18.7.

The errors for the optical and infrared observations are likely to be negligible compared to other uncertainties, so we assume that the error for each optical wavelength is 0.1 magnitudes, due to the uncertainty of the distance to the Cepheids to determine the absolute magnitudes and the error for the infrared observations is 0.2 magnitudes based on the distance uncertainty. The main sources of error are the thickness of the LMC (Lah et al. 2005), error in the observations themselves and that the infrared observations may not be the mean brightness of Cepheids. In fact, a thickness of about 5% of the distance to the LMC corresponds to an error of 0.1 mag.

The $BVI$ observations are also de-reddened while it is assumed that the extinction of the infrared light is negligible. The color excess $E(B-V)$ is given in the OGLE II data for each Cepheid and is on average \approx 0.15. The extinction for the $BVI$ is calculated in the same way as in Udalski et al. (1999b), while the extinction in the infrared is significantly less than 0.1 magnitudes.

3. QUALITY OF FIT OF MASS-LOSS RATES

Having described the method for predicting stellar fluxes over the seven bands, we fit the mean radius and dust mass-loss rate, and hence the gas mass-loss rate, using $\chi^2$ fitting, for each...
The mass-loss rates range from $10^{-12}$ to $10^{-8} \, M_\odot/\text{yr}$, with the values of $\chi^2$ ranging from about 1.1 to about 23. The large majority of Cepheids appear well fit by a mass-loss model that forms dust at some distance from the surface of the Cepheid. These predicted mass-loss rates are significant, $10^{-9} \, M_\odot/\text{yr}$, and, depending on the dust-to-gas ratio and dust grain properties, the gas mass-loss rates may be an order of magnitude larger or even more. These gas mass-loss rates are the minimum mass-loss rates for the LMC Cepheids.

We also quantify the uncertainty of the mass-loss rates caused by the unknown phase of the infrared observations by computing the best $\chi^2$ fits for the mass-loss rate, radius, and the quantity $dm$ that was defined earlier, and we compute the values of $\delta \ln(M)/\delta(dm)$ for a random, with respect to period, subsample of 100 of the Cepheids. This error is a function of both the pulsation amplitude, and the mass-loss rate. We show the values of $\delta \ln(M)/\delta(dm)$ as a function of $M$ in Figure 6. The uncertainty is related to the mass-loss rate, and, as one would expect, the uncertainty of the pulsation amplitude is less important for larger predicted mass-loss rates. We highlight the boundary where the uncertainty of the mass-loss rate is 100% for a pulsation amplitude of 0.5 magnitudes, which represents...
the maximum infrared pulsation amplitude. This implies that Cepheids with predicted mass-loss rates $>10^{-9}M_{\odot}/\text{yr}$ have infrared excesses that cannot be explained solely by pulsation phase, and a number of Cepheids with mass-loss rates $<10^{-9}M_{\odot}/\text{yr}$ have uncertainties $\delta \ln(M)/\delta (dm) < 4$. As the IR pulsation amplitudes become known we will be able to probe smaller mass-loss rates with more certainty.

The model is also tested by comparing the two parameter fits, with the mass-loss rate and radius as the two degrees of freedom, to fits using just the radius as the only degree of freedom. We use the $F$-test to quantify the significance of the mass-loss model. The $F$-test is described by Kanbur & Ngeow (2004a; see also Ngeow & Kanbur 2008, and references therein); for each Cepheid we calculate the value of $F$. For the majority of Cepheids, the fit of the radius has only six degrees of freedom while the mass-loss model has five. Some of the Cepheids have one less degree of freedom for each model respectively. The values of $F$ are shown in Figure 7 against the values of $\chi^2$ for the mass-loss model.

The values of $F > 5$ mean that we can state with 95% confidence that the mass-loss model is significant relative to fitting the radius alone. This provides no information into the possibility of blending, for instance, so we also take a cut of models with a value of $\chi^2 < 5$. This corresponds to the upper left quadrant of Figure 7 which contains 44 Cepheids. Therefore, we state with 95% confidence that approximately 9% of the sample of LMC Cepheids have circumstellar dust shells caused by stellar winds.

It is shown that 44 of the Cepheids are consistent with the mass-loss model, implying that the remainder of the sample is consistent with no mass loss. However, the value of $F$ is a function of the mass-loss rate, with $F$ increasing with $M$, as shown in Figure 7. Cepheids with values of $F < 5$ and $\chi^2 < 5$ in the lower left quadrant of Figure 7 with $\chi^2 < 5$ are consistent with mass loss but the observational errors are too large to state with certainty that all LMC Cepheids are undergoing mass loss. This suggests that the model needs to be tested with time series infrared observations to constrain the pulsation amplitude and reduce the uncertainty of the infrared observations. In the next section, we test what effect mass loss might have on the infrared P–L relation if the hypothesis is correct.

4. THE EFFECT OF MASS LOSS ON INFRARED PERIOD–LUMINOSITY RELATIONS

It has been postulated that mass loss generates dust in a circumstellar shell surrounding a Cepheid and this, in turn, affects the infrared P–L relation. By using the predicted stellar luminosities of the sample of Cepheids, we compute the stellar P–L relations, $m_\lambda = a \log P + b$, and compare them with results from Ngeow & Kanbur (2008) and Freedman et al. (2008). We also test the data for nonlinearity in the infrared P–L relations. In the fit, we do not include the Cepheids with large separations that were noted in the previous section, however, we do include those with separation less than 0.4 arcsec because they have randomly distributed mass-loss rates, in Figure 5, and hence have randomly distributed infrared excesses.

The predicted stellar luminosities of the LMC Cepheids in the mass-loss model are shown in Figure 8, together with a comparison of the linear and nonlinear P–L relations with the relations from Ngeow & Kanbur (2008) and Freedman et al. (2008). The nonlinear P–L relation is defined as two linear relations, the first for the period range of 1 to 10 days while the second is for the longer period range (Ngeow et al. 2005). The slopes, zero points, and dispersions of the fits for the linear and nonlinear fits are given in Table 1.
Figure 7. (Left) Calculation of the $F$-test for each Cepheid in the sample plotted in terms of the value of $\chi^2$ from the mass-loss model. The horizontal line represents the 95% confidence level that the mass-loss model is distinguished from fitting the mean radius only. The vertical line represents a cutoff of $\chi^2 = 5$ where we interpret $\chi^2 < 5$ as a reasonable fit. (Right) The values of $F$ as a function of the predicted mass-loss rates. The circled points represent those Cepheids that are likely false associations of the infrared observations and the triangles represent those with separations less than 0.4 arcsec.

Figure 8. (Left) Predicted stellar brightnesses of the LMC Cepheids as a function of period. (Right) The comparison of the best-fit linear and nonlinear P–L relations to the relations determined by Ngeow & Kanbur (2008) and Freedman et al. (2008) where we removed Cepheids with separation greater than 1.3 arcsec.

The linear P–L relations have smaller dispersion than the P–L relations from Ngeow & Kanbur (2008) for the two longer wavelengths and slightly larger dispersion for the two shorter infrared wavelengths. There are also notable differences in the slopes and the zero points. The zero points of the predicted 3.6 and 4.5 $\mu$m P–L relations are approximately the same as those determined by Ngeow & Kanbur (2008), while at longer wavelengths the differences are significant and also the predicted zero points tend to be a little brighter than the zero points found by Freedman et al. (2008). This is consistent with mass loss causing larger infrared excesses at longer wavelengths. The predicted slopes range from $-3.14$ at shorter wavelengths to $-3.18$ at longer wavelengths. This is a small change of slope as a function of wavelength, and it is roughly consistent with a constant slope within the errors given in Table 1. The slopes from Ngeow & Kanbur (2008) show the opposite behavior with the slopes becoming less steep with longer wavelength, contrary to the arguments in Freedman et al. (2008) who maintain the slope of the P–L relation should be steeper as a function of wavelength and approaches an asymptotic limit. In both cases the uncertainty of the slope is similar, ranging from 0.017 to 0.048 with increasing wavelength for Ngeow & Kanbur (2008), and about an average of 0.03 for Freedman et al. (2008). Therefore, the slopes from these two works and those predicted here do not agree within the uncertainty.
This shift in the behavior of the slopes of the infrared P–L relations is due to the removal of infrared excess caused by mass loss. This is best seen at 8.0 \( \mu m \) where the slope changes from about \(-3\) (Ngeow & Kanbur 2008) to \(-3.18\) when the contribution of brightness due to mass loss is removed, although the observed slope of \(-3\) may also be due to incompleteness of the data at the faint end of the P–L relation. The implication is that mass loss in short period Cepheids contributes significant luminosity, increasing the zero point and causing a shallower slope because the majority of the Cepheids in the sample have periods less than 10 days. The shallower slope implies that mass loss contributes fractionally less to the total infrared luminosity at longer periods because the stellar luminosity is already so large.

The analysis in the previous section showed that the mass-loss hypothesis is statistically unique from fitting only the radius of the Cepheid for about 44 Cepheids in the sample, or conversely that the majority of Cepheids in the sample are statistically consistent with zero mass loss. From this realization, we wish to compare the observed infrared brightness that we fit our model with and the predicted infrared brightness of the Cepheids. The comparison is shown in Figure 9 for the 8.0 \( \mu m \) data. At this wavelength, the differences are most apparent because a dust shell contributes a larger fraction of the total flux at longer wavelengths. We also compute best-fit linear relations for the observed data where the Cepheids with large separation and the 44 Cepheids where mass loss is shown to be likely are not used in the fitting. This relation is \( m_{\lambda,0.0001}^{\text{Observed}} = -2.905 \log P + 15.530 \) with a standard deviation of 0.219. For comparison, we derive the best-fit data using all of the 8.0 \( \mu m \) data from Ngeow & Kanbur (2008) and find \( m_{\lambda,0.0001}^{\text{Complete}} = -2.473 \log P + 15.058 \) with a standard deviation of 0.602. The relations given in Ngeow & Kanbur (2008) are determined using an iterative fitting method where a best-fit relation is determined and then any Cepheids with a brightness that is more than 3\( \sigma \) different are removed and a new P–L relation is computed and the process repeats until the P–L relation converges. Here, we compute the P–L relation using all of the data without the iterative approach. The linear relations are shown in Figure 9. Although we are only able to confidently state that 44 of the Cepheids are consistent with the mass-loss model, we note that there are significant differences between the predicted stellar brightnesses and observed data, and that these differences are reflected in the infrared P–L relations. It is also interesting that these 44 Cepheids are observed to be brighter than the majority of the sample but there are a number of Cepheids with similar brightness that are statistically consistent with zero mass loss.

The data are tested for nonlinearity in the infrared P–L relations. The hypothesis that the infrared P–L relations are nonlinear is tested with the \( F \)-test, as described in Kanbur & Ngeow (2004a) and Ngeow & Kanbur (2008) by comparing a P–L relation of the form

\[
m_{\lambda} = \begin{cases} 
\log P + b & \log P < 1 \\
\log P + d & \log P > 1 
\end{cases}
\]

with the standard linear P–L relation with two degrees of freedom. If the value of \( F > 3 \), the P–L relations are nonlinear with 95% confidence. Our values of \( F \), with increasing wavelength, are 7.89, 5.93, 5.78, and 5.50. The predicted stellar P–L relations are thus consistent with being nonlinear with a period break at 10 days. The predicted slopes and zero points are given in Table 1. However, there are two possible sources of error. The first is that we are assuming blackbody radiation that ignores any infrared absorption lines that may affect the structure of the P–L relations. The second is that there are significantly less data for periods greater than 10 days (approximately 50 data points).

The nonlinearity is related to the fact that the luminosities are given by the effective temperature; using the OGLE II data to derive effective temperatures may cause a nonlinear period–temperature relation because of nonlinearity in the OGLE II \( (V-I) \) period–color relation (Kanbur & Ngeow 2004b). This nonlinear period–temperature relation causes nonlinearity in the infrared predictions. This implies that the P–L relations given by only the stellar component is nonlinear in the wavelength range of 3.6 to 8.0 \( \mu m \) based on blackbody arguments, contradicting the results of Ngeow & Kanbur (2008) and Ngeow & Kanbur (2006) for the \( K \)-band P–L relation. There are two plausible reasons why this contradiction is found. Kanbur et al. (2004) argue the nonlinearity is due to the hydrogen ionization front (HIF) interacting with the photosphere, causing significant temperature variations in the layers of the Cepheids that emit mostly in the optical; at longer wavelengths this interaction becomes less significant. This implies that the mean effective temperature at shorter periods is affected by the HIF while at longer periods the effective temperature is just what would be expected for a nonpulsating star. At infrared wavelengths, most of the radiation is emitted higher in the stellar atmosphere.

![Figure 9](image-url)  
*Figure 9.* Comparison of the predicted stellar and the observed fluxes of the sample of Cepheids. The 44 Cepheids, where the mass-loss model is statistically unique, are shown as squares. The lines represent the predicted stellar flux, the observed stellar flux of the sample and that of the complete set from Ngeow & Kanbur (2008).

### Table 1

Best Fit Parameters for Predicted P–L Relations

| Type          | \( \lambda \) (\( \mu m \)) | Slope      | Zero Point | Dispersion |
|---------------|-------------------------------|------------|------------|------------|
| Linear        | 3.6                          | \(-3.145 \pm 0.024\) | \(15.993 \pm 0.017\) | 0.110       |
|               | 4.5                          | \(-3.159 \pm 0.023\) | \(15.921 \pm 0.017\) | 0.108       |
|               | 5.8                          | \(-3.170 \pm 0.023\) | \(15.924 \pm 0.017\) | 0.107       |
|               | 8.0                          | \(-3.181 \pm 0.023\) | \(15.929 \pm 0.017\) | 0.105       |
| Nonlinear     | 3.6                          | \(-3.248 \pm 0.038\) | \(16.057 \pm 0.025\) | 0.107       |
|               | 4.5                          | \(-3.259 \pm 0.038\) | \(15.983 \pm 0.025\) | 0.105       |
|               | 5.8                          | \(-3.268 \pm 0.037\) | \(15.984 \pm 0.025\) | 0.104       |
|               | 8.0                          | \(-3.276 \pm 0.037\) | \(15.982 \pm 0.024\) | 0.103       |
| \( P < 10 \text{ days} \) | 3.6                          | \(-2.971 \pm 0.123\) | \(15.815 \pm 0.146\) | 0.125       |
|               | 4.5                          | \(-2.989 \pm 0.121\) | \(15.747 \pm 0.143\) | 0.122       |
|               | 5.8                          | \(-3.005 \pm 0.119\) | \(15.754 \pm 0.141\) | 0.120       |
| \( P > 10 \text{ days} \) | 8.0                          | \(-3.019 \pm 0.118\) | \(15.763 \pm 0.140\) | 0.118       |
farther from the effects of the HIF, which leads to a more linear P–L relation and is hence more dependent on the period–radius relation, which is linear. This would explain why the values of $F$ for the nonlinear relations decrease with longer wavelength, the IR P–L relations are becoming more consistent with a surface brightness related to the linear period–radius relation. The nonlinearity of the predicted data may just be reflecting the nonlinearity in the optical wavelengths because the variations of the effective temperature over the pulsation period is ignored.

The second possibility is that mass loss causes larger infrared excess for shorter period Cepheids than for longer period Cepheids even though the mass-loss rates are similar for short ($P < 10$ days) and long ($P > 10$ days) period Cepheids. The short-period Cepheids have smaller radii leading to smaller, more dense circumstellar shells. The more dense shells cause greater infrared excess. This greater infrared excess in shorter period Cepheids makes them appear brighter on average, which increases the zero point of the infrared P–L relation; because the relative infrared excess decreases with longer period, the slope of the P–L relation will appear shallower, with the effect being more prominent at longer wavelength. This idea may explain the marginal linearity found in the $K$-band P–L relation. Infrared excess in Galactic Cepheids has been observed using $K$-band interferometry (Kervella et al. 2006; Mérand et al. 2006, 2007) so it is likely infrared excess plays a role in the LMC Cepheids at this wavelength. This would imply that the $K$-band P–L relation is actually nonlinear and this nonlinearity is being masked by the infrared excess. This argument also explains the results of the tests of nonlinearity in the IRAC P–L relations in Ngeow & Kanbur (2008), in particular the nonlinear P–L relation at 8.0 μm. The authors found that the slope of the nonlinear P–L relation for $P < 10$ days is shallower than the slope of the linear relation at 8.0 μm with a more luminous zero point. The nonlinear P–L relations for $P < 10$ days in the optical and near-IR all display the opposite behavior with respect to the linear P–L relations. This nonlinear relation at 8.0 μm is due to the same process that causes the other IRAC P–L relations to appear linear except the process is more significant at longer wavelengths.

It has been shown that mass loss provides a significant contribution to the infrared brightness of LMC Cepheids and affects the structure of infrared P–L relations. Without the contribution of mass loss, the slopes of the linear P–L relations are steeper with increasing wavelength albeit at a small rate differing from the slopes becoming more shallow as found by Ngeow & Kanbur (2008). Applying the $F$-test to the predicted data implies that the infrared P–L relations are nonlinear, though this result requires further testing. However, most of the Cepheids have predicted mass-loss rates that are statistically consistent with zero implying this result is preliminary and needs to be tested further with more data with smaller uncertainties.

5. WHAT IS THE DRIVING MECHANISM?

Up to this point, we have investigated the ability of mass loss to match the OGLE II and SAGE observations of LMC Cepheids, and how the resulting estimates of infrared excess affect the structure of the P–L relations. This has been done without assuming a driving mechanism of the Cepheid wind. There are a number of possible methods for stars to drive mass loss, but only two are likely for Cepheids: radiative driving and pulsation driving. The arguments for these two possibilities are given in Neilson & Lester (2008), who also derive a model for pulsation driving in Cepheids. It is not feasible to apply the pulsation-driving model to this set of data as we do not have knowledge of the pulsation amplitudes or masses to which the model is sensitive. However, we can test whether a radiative-driven stellar wind can match the predicted mass-loss rates using the method of Castor et al. (1975).

The calculation of the mass-loss rate for a radiative-driven stellar wind is reviewed in Lamers & Cassinelli (1999, page 452) and Neilson & Lester (2008) and will not be repeated here. To conduct the calculation the mass, luminosity, radius, and effective temperature are needed; the radii are determined by the $\chi^2$ fitting, the effective temperatures are given by the relation from Beaulieu et al. (2001) and the luminosity is found from the radius and effective temperature. The mass is unknown so the radiative-driven mass-loss rates are found using a number of masses via mass–luminosity relations from Bono et al. (2000), where $L = M^n$ in solar units. The mass-loss rates found from the observations are shown in the left panel of Figure 10, plotted with the best-fit relations for radiative-driven mass-loss rates found with the following mass–luminosity relations, where $n = 4.4, 4.7, 5.0,$ and 6.0. The value of $n = 4.4$ represents the mass–luminosity relation from stellar evolution calculations,

![Figure 10](image-url)
while \( n = 4.7 \) and 5.0 represent the mass–luminosity relations relating to mass found using pulsation calculations, and \( n = 6.0 \) is used as an extreme case. An example of the values of the radiative-driven mass-loss rates is shown in the right panel of Figure 10 for the case of \( n = 4.7 \). Radiative-driven mass-loss rates for other values of \( n > 4.7 \) will increase the rates and for \( n < 4.7 \) will decrease the rates by a roughly constant amount for each Cepheid.

The radiative-driven mass-loss rates are significantly smaller than the mass-loss rates determined from the observations. At short periods of approximately 5 days, the radiative mass-loss rates are about \( 10^3 \) to \( 10^5 \) times lower. However, at periods greater than 30 days the radiative-driven mass-loss rates are of similar order as the calculations. This implies that the mass loss cannot be driven by radiative lines alone at short period; there must be another driving mechanism. This differs at longer period, but it should be noted that the mass-loss rates found from the observations are the minimum value based on the dust-to-gas ratio. This means that the predicted gas mass-loss rates from infrared observations may be larger than the radiative-driven mass-loss rates.

As a further test of whether the mass loss is consistent with radiative driving, we compute the circumstellar flux from dust created in a radiative-driven wind and added to that to the predicted blackbody fluxes to compute infrared P–L relations. These relations are predictions of what would be observed if the mass loss is consistent with radiative driving. The fitted relations at the four wavelengths 3.6, 4.5, 5.8, and 8.0 \( \mu \)m have slopes and \( y \)-intercepts that are equivalent to that in the IR P–L relations derived from the predicted stellar fluxes alone within the error of the fits. For instance, the slope and \( y \)-intercept of the 8.0 \( \mu \)m relation is \(-3.139 \pm 0.024 \) and \( 15.998 \pm 0.017 \), differing by only a few thousandths from the 8.0 \( \mu \)m P–L relation determined from the predicted stellar fluxes alone. Radiative driving does not explain the significant infrared excess of 44 Cepheids that are explained by mass loss.

The amount of mass loss from the LMC Cepheids does not agree with radiative-driving calculations, and the mass loss is more consistent with the pulsation-driven model of Neilson & Lester (2008, 2009) if one considers the magnitude of the mass-loss model from Neilson & Lester (2008, 2009). The mass-loss rates found in this work agree with the discrepancy for low mass Cepheids to an order of magnitude because the evolutionary timescale for a Cepheid on its second crossing is of order 10 million years. The mass-loss rates found in this work agree with the discrepancy for low mass Cepheids to an order of magnitude because the evolutionary timescale for a Cepheid on its second crossing is of order 10 million years. However, the mass-loss rates are too small to be consistent with a 20% mass discrepancy for the more massive Cepheids. It should be noted that the mass discrepancy in LMC Cepheids is measured from Cepheids with periods less than 20 days, which have evolutionary masses from about 4 to 7 \( M_\odot \) (Bono et al. 2000). The mass discrepancy has not been measured for more massive LMC Cepheids.

It has also been found that mass loss affects the infrared P–L relations. Using the predicted stellar luminosities, we constructed new infrared P–L relations that do not have infrared excess. These relations differ from those determined by Ngeow & Kanbur (2008) with differences in the zero point and the slope. The IR P–L relations from Ngeow & Kanbur (2008) have slopes that become smaller at longer wavelength inconsistent with the argument that the slope of the P–L relation should approach a constant maximum value at larger wavelength base on the period–radius relation (Freedman et al. 2008). The slopes in this work are all about \(-3.15 \) with a small amount of steepening at longer wavelength. This would imply a constant slope near that value which is also inconsistent with the slope derived from the PR relation.

Using the \( F \)-test, there is evidence for nonlinearity in the relations similar to the nonlinear structure found in optical P–L...
relations. Mass loss acts to linearize the P–L relation at 3.6, 4.5, and 5.8 μm, while at 8.0 μm the P–L relation is nonlinear with a slope that is shallower at $P < 10$ days than for $P > 10$ days which implies the infrared excess is becoming more important at longer wavelength. Mass loss may also explain why the K-band P–L relation is marginally linear (Ngeow & Kanbur 2006).

The resulting effect that mass loss has on infrared observations of Cepheids implies serious consequences for infrared P–L relations if they are to be used for high-precision astrophysics. One of the reasons for using infrared P–L relations is that they are less sensitive to metallicity than optical relations and hence do not need to be corrected for each galaxy (Sasselov et al. 1997). The metallicity correction is a significant source of uncertainty in studies of the Hubble constant (Freedman et al. 2001) and an infrared P–L relation that avoids this uncertainty would be a powerful tool. However, we have shown that mass loss affects the scatter and the structure of the P–L relation. The scatter increases the uncertainty of any distance determination, but more importantly the fractional amount of dust generated in a wind depends on metallicity. The amount of mass loss may also depend on metallicity, as suggested by Neilson & Lester (2009). These two issues imply the P–L relation depends on metallicity at infrared wavelengths as well as at optical wavelengths though to what extent is currently unknown.

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