USING M DWARF SPECTRA TO MAP EXTINCTION IN THE LOCAL GALAXY

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Received 2011 January 27; accepted 2011 May 30; published 2011 June 30

ABSTRACT

We use spectra of more than 56,000 M dwarfs from the Sloan Digital Sky Survey (SDSS) to create a high-latitu-
dude extinction map of the local Galaxy. Our technique compares spectra from the stars in the SDSS Data Release 7 M
dwarf sample in low-extinction lines of sight, as determined by Schlegel et al., to other SDSS M dwarf spectra in
order to derive improved distance estimates and accurate line-of-sight extinctions. Unlike most previous studies,
which have used a two-color method to determine extinction, we fit extinction curves to fluxes across the spectral
range from 5700 to 9200 Å for every star in our sample. Our result is an AV map that extends from a few tens of
cy to approximately 2 kpc away from the Sun. We also use a similar technique to create a map of RV values
within approximately 1 kpc of the Sun and find that they are consistent with the widely accepted diffuse interstellar
medium value of 3.1. Using our extinction data, we derive a dust scale height for the local Galaxy of 119 ± 15 pc
and find evidence for a local dust cavity.

Key words: dust, extinction – local interstellar matter – stars: late-type – stars: low-mass

Online-only material: color figures

1. INTRODUCTION

The distribution of Galactic dust is highly variable throughout
the Galaxy, and despite many recent advances, its precise three-
dimensional distribution is largely unknown. Because dust both
attenuates and reddens sources, the inability to properly correct
for it places serious restrictions on the precision of many
observational data products. Dust is also important for star
formation, since it is thought to be a catalyst for molecular gas
formation and is often found in the cold, dense regions where
new stars are born.

Currently, the most widely used large-scale dust study is
that of Schlegel et al. (1998, hereafter SFD), which created
a two-dimensional map with total line-of-sight Milky Way dust
column densities calculated from 100 and 240 μm emission.
Arce & Goodman (1999) determined that the SFD dust maps
overestimate reddening by a factor of 1.3–1.5 in regions of
smooth extinction with AV > 0.5 and may underestimate
reddening in regions of steep extinction gradients, and Peek
& Graves (2010) used the reddening of standard galaxies to
find occasional deviations from SFD of up to 50%. In spite
of these occasional inaccuracies, the SFD dust map generally
allows observations outside the Galaxy to be corrected for
the appropriate amount of dust. However, sources inside the Galaxy
lie in front of only a portion of the Milky Way’s total dust and
thus are likely attenuated and reddened by only a fraction of
the total dust column. This fraction varies based upon the three-
dimensional distribution of stars and dust in the Galaxy.

Dust column density can be independently inferred from
the total line-of-sight extinction to a given star. The extinc-
tion affecting stellar spectra can be measured empirically by compar-
ing intrinsic stellar colors to observed colors, using the formula

\[ A_V = R_V [E(B - V)], \]  

(1)

where \( R_V \) is the ratio of total extinction, \( A_V \), to reddening,
\( E(B - V) \), and is an indicator of the dust grain size distribution
and composition. \( R_V \) has an average value of 3.1 for the diffuse
interstellar medium and ranges between about 2.1 and 5.5 for
most sight lines in the Galaxy (Cardelli et al. 1989, hereafter
CCM89). Higher values of \( R_V \) are typical of dense regions (e.g.,
Román-Zúñiga et al. 2007).

The relationship between total extinction and reddening can
be described by an extinction law, usually a polynomial fit be-
tween the measured color excesses (e.g., \( E(B - V) \)) and dif-
ferent bands normalized to \( A_V \). The most commonly used ex-
tinction law is that of CCM89, which fits a law of the form
\[ A(\lambda)/A_V = a(x) + b(x)/R_V \]

to extinction measurements in Johnson photometric bands, where \( a(x) \) and \( b(x) \) are poly-
nomial functions of \( x \), which is an inverse wavelength units
(\( x = 1/\lambda \mu \text{m}^{-1} \)). In CCM89 and other similar extinction laws
(e.g., Rieke & Lebofsky 1985; O’Donnell 1994; Fitzpatrick
1999), the shapes of extinction curves for optical and longer
wavelengths depend only on the amount of dust and \( R_V \), but their
\( R_V \)-dependence varies considerably with wavelength. Infrared
curves depend only marginally on \( R_V \) while shorter-wavelength
optical curves have a strong \( R_V \)-dependence.

Most of the extinction laws discussed above determine
extinction by assuming that the reddening over each Johnson
photometric band corresponds to reddening at the effective
wavelength of the filter. However, because reddening increases
toward shorter wavelengths over a filter’s width, the effective
reddening wavelength is slightly shorter than the filter’s effective
wavelength. By using modified effective reddening wavelengths
as the basis for a spline fit to extinction values, Fitzpatrick
(1999) presents a reddening law that is more accurate when
used with narrowband photometry, other photometric systems,
and spectroscopic data.

In order to overcome the shortcomings of a two-dimensional
extinction map (e.g., Burstein & Heiles 1978; SFD), several
attempts have been made to use color excesses and extinction
laws to model Galactic extinction and dust in three dimensions.
Hakkila et al. (1997) completed one of the most comprehen-
sive all-sky empirical extinction models to date by combining the
extinction surveys of Fitzgerald (1968), Neckel & Klare (1980),

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Berdnikov & Pavlovskaya (1991), and Arenou et al. (1992). Using Equation (1) (choosing an average $R_V$ of $\sim 3.1$) in conjunction with intrinsic and observed absolute $B$ and $V$ magnitudes, Hakkila et al. (1997) computed the line-of-sight extinctions for around 78,000 stars.

These early models were important for providing an initial estimate of three-dimensional extinction, but suffered from limited resolution and large measurement error due to unknown $R_V$ values. The combined model of Hakkila et al. (1997) was effective at identifying absorbing clouds within 5 kpc, but was only intended to identify large-scale extinction near the Galactic plane. The studies that comprise the combined model were fairly limited, and even though the Arenou et al. (1992) study had the greatest number of stars, its accuracy was limited to about 1 kpc with a resolution of several degrees. Fitzgerald (1968), Neckel & Klare (1980), and Berdnikov & Pavlovskaya (1991) also had limited resolution due to the rare hot (mostly B-type) stars that comprised most of their samples. There were also significant differences in data quality between the studies in the combined model, leading to poorly defined errors in many areas of the map.

The assumption that $R_V$ equals 3.1 introduced further error in Hakkila et al. (1997) due to the short optical wavelengths used to compute extinction. According to SFD, extreme $R_V$ values can cause deviations from the $R_V = 3.1$ extinction law of up to 30% in the $V$ band and 55% in the $B$ band, so $E(B - V)$ could be subject to considerable error. Although $R_V$ appears to be approximately 3.1 for most sight lines in the Galaxy, Schlafly et al. (2010) and Schlafly & Finkbeiner (2010) found a broad distribution of Galactic $R_V$ values.

In recent years there have been considerable improvements to the Hakkila et al. (1997) map at low Galactic latitudes, especially looking toward the Galactic center. Marshall et al. (2006) created an extinction map using data from the Two Micron All Sky Survey (2MASS) for $b \leq 15^\circ$ and $l \leq 100^\circ$, an area that is often ignored in extinction maps. The Marshall et al. (2006) model of the inner Galaxy contains high-resolution extinction values for a portion of the sky close to the Galactic plane. They compared $J - K_S$ colors to predicted intrinsic colors from the Besançon Model of the Galaxy (Robin et al. 2003) with K and M giants to determine the extinction in the inner Galaxy. Because infrared extinction curves are assumed to be independent of $R_V$, this approach is more robust to $R_V$ variation than those using $B - V$ color excesses. Similarly, Sale et al. (2009) created an algorithm capable of determining extinction in A to early K-type stars by comparing intrinsic to observed $r - i$ colors (wavelengths with low $R_V$-dependence) from the INT/WFC Photometric Hα Survey (Drew et al. 2005), which they used to map extinction in high resolution at low Galactic latitudes. Using a similar method as Marshall et al. (2006), also with 2MASS photometry, Gontcharov (2009, 2010) used O–F-type stars to map extinction within 1600 pc of the Sun at a range of Galactic latitudes with greater resolution than is afforded by the more rare K and M giant stars. Although higher than the resolution of Marshall et al. (2006) in local regions, the resolution of this map is currently limited to Galactocentric Cartesian boxes of 100 pc per side.

Photometric and spectroscopic data from the Sloan Digital Sky Survey (SDSS; York et al. 2000; Abazajian et al. 2009) have recently been used to model reddening at higher latitudes. Schlafly et al. (2010) and Schlafly & Finkbeiner (2010), with photometry and spectroscopy, respectively, used the colors of main-sequence turn off stars to test reddening from the dust maps of SFD and to provide the first large-scale, two-dimensional map of $R_V$ in the Galaxy. Because this survey needed to use bright stars with relatively invariant photometric colors, the stars used to calculate extinction were behind the entire dust column except at latitudes near the Galactic plane.

Missing from these studies is a comprehensive, local, three-dimensional extinction map of higher Galactic latitudes. M dwarfs, as the most ubiquitous stellar types in the Galaxy, are the most suitable candidates to pursue such a study. However, because of their low luminosity, M dwarfs have been almost completely ignored by previous extinction studies. In addition, fitting extinction curves to photometric data for these stellar types (and many others) is much less robust than a spectroscopic method due to the fewer data points over which fitting can occur. However, with the advent of large spectroscopic surveys such as the SDSS, there are now spectroscopic samples that contain more than 70,000 M dwarfs (West et al. 2011). Using these data, it is now possible to fit extinction curves to a large spectral range. We now have the ability to pursue a more precise three-dimensional extinction map for high Galactic latitudes within about 2 kpc of the Sun using M dwarfs.

Using SDSS data to more precisely model extinction also gives us the ability to derive the three-dimensional distribution of dust in the Galaxy. The main structural features of dust in the local Galaxy are the local bubble and an exponential disk. The local bubble has been modeled in detail by measuring the lack of neutral gas within $\sim 50–200$ pc of the Sun. Most recently, Lallement et al. (2003) modeled the local bubble in three dimensions by using absorption maps of Na I. However, although the neutral gas profile of the local bubble is well-constrained, the dust column densities are not. A local underdensity of reddening has been established (e.g., Knude & Høg 1999) and some of its contours have been shown to correlate with the gas cavity using reddening from stars with Hipparcos parallaxes (Vergely et al. 2010), but the precise shape and size of the dust cavity is not well known.

The scale height of dust in the local Galaxy is also relatively unconstrained. The theoretical model of Drimmel & Spergel (2001) finds a value $\sim 185$ pc near the Sun and the H I model (long thought to be a tracer of dust) of Kalberla & Kerp (2009) finds an approximate value of 150 pc at all Galactocentric radii, but these studies have a high uncertainty in the local environment. Because M dwarfs are the most numerous population of stars and have been cataloged in great abundance in the nearby Galaxy (Bochanski et al. 2010), they are ideal candidates to study the dust abundances in greater detail within several hundred pc of the Sun.

In this study, we used an SDSS spectroscopic sample of more than 56,000 M dwarfs to model Galactic dust and extinction at high latitudes in the local Galaxy. In Section 2, we discuss our spectroscopic sample, and in Section 3 we discuss creating our extinction, $R_V$, and dust models. Our results are presented in Section 4 and discussed in Section 5.

2. DATA

SDSS data have proven to be incredibly valuable for large-scale Galactic surveys due to their high-quality photometry over large solid angles. Ivezić et al. (2008) used SDSS spectroscopy of 60,000 F- and G-type main-sequence stars to model temperature and metallicity in the Galaxy. Jurić et al. (2008) used photometric data from $\sim 48$ million stars to create an unprecedented model of the stellar number density distribution.
SDSS has also been an ideal tool for studying the properties of low-mass stars. Bochanski et al. (2010) used around 15 million low-mass dwarfs to measure the luminosity function and mass functions for these stars. It also enabled large-scale studies of magnetic and chromospheric activity (West et al. 2004, 2008), and the use of low-mass stars as kinematic tracers of Galactic dynamics (Bochanski et al. 2007a, 2011; Fuchs et al. 2009; J. S. Pineda et al. 2011, in preparation).

Our spectroscopic sample was selected from the SDSS Data Release 7 (DR7; Abazajian et al. 2009) M dwarf spectroscopic catalog (West et al. 2011). SDSS spectroscopy was carried out by twin fiber-fed spectrographs collecting 640 simultaneous observations. Typical exposure times were ~15–20 minutes, but exposures were subsequently co-added for exposure times of ~45 minutes, producing medium resolution spectra with \( R \sim 2000 \) (York et al. 2000). SDSS spectroscopic plates each contained 16 spectrophotometric standard stars, which were selected by color to be F subdwarf stars. The SDSS spectroscopic fluxes were calibrated by comparing the standard stars to a grid of theoretical spectra from Kurucz model atmospheres (Kurucz 1992) and solving for a spectrophotometric solution on each plate. The SDSS spectrophotometry matches the point-spread function photometry to 4% rms (Adelman-McCarthy et al. 2008). For more information on SDSS spectrophotometric calibration, see the discussions in the SDSS second and sixth data release papers (Abazajian et al. 2004; Adelman-McCarthy et al. 2008).

Our initial sample consisted of 70,823 M Dwarfs (M0 to M9), which were chosen based on typical M dwarf colors \((r - i > 0.53 \text{ and } i - z > 0.3; \text{West et al. 2008})\) and had spectral types verified by eye. To ensure the highest quality spectroscopic data, stars with signal-to-noise ratios near \( H a \) of less than 4 were removed. Stars with colors indicating a possible M-dwarf–white-dwarf binary were also removed (Smolčić et al. 2004), as were stars that did not pass the SDSS photometric quality flags described in Bochanski et al. (2010). The resulting sample contained 55,719 stars.

The radial velocities were measured for all stars in the SDSS by cross-correlating high signal-to-noise ratio templates with each M dwarf spectrum (Bochanski et al. 2007b). Distances were measured for all stars using the photometric parallax technique described in Bochanski et al. (2010). See West et al. (2011) for more details on the sample selection and the value added quantities measured for the SDSS DR7 M dwarf sample.

3. ANALYSIS

In order to measure the alteration of stellar spectra by dust, we selected a set of template spectra from regions of the sky where the total integrated extinction (as determined by SFD) was less than 0.03 mag in the \( r \) band. We then separated the total set of template spectra by spectral type. For spectral types M7 and earlier, we also put spectra into five bins based on the strength of the TiO5 molecular band head. The TiO5 bins were created to minimize the effects of metallicity on extinction curve fits (changes in metallicity can reduce the depth of the TiO molecular features; Gizis 1997; Lépine et al. 2007). The bins were computed so that each one had roughly the same number of template spectra, allowing every star to be compared against several templates. Due to the weaker TiO5 features of M8 and M9 stars (caused by the condensation of TiO in their cooler atmospheres; Allard & Hauschildt 1995) and the scarcity of low-extinction template stars for these types, we did not separate M8 and M9 templates into TiO5 bins.

We visually inspected all of the template spectra for missing data or low signal-to-noise ratios over parts of their spectrum, finding that many of the stars in the original template sample were not suitable for use as “ideal” M dwarf spectra. However, we managed to identify \(~5–10\) extremely high-quality spectra (out of \(~60\) originally) for each TiO5 bin. For the templates that we selected by eye, the median extinction given by SFD was 0.028 mag in the \( r \) band with a median distance of 141 pc. Each template spectrum was corrected for its radial velocity and spline-fitted to a wavelength array that was spaced 69.1 km s\(^{-1}\) apart in velocity (SDSS wavelength spacing).

Due to the low signal-to-noise ratios in the blue portion of many M dwarf spectra (caused by their red colors and low luminosities) and the high \( R_V \)-dependence of shorter-wavelength extinction laws, we limited our extinction fits to the region spanning from 5700 to 9200 Å. For our initial model we assumed \( R_V \) was equal to 3.1 everywhere, which is a reasonable approximation for most lines of sight (CCM89). Our assumed \( R_V \) does not greatly increase our uncertainty because extinction at longer wavelengths, especially those longer than the \( V \) band (\(~5500\) Å), has a relatively low \( R_V \)-dependence. We derived a relationship between flux, distance, and extinction at each wavelength by using the fact that the ratio of fluxes between the program star and template star is a product of both the distance modulus and the extinction. Using the \( R_V = 3.1 \) extinction curve of Fitzpatrick (1999), we derived the following equation, which relates the ratio of fluxes between each star and low-extinction template star to the distance and total \( V \)-band extinction:

\[
-2.5 \log \left[ \frac{f(\lambda)}{f_T(\lambda)} \right] = 5 \log \left[ \frac{d}{d_0} \right] + A(\lambda),
\]

where \( f \) is the flux of the program spectrum, \( f_T \) is the flux of the template spectrum, \( d \) is the distance to the program star, \( d_0 \) is the distance to the template star, and \( A(\lambda) \) is the extinction at wavelength \(\lambda\) given by Fitzpatrick (1999).

For each program M dwarf in the West et al. (2011) sample, we corrected for radial velocity and interpolated the flux to the wavelength array of our template spectra. Each program star flux array was divided by the flux array of every template star with the same spectral type and TiO5 strength. This gave us values for the flux ratio at every wavelength. The Fitzpatrick (1999) extinction curves were parameterized by the IDL program \( fm\_unred \),\(^4\) which we modified slightly to return \( A(\lambda)/E(B - V) \) extinction curve. Dividing this curve by \( R_V = E(B - V) \) gave us the relation normalized to \( A(\lambda)/A_V \). Multiplying the extinction curve by \( A_V \) returned \( A(\lambda) \), which can be described by the equation

\[
A(\lambda) = (A_V/R_V)[A(\lambda)/E(B - V)]_{\text{Fitzpatrick}},
\]

where \( A_V \) was the only unknown.

Assuming that the derived distances (Bochanski et al. 2010; West et al. 2011) were correct for the case of low-extinction templates, we were left with two free parameters, the program star distance, \( d \), and the \( V \)-band extinction, \( A_V \). We then performed a two-parameter Levenberg–Marquart least-squares fit using \( mpfitfun \) in IDL (Markwardt 2009), which returned the best-fit \( A_V \) and distance based on the fluxes at every wavelength (Figure 1). Any residuals in the fits are likely due to noisy spectra or an imperfect match of program star to template

\(^4\) Part of the IDL Astronomy User’s Library at http://idlastro.gsfc.nasa.gov/.
star. Taking the median of the fits for each template star gave the stellar distance and absolute V-band extinction for each program star. The dispersion in the values measured for each template star was used for the uncertainty. The fits were constrained to have both distance and $A_V \geq 0.0$ and were weighted by the noise at each wavelength. We were able to fit $A_V$ to a median uncertainty of 0.043 mag and distance to a median uncertainty of less than 5%. This adds to the uncertainty in the original distances given by West et al. (2011), which is typically $\sim 20\%$. With the new distances, we derived a set of cylindrical Galactocentric coordinates for each star in the sample and have updated the sample distances in the West et al. (2011) catalog. To compute the error in $A_V$, we took the dispersion in $A_V$ for each program star and divided by the square root of the number of template stars against which each program star was fit.

3.1. Fitting $R_V$

A subset of our sample was used to examine the distribution of $R_V$. For the program and template stars with signal-to-noise ratios near H$\delta$ of greater than 4, we used the same procedure described above to perform a three-parameter fit, this time including $R_V$ in Equation (3) as a free parameter. Due to the high signal-to-noise ratio at the blue end of the spectrum for these stars, we were able to fit over the larger wavelength range of 4300–9200 Å for 9102 M dwarfs (Figure 2). As with our two-parameter fit, the residuals are likely due to an imperfect match of program spectrum to template spectrum. A plot of Figure 2 extinction curve residuals is shown in Figure 3. The residuals shown are generally small, having a median value of 0.037, but tend to increase toward bluer wavelengths. Unlike with the two-parameter fits described above, where $A_V$ was restricted to have a minimum value of 0, we found that mpfitfun was better able to constrain $R_V$ when we allowed $A_V$ to be slightly negative. We therefore allowed $A_V$ to be as low as $-0.036$ mag, the systematic error from using a template star with 0.03 mag of r-band extinction (assuming $R_V$ of 3.1), which allowed robust fits of $R_V$ that would be less affected by the systematic error in $A_V$.

We found that $R_V$ is a sensitive parameter to the uncertainty in the spectrum, due to the fact that it describes the subtle changes in the curvature of extinction laws. Many of the noisier fits returned values that were too high or too low to be plausible for Galactic sightlines. We expect that these values, rather than being indicative of unlikely Galactic dust properties, could be due to the effect of random noise or possibly molecular features which could be slightly different in the program star than in the template star. Our $R_V$ map also demonstrates that stars at greater distances, which are more likely to have lower-quality spectra, show the greatest dispersions in $R_V$, indicating that these values might not be physically meaningful. In addition, the full width at half-maximum of our distribution is $\sim 2$, so these values appear to be well outside the normal range. For these reasons, we constrained our analysis to $R_V$ values between 2.1 and 5.5 (CCM89). Values in this range were returned for 6338 of the M dwarfs ($\sim 70\%$) when compared with at least one template star. The remaining 30% of stars reported unlikely $R_V$ values when compared with all template stars. The values between 2.1 and 5.5 were kept and used for a Galactic model of $R_V$ and to glean a rough sense of the overall distribution of $R_V$ values.
Figure 2. Top: an M3 spectrum with some reddening. Middle: an M3 template spectrum with less than 0.03 mag of r-band reddening. Bottom: 2.5 times the logarithm of the flux ratios of these two spectra, which is equal to the extinction added to the distance modulus. This ratio has been fit with the Fitzpatrick (1999) extinction law (green line, gray in print; \( AV = 0.81; RV = 3.31 \)). The SDSS flux is in units of \( 1 \times 10^{-17} \text{ erg s}^{-1} \text{ cm}^{-2} \text{ Å}^{-1} \).

(A color version of this figure is available in the online journal.)

Figure 3. Plot of the residuals for the extinction curve fit in Figure 2. The residuals are generally small, with a median value 0.037, but tend to increase toward bluer wavelengths.

As with \( A_V \), we computed the error in \( R_V \) values by first taking the dispersion of the median for the \( R_V \) values reported for each program star. We then divided by the square root of the number of template stars against which each program star was fit. However, we often found that only one template star for a given program star returned a realistic value of \( R_V \). For these stars, we used the formal 1\( \sigma \) errors reported by mpfit2Dfun. We were able to obtain a median uncertainty in \( R_V \) of 0.42.

3.2. Fitting to an Exponential Model

In an effort to discover the large-scale distribution of local dust, we subsequently fit our extinction values to an integrated exponential dust model scaling in Galactocentric radius \( R \) and height \( Z \) and uniform with respect to the Galactocentric cylindrical angle \( \theta \). By doing this, we derived the approximate scale height and length of the dust. Extinction is related to dust column density by the formula

\[
A_V(x) = 1.086 \kappa_V \int_0^x \rho_d(s) ds, \tag{4}
\]

where \( \kappa_V \) is the mean opacity of the dust (Drimmel et al. 2003). The mean opacity is estimated to be \( 8.55 \times 10^3 \text{ cm}^2 \text{ g}^{-1} \) by the model of Weingartner & Draine (2001) with slightly reduced abundances to match the canonical \( A_V / N_H \) relation and optical constraints from Draine (2003a, 2003b). The scale height derived from this model, however, does not depend on which value of \( \kappa_V \) we use. We assumed an exponential dust model scaling in the Galactocentric \( R \) and \( Z \) coordinates of the form

\[
\Sigma(R, Z) = \Sigma_0 \exp(-R/H_R) \exp(-Z/H_Z),
\]

which we integrated analytically to find the extinctions predicted by our model. In order to derive the scale height of the dust, the integrated extinction was fit to the observed extinction by mpfit2Dfun (Markwardt 2009) with \( H_R, H_Z, \) and \( \Sigma_0 \) as free parameters. The corrected photometric parallax distances (Bochanski et al. 2010) used in this fit had a typical uncertainty of \( \sim 25\% \).

3.3. Fitting to the Local Bubble

Inspection of our \( A_V \) model revealed a potential absence of dust near the Galactic plane that may be associated with the local bubble. Although the local bubble has only been well constrained by its absence of neutral gas, neutral gas tends to be a tracer for dust (Draine 2003a) and thus we expect the
local bubble to contain a significant underdensity of dust. We therefore decided to add the local bubble to our exponential dust model. Although the shape of the local bubble is highly irregular, our limited resolution at small distances is only sufficient to roughly constrain the size of the bubble (due to the small number of nearby M dwarfs that do not saturate the SDSS detectors). Because of this constraint and the approximate shape of the three-dimensional model of Lallement et al. (2003), we decided to adopt a spherical model for the local bubble. This model roughly matches the shape of the local bubble of ionized gas.

Using the assumption of a spherical local bubble, we adopted an iterative approach wherein we used mpfit2Dfun (Markwardt 2009) to fit to the scale height and scale length of an exponential model with a spherical cavity around the Sun of varying radii. Our free parameters were the scale height, the scale length, the central density ($\Sigma_0$), and the fraction of dust in the local bubble relative to the fraction predicted by our exponential disk model. We first computed the reduced chi-square for bubble radii with the dust fraction parameter fixed at 0.0. We adopted the bubble radius with the lowest chi-square value. Next, we included the dust fraction as a free parameter in order to probe the density of dust within the local bubble.

4. RESULTS

Using the methods described above, we measured $A_V$ and distance using 55,719 M dwarf spectra. For more than 6000 high signal-to-noise spectra, we also estimated $R_V$. Histograms of our derived values for $A_V$ and $R_V$ are shown in Figures 4 and 5, respectively. Using these data, we created maps of $A_V$ and $R_V$ as well as a best-fit model for the Galactic dust distribution. We also compared our values to those of SFD for all lines of sight. The details of our results are discussed below.

4.1. Extinction Map

Figure 6 shows the $A_V$ map from our analysis, created using the median $A_V$ values in 25 pc $\times$ 25 pc Galacticentric bins compressed in the $\theta$-dimension. As these bins are in Galacticentric coordinates, their angular size varies with distance while their spatial size remains constant. The extinction map extends to approximately 2 kpc above and below the Galactic plane. In the northern hemisphere, the distribution of extinction across different lines of sight appears to be fairly regular, whereas in the southern hemisphere it appears patchier due to the relatively few lines of sight in the southern SDSS survey area (which likely does not represent the average line-of-sight extinctions in the southern Galactic hemisphere). Although extinction generally increases at larger distances, there may be a selection effect at distances greater than around 1 kpc from the Sun, where proportionally more of the stars observed are from low-extinction lines of sight. This bias might arise because stars in high-extinction lines of sight are generally noisier and less likely to remain in our sample after our signal-to-noise cuts.

The median derived extinction for the entire sample is 0.037 $\pm$ 0.029 mag. A histogram of our $A_V$ values (Figure 4) shows that the number of extinction values measured tends to decrease exponentially toward higher $A_V$. This distribution is anticipated due to the fact that $A_V$ depends on the dust distribution, which scales exponentially along a line of sight, and the M dwarf sample density, which also scales exponentially in distance (outside of $\sim$200 pc). This histogram also shows that 43% of our sample reported an $A_V$ of 0.0. Out of these values, 24% reported no dispersion in their values due to the vast majority of the template star fits all reporting an $A_V$ of 0.0. SFD report a median $A_V$ of 0.094 mag for these stars, while they report a median $A_V$ of 0.097 for the entire M dwarf sample. The stars to which we measure an $A_V$ of 0.0 have a median distance of 470 pc, well beyond the typical scale height of the dust disk, and so many of these values could partly be caused by random and systematic error or unusual lines of sight. Out of the stars with a detectable $A_V$, the median dispersion is 0.043 mag. We assumed that these dispersions represent the random errors in our extinction fitting; every program star was fit against multiple templates and the uncertainty can be gleaned from the deviation of all of the fits for a single program star from the median value.

In addition to the random error in our sample, there is also some systematic error that arises from the fact that our templates are not from perfectly extinction-free lines of sight. Our template stars were chosen from regions of total column extinction of up to 0.03 mag in the $r$ band. Assuming an $R_V$ of 3.1, this
translates to 0.036 mag in $A_V$. For the templates that we selected by eye however, the median total column extinction as given by SFD was 0.032 mag in $A_V$, but with a median distance of only 141 pc. Our results indicate that this median distance is only slightly above the average dust scale height of the Galaxy (see Section 4.3), and thus we expect that the actual $A_V$ to our templates is less than the maximum value. The small median distances are due to the template spectra being selected to have high signal-to-noise ratios. This process preferentially selects brighter stars, which are more likely to be at smaller distances and have $A_V$ values lower than the total line-of-sight values. In addition, the difference in intrinsic template spectra extinction could contribute to the reported error in our fitting procedure. Because template spectra have varying amounts of intrinsic $A_V$, the deviation in our template star fits will be in part due to the systematic error. Because of this, our systematic error is likely less than the maximum value of 0.036 mag.

Figure 7 shows a map of the error in our $A_V$ map (Figure 6). For the 25 pc $\times$ 25 pc Galactocentric bins in this map, we computed errors by taking the deviation from the median value of $A_V$ for all the stars in each bin and dividing by the square root of the number of stars. For bins with only one star, we used the error measured by our fitting procedure. As expected, the error in our values tends to increase at greater distances as spectra become noisier and less reliable. For the 25 pc $\times$ 25 pc bins, the median error is 0.046. The small increase in the median error when using these bins likely demonstrates the patchiness of the Galactic dust distribution (we have compressed all lines of sight in the $\theta$-dimension).

In addition to the map of $A_V$ in Galactocentric cylindrical coordinates, we also present a map of our sample in Galactic latitude and longitude. Figure 8 shows a map of $A_V$ that includes all the stars in our sample averaged over bins of 4 deg$^2$. This map shows that the SDSS data in the southern hemisphere come from only a few lines of sight, which explain why the extinction in the southern hemisphere of our Galactocentric map (Figure 6) is much more patchy than the extinction in the northern hemisphere.

### 4.2. $R_V$ Map

Using the 6338 stars for which we measured realistic $R_V$ values, we created a map of our median $R_V$ for each 50 pc $\times$ 50 pc Galactocentric cylindrical coordinate bin (Figure 9). As with our $A_V$ map, the bins have an angular size which depends upon the distance at which they are located. Accurate $R_V$ values proved challenging to determine at large distances. Therefore, our map of $R_V$ only extends to 1 kpc from the Sun. When possible, we measured the errors in $R_V$ by the same procedure described above for extinction values. When only one template star returned a plausible value for $R_V$, we used the formal $1 \sigma$ errors returned by mpfitfun (Markwardt 2009). Figure 5 shows the distribution of $R_V$, which peaks at a value of 3.1, in agreement with the generally accepted diffuse interstellar medium value (CCM89). Our median $R_V$ is 3.38 with a median uncertainty of 0.42. Figure 10 shows $R_V$ plotted as a function of Galactic latitude. There appears to be an increase in $R_V$ values at higher Galactic latitudes, which is contrary to the expectation that $R_V$ is higher in the denser dust of the Galactic plane (Román-Zúñiga et al. 2007).

We also examined the systematic error in our sample due to the fact that our template spectra have an unknown amount of reddening (up to 0.036 mag in $A_V$). Because of this, their intrinsic reddening contributes to the derived value of $R_V$. We examined this error by using the IDL program fmn_unred to artificially redden our template spectra by an additional 0.036 mag in $A_V$ using the Fitzpatrick (1999) parameterization. Our distribution including the peak at an $R_V$ of 3.1 was mostly unchanged, but the median value shifted from 3.38 to 3.35 when the spectra were reddened. Although we expect that our template spectra have less reddening than the maximum for the reasons
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Figure 7. Median error (color coding) of our $A_V$ map in Galactocentric cylindrical coordinate ($R, Z$) bins of 25 pc × 25 pc and flattened in the $\theta$-dimension. Generally, the error in our values increases at greater distances.

(A color version of this figure is available in the online journal.)

Figure 8. Galactic latitude and longitude map of our $A_V$ values (color coding) for all the stars in our sample averaged over bins of 4 deg$^2$.

(A color version of this figure is available in the online journal.)

discussed in Section 4.1, there is still some systematic error. Therefore, due to the unknown amount of intrinsic reddening of our template spectra, the true median $R_V$ could be slightly higher than the value we measured.
Figure 9. Map of $R_V$ values (color coding) in Galactocentric cylindrical coordinate ($R, Z$) bins of 50 pc × 50 pc and flattened in the $\theta$-dimension. The data give realistic values for $R_V$ to a distance of about 1 kpc. (A color version of this figure is available in the online journal.)

Figure 10. Our derived $R_V$ values as a function of the absolute value of the Galactic latitude, $b$, in bins of 5°. It appears that there may be a correlation between $R_V$ and Galactic latitude.

4.3. Fitting to a Simple Dust Model

To fit an exponential dust model with a local bubble to our extinction results, we first reduced the measured uncertainties by putting the stars into Galactocentric cylindrical ($R, Z, R \sin \theta$) three-dimensional boxes of 25 pc on a side at all distances. We weighted each bin by the number of stars it contained and only used the stars within 1 kpc of the Sun (where the dust dominates).

Using the iterative approach outlined in Section 3, we looked for local minima in the reduced chi-square for a number of different local bubble sizes ranging from 0 pc to 350 pc in steps of 25 pc. We found a best-fit local bubble with a radius of 150 pc containing no dust. We later included the dust fraction in the local bubble as a free parameter in our model and found that the best-fit dust fraction in a 150 pc radius was 0.40, i.e., the local bubble contains 40% of the dust predicted by our exponential model. Because the local bubbles shape is highly irregular, this procedure is only meant to roughly constrain the local underdensity of dust. Accordingly, the formal 1$\sigma$ error in this fit is 26%. We performed an $F$-test on our results to test whether the 40% dust bubble is statistically more likely than the 0% dust bubble and found a significance of 0%. This result indicates that the addition of a parameter to constrain the dust fraction inside the bubble, although resulting in a lower chi-squared value, has no statistical significance. Our model therefore finds that a 0% dust bubble is as likely as a 40% dust bubble.

The fitting procedure returned a dust scale height of $152 \pm 33$ pc. However, the small amount of data at low latitudes and our treatment of the dust structure inside our spherical local bubble limits the precision of our method. As an alternative, we removed all stars with $A_V = 0$ from the data set before binning and fitting for the dust scale height, because we would not expect lines of sight without dust to scale exponentially. This method
effectively removed any effects of the zero extinction lines of sight from our derived scale height. From this procedure, we found a dust scale height of $119 \pm 15$ pc. The actual scale height is likely bracketed by the results from our two methods. Our derived scale length was nearly infinite for the first method, but after removing all stars with $A_V = 0$, we found a value of $1.35 \pm 5.25$ kpc. The large uncertainty in this parameter is due to a lack of high-quality spectra at significantly different values of Galactocentric radii.

Figures 11 and 12 show the theoretical extinction and dust distributions, respectively, using the scale length and height from the second method above and the local bubble size and dust density from the theoretical model.
fraction from the first method. Table 1 contains the list of best-fit dust parameters used in these models. The actual extinction does vary considerably compared to the uniformly scaling best-fit model, which indicates the patchiness of the dust distribution. Figure 13 shows $A_V$ divided by distance for the stars in our sample with $A_V$ greater than 0. $A_V$ divided by distance is an indicator of dust because dust is proportional to the differential extinction. This means that extinction divided by the distance is directly proportional to the average dust density along the entire line of sight to the star (see Equation (4)). Figure 13 shows that the dust does appear to scale exponentially, on average, and fits our derived exponential extinction model very closely.

4.4. Comparison with SFD

Figure 14 shows a map in Galactic latitude and longitude of SFD’s total column extinction subtracted from our $R_V = 3.1 A_V$ values. Although our values were usually in close agreement to those of SFD, our values are often lower than the SFD values by a
significant amount at lower Galactic latitudes. This is expected due to the fact that we are not seeing through all of the dust near the Galactic plane, and our results for these regions are consistent with those of Schlafly et al. (2010) and Schlafly & Finkbeiner (2010). Areas where our results are lower than those of SFD at higher latitudes are also likely due to stars that are in front of a significant fraction of the dust. Areas at higher latitudes that report higher \( AV \) values than those of SFD values could be due to error in our extinction values, our assumption of \( RV = 3.1 \), or possibly due to steep extinction gradients, where SFD may underestimate the extinction (Arce & Goodman 1999). Representative of this, Figure 14 also shows comparisons with SFD for stars at distances less than and greater than 200 pc. These maps show that our extinction values are more likely to be closer to those of SFD at greater distances. In the upper left of the middle map (distance <200 pc) and in a few other lines of sight, however, we find values significantly higher than those of SFD. We will examine these features in more detail in future studies.

5. CONCLUSIONS

By fitting over 56,000 SDSS M dwarf spectra to the Fitzpatrick (1999) extinction curve, we have created extinction and \( RV \) maps for the local Galaxy. Our results are summarized below.

1. We developed a technique for empirically measuring the extinction and distance to stars for which we have SDSS spectroscopic data. Most previous techniques have used a two-color analysis to determine extinction; our method uses the flux values across the spectral range from 5700 to 9200 Å to determine the best possible extinction and distance fits and so has the potential to be much more accurate.

2. Using our fitting procedure, we derived new distances for most of the stars in the West et al. (2011) SDSS DR7 M dwarf catalog, accounting for the proper amount of foreground dust extinction.

3. We created an \( AV \) map extending to approximately 2 kpc from the Sun, generally at high Galactic latitudes. In the northern hemisphere, where most of the stars in the SDSS sample lie, the \( \theta \)-compressed extinction is relatively uniform. In the southern hemisphere, however, there are fewer SDSS lines of sight and so significant variations are apparent, showing that the three-dimensional dust distribution often does not scale uniformly.

4. Our extinction map compares favorably to the SFD map over the vast majority of the SDSS survey area. Our extinction values are often significantly less than those of SFD, most likely because we are seeing through only part of the total dust column. The median error in our extinction values is 0.029 mag.

5. Within about 1 kpc of the Sun, we deduced the value of \( RV \) for many lines of sight, finding that the median \( RV \) is 3.38 with a median uncertainty of 0.42. The peak of our distribution of \( RV \) (Figure 5) is at a value of 3.1, in agreement with the generally accepted value for the diffuse interstellar medium. As we find no significant source of systematic error and a K-S test indicates that this distribution is inconsistent with a Gaussian of \( \sigma = 0.42 \), we expect that the spread in our distribution indicates a real spread in Galactic \( RV \).

6. We estimated the scale height of dust in the local Galaxy to be 119 ± 15 pc. This is less than the value found by the theoretical model of Drimmel & Spergel (2001) which finds a value around 185 pc near the Sun and roughly consistent with the H I model (long thought to be a tracer of dust) of Kalberla & Kerp (2009) which finds an approximate value at all galactocentric radii of 150 pc. We note that there is considerable variation in the structure of dust throughout the local Galaxy. In addition, we find some evidence for a spherical local bubble of radius 150 pc and with approximately 40% of the normal dust density. We plan to better constrain the shape, size, and dust content of the local bubble through future work using nearby L dwarfs. The empirical data vary considerably compared our model, but on average it is in close agreement (Figure 13). Similarly, the true dust distribution is not nearly as uniform as our model.

Our three-dimensional map of \( AV \) is most appropriate for estimating extinction to stars within around 500 pc of the Galactic plane. Our map within this region, especially at small distances, has fairly high resolution and low uncertainties, and using the SFD maps for these Galactocentric heights could significantly overcorrect for extinction. Due to an approximate (but not uniform) dust scale height of 119 pc, we can safely assume that stars further than 500 pc from the plane are behind essentially all of the dust column and that two-dimensional maps like SFD’s higher resolution map are the most appropriate for these distances.

In using our map of \( RV \), it is important to remember that our standard error tends to be around 0.42; however, regions of especially high and low \( RV \) should be noted, especially for shorter-wavelength observations where errors caused by assuming an average \( RV \) can be significant. We expect that although for many lines of sight in the Galaxy \( RV = 3.1 \) is a very good approximation, there is a broad spread in Galactic \( RV \). Because our \( RV \) histogram reports few \( RV \) values near 2.1 or 5.5, we do not expect that Galactic \( RV \) values are frequently outside of the range that we selected. However, when our selection effect is taken into account, the spread in Galactic \( RV \) is even greater than that shown in our histogram.

In the future, we plan to expand our extinction map by using the fitting procedure developed here for SDSS spectroscopic data from other stellar types. Our complete \( AV \), \( RV \), and distance data set is accessible online in FITS format at http://people.bu.edu/aawest/dust.html.

We thank the anonymous referee for many helpful suggestions. We also thank Eddie Schlafly, Douglas Finkbeiner, Fred Walter, Kevin Covey, John Bochanski, Alan Whiting, Tim Cook, Dan Clemens, and Josh Peek for useful discussions while conducting this study.

Funding for the Sloan Digital Sky Survey (SDSS) and SDSS-II has been provided by the Alfred P. Sloan Foundation, the Participating Institutions, the National Science Foundation, the U.S. Department of Energy, the National Aeronautics and
Space Administration, the Japanese Monbukagakusho, and the Max Planck Society, and the Higher Education Funding Council for England. The SDSS Web site is http://www.sdss.org/.

The SDSS is managed by the Astrophysical Research Consortium (ARC) for the Participating Institutions. The Participating Institutions are the American Museum of Natural History, Astrophysical Institute Potsdam, University of Basel, University of Cambridge, Case Western Reserve University, The University of Chicago, Drexel University, Fermilab, the Institute for Advanced Study, the Japan Participation Group, The Johns Hopkins University, the Joint Institute for Nuclear Astrophysics, the Kavli Institute for Particle Astrophysics and Cosmology, the Korean Academy of Sciences (LAMOST), Los Alamos National Laboratory, the Max-Planck-Institute for Astronomy (MPIA), the Max-Planck-Institute for Astrophysics (MPA), New Mexico State University, Ohio State University, University of Pittsburgh, University of Portsmouth, Princeton University, the United States Naval Observatory, and the University of Washington.

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