



Variability of Low-ionization Broad Absorption-line Quasars Based on Multi-epoch Spectra from the Sloan Digital Sky Survey

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Abstract

We present absorption variability results for 134 bona fide Mg II broad absorption-line (BAL) quasars at $0.46 \lesssim z \lesssim 2.3$ covering days to ~ 10 yr in the rest frame. We use multiple-epoch spectra from the Sloan Digital Sky Survey, which has delivered the largest such BAL variability sample ever studied. Mg II-BAL identifications and related measurements are compiled and presented in a catalog. We find a remarkable time-dependent asymmetry in the equivalent width (EW) variation from the sample, such that weakening troughs outnumber strengthening troughs, the first report of such a phenomenon in BAL variability. Our investigations of the sample further reveal that (i) the frequency of BAL variability is significantly lower (typically by a factor of 2) than that in high-ionization BALQSO samples, (ii) Mg II-BAL absorbers tend to have relatively high optical depths and small covering factors along our line of sight, (iii) there is no significant EW-variability correlation between Mg II troughs at different velocities in the same quasar, and (iv) the EW-variability correlation between Mg II and Al III BALs is significantly stronger than that between Mg II and C IV BALs at the same velocities. These observational results can be explained by a combined transverse-motion/ionization-change scenario, where transverse motions likely dominate the strengthening BALs while ionization changes and/or other mechanisms dominate the weakening BALs.

Key words: galaxies: active – quasars: absorption lines – quasars: general

Supporting material: machine-readable tables

1. Introduction

Intrinsic absorption lines in quasars, indicative of outflowing material from circumnuclear regions of quasars, mainly manifest as broad absorption lines (BALs; e.g., Weymann et al. 1991) and mini-BALs (e.g., Hamann & Sabra 2004) in quasar spectra that are blueshifted with respect to systemic redshift. BAL quasars, which make up $\sim 20\%$ of all quasars (e.g., Gibson et al. 2009; Pâris et al. 2017), are usually classified into three subtypes depending on the ionization levels of the transitions present in their absorption troughs. The majority are classified as high-ionization BAL quasars (HiBALs), which contain deep and wide absorption troughs caused by species such as C IV, N V, and O VI. Low-ionization BAL quasars (LoBALs; $\sim 10\%$ of the BAL-quasar population; e.g., Trump et al. 2006) are characterized by the presence of additional low-ionization species (e.g., Mg II, Al III) in their spectra. Fe low-ionization BAL quasars (FeLoBALs; an even rarer subtype) show prominent Fe II and/or Fe III in addition to other low-ionization species.

Accumulating observational evidence indicates that BAL QSOs are likely associated with feedback from active galactic nuclei (AGNs), an effective process of controlling the coevolution between supermassive black holes (SMBHs) and host galaxies (e.g., Di Matteo et al. 2005; Fabian 2012). The inferred kinetic luminosities of AGN/QSO outflows from low

to high redshifts suggest that they could potentially play a critical role in AGN/QSO feedback (e.g., Crenshaw & Kraemer 2012; Borguet et al. 2013; Yi et al. 2017; Arav et al. 2018). BAL outflows thus have been proposed as important contributors to the regulation of the growth of both SMBHs and their hosts, and may even dominate their coevolution history. Signatures of these outflows are seen in spectra across a wide range of wavelengths, and they can provide abundant and powerful diagnostics to explore or at least constrain the geometrical structure, dynamics, chemical enrichment, and inner physics, greatly improving our understanding of AGNs.

The inner regions of quasars cannot be spatially resolved with current technology, leading to a poor understanding of the nature of BALs. Fortunately, BAL variability provides one of the most powerful diagnostics for exploring the origin of outflows. Variations of HiBAL troughs, in depth or in width (or both), are relatively common based on results from previous studies (e.g., Gibson et al. 2008; Capellupo et al. 2012; Filiz et al. 2013). In some cases, dramatic changes, either from individual-object (e.g., Hamann et al. 2008; Grier et al. 2015) or large-sample studies, have been reported (e.g., Gibson et al. 2010; Filiz et al. 2012). BALs showing monolithic velocity shifts over the entire BAL trough, which may be associated with the acceleration of outflows, have also been reported,

Table 1
Individual-/Sample-based BAL Variability Studies of (Fe II)LoBAL QSOs

References	No. of BALs ^a	Δt (yr) ^b	No. of Epochs	No. of Var ^c	Type ^d	Redshift
Junkkarinen et al. (2001)	1/1	~ 5.9	2	1	L	0.848
Hall et al. (2011)	1/1	0.6–5	4	1	F	0.848
Vivek et al. (2012a)	1/1	~ 10.9	7	1	L	0.92
Vivek et al. (2012b)	4/5	0.3–9.9	4–14	0	F	0.5–2.0
Vivek et al. (2014)	17/22	0.3–9.9	3–7	8	L/F	0.2–2.1
Zhang et al. (2015)	8/28	1–10	2–3	5	H/L/F	0.55–2.92
McGraw et al. (2015)	11/12	0.03–7.6	2–10	3	F	0.69–1.93
Rafiee et al. (2016)	3/3	0.03–7.6	2–4	3	L/F	0.83–2.34
Stern et al. (2017)	1/1	~ 9	3	1	L	2.345
This work	134/134	0.005–14	2–47	45	L/F	0.46–2.3

Notes. In our study, 134 Mg II-BAL QSOs have been selected from the main list (2109 BALQSOs) using the criterion of having at least two-epoch spectra. Among these Mg II-BAL QSOs, 80 have two-epoch spectra, 32 have three-epoch spectra, and 22 have ≥ 4 spectra.

^a Number of Mg II-BAL QSOs/the whole sample size.

^b Time span in the observed frame.

^c Number of variable objects.

^d L for LoBAL, F for FeLoBAL, H for HiBAL.

though rarely (e.g., Grier et al. 2016). The absolute amplitude of BAL variability does not increase with either higher radio-loudness or radio luminosity among HiBAL QSOs (e.g., Welling et al. 2009; Vivek et al. 2016), and similar results have been reported for samples of radio-selected (Fe)LoBAL¹⁰ QSOs (Zhang et al. 2015).

Systematic studies of BAL variability based on large samples of quasars have become increasingly feasible using data from large sky surveys carried out by dedicated facilities, such as the Sloan Digital Sky Survey (SDSS; York et al. 2000), which have greatly advanced our understanding of the properties of BALs. Indeed, previous sample-based studies have demonstrated that HiBALs are typically variable on timescales from days to years in the quasar rest frame (e.g., Gibson et al. 2008, 2010; Welling et al. 2009; Capellupo et al. 2011, 2012; Filiz et al. 2012, 2013; Wang et al. 2015; He et al. 2017). These investigations are almost exclusively based on high-ionization BALs. LoBALs, however, have thus far been studied sparsely, usually only including individual objects or small samples (see Table 1).

Vivek et al. (2014) reported that highly variable low-ionization BALs tend to occur at higher detached velocities, low equivalent widths (EWs), and low redshifts in a sample of 22 (Fe)LoBAL QSOs. This study also found that LoBAL variability is more frequently detected in QSOs showing strong Fe emission lines but found no clear correlation between continuum flux and LoBAL variability. Additionally, some studies have indicated that BAL variability in FeLoBAL QSOs is less common than in non-Fe LoBAL QSOs (e.g., Vivek et al. 2014; McGraw et al. 2015), while other studies have found a high fraction of BAL variability from a radio-selected sample (e.g., Zhang et al. 2015). However, inferences on FeLoBAL variability from previous studies can yield only tentative results because their sample sizes are inadequate to draw firm statistical conclusions.

Currently, the origins of BAL variability are poorly understood; however, transverse motions across our line of sight (LOS) and changes in the ionization state of outflowing gas are two of the most widely accepted explanations accounting for

BAL variability. The emergence or disappearance of BALs is often interpreted as gas moving into or out of the LOS (e.g., Hamann et al. 2008; Hall et al. 2011; Zhang et al. 2015; Rafiee et al. 2016), although some studies did find observational evidence of ionization changes among small-to-moderate EW BAL troughs (e.g., McGraw et al. 2017; Stern et al. 2017). Variability behaviors such as correlated variations with continuum fluctuations or coordinated EW variations for BALs of the same species but at different velocities are usually attributed to changes in the ionization state of the gas (e.g., Hamann et al. 2011; Filiz et al. 2013; Wang et al. 2015; De Cicco et al. 2018). Observed coordinated EW variability in troughs at different velocities indicates that at least $56\% \pm 7\%$ of BAL variability is due to variability in the ionization state of the absorbing gas (Filiz et al. 2013; He et al. 2017), as no obvious mechanism exists to explain such coordinated variability using transverse gas motion. However, because different-velocity absorbers associated with different densities in the same object do not always exhibit coordinated BAL variability in response to the same ionizing continuum variations (Arav et al. 2012), it is difficult to determine definitively which mechanism is dominant in individual cases. Constructing a large sample to investigate LoBAL variability systematically can improve our understanding of BAL variability from low- to high-ionization transitions as a whole. Although LoBAL QSOs are not the dominant population, their intrinsic properties may provide unique and valuable clues about nuclear outflows and hence shed light on the origin of BAL variability.

Section 2 describes the sample compilation, data reduction, and related analyses/methods adopted in this work. Section 3 describes the identification of Mg II-BAL troughs and introduces the definition of the “BAL complex” before quantifying their properties. The quantitative measurements are illustrated and demonstrated in Section 4. Statistical results are presented in detail in Section 5. In Section 6, we discuss the effect of saturation in our results and propose a model to account for the observed BAL variability. The paper concludes with a summary of the main conclusions in Section 7. Throughout this work, we use a cosmology in which $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$, $\Omega_M = 0.3$, and $\Omega_\Lambda = 0.7$.

¹⁰ Hereafter, we will use the term (Fe)LoBAL QSOs when a sample under study includes both LoBAL and FeLoBAL QSOs.

2. Sample Compilation and Data Analysis

We use spectroscopic data from the Sloan Digital Sky Survey-I/II (hereafter SDSS; York et al. 2000) and the Baryon Oscillation Spectroscopic Survey of SDSS-III (hereafter BOSS; Eisenstein et al. 2011). SDSS and BOSS are wide-field, large sky survey projects using the dedicated 2.5 m telescope at the Apache Point Observatory, New Mexico (Gunn et al. 2006; Smee et al. 2013). There are 2109 BAL QSOs in our main SDSS-based sample (see Filiz et al. 2013 for further discussion), among which 2005 are classified as “regular” BAL QSOs, and 104 are classified as “special” BAL QSOs that have characteristics such as long time coverages in spectroscopy, overlapping BAL troughs, or other unusual features. HiBAL (e.g., C IV and Si IV) variability of the sample has been intensively analyzed in previous studies (e.g., Gibson et al. 2009, 2010; Filiz et al. 2012, 2013; McGraw et al. 2017), but there is an obvious deficiency of investigations of LoBAL variability (Mg II-BAL variability in this sample has not yet been explored). Objects in the main sample are luminous BAL QSOs whose SDSS spectra have relatively high signal-to-noise ratios (S/Ns) and strong BALs in their SDSS spectra. To ensure the detection of major absorption lines, we only consider quasars with at least one spectrum with an average $S/N > 6$ from 3020 to 3100 Å or 2000 to 2150 Å in the rest frame depending on their redshifts. Because this work is focused on the variability of Mg II BALs, a redshift constraint is applied at $0.46 \leq z \leq 2.3$ to ensure adequate coverage of the Mg II region, within which 1526 BAL quasars are included. We choose to use the modified Balnicity index values for Mg II BALs ($BI_{M,0}$) from Gibson et al. (2009) to search for Mg II BALs, as the traditional BI metric does not include low-velocity ($v < 3000 \text{ km s}^{-1}$) BALs, which are frequently seen among LoBALs. We require the formal presence of one or more unambiguous Mg II-BAL troughs ($BI_{M,0} > 10 \text{ km s}^{-1}$) in the SDSS-I/II spectra and that there exist at least two spectroscopic epochs for each object. The average number of spectroscopic epochs in the sample is three, corresponding to six unique spectroscopic pairs.

Based on visual inspection, we exclude seven extreme overlapping-trough Mg II-BAL quasars, such as SDSS J030000.57+004828.0 (Hall et al. 2002), which have no available continuum windows below 2800 Å. We also exclude two objects, namely SDSS J010540.75–003313.9 (Hall et al. 2002) and J140800.43+345124.7, that have Mg II absorption too shallow to formally qualify as a BAL and a spectral turnover near 2800 Å for which it is difficult to fit a continuum. Such objects cannot be reliably studied using the continuum normalization approach adopted here. These exclusions leave 134 quasars, which comprise the Mg II-BAL sample used throughout this study. In addition, we obtained follow-up spectra using the Lijiang 2.4 m Telescope (LJT; Fan et al. 2015) and the Hobby–Eberly Telescope (HET; Ramsey et al. 1998; Chonis et al. 2016) for $\sim 6\%$ of the BAL QSOs in the sample. The spectral observations from SDSS-I/II and SDSS-III provide a long time baseline for most objects, typically longer than two years in the rest frame (see Figure 1). The maximum/minimum time spans (see Figure 1) for each object are obtained from the two spectra that give the maximum/minimum sampled rest-frame timescales.

In this work, we adopt the redshift values from Hewett & Wild (2010) for most objects in our sample. However, about 8% of our quasars have relatively large redshift discrepancies

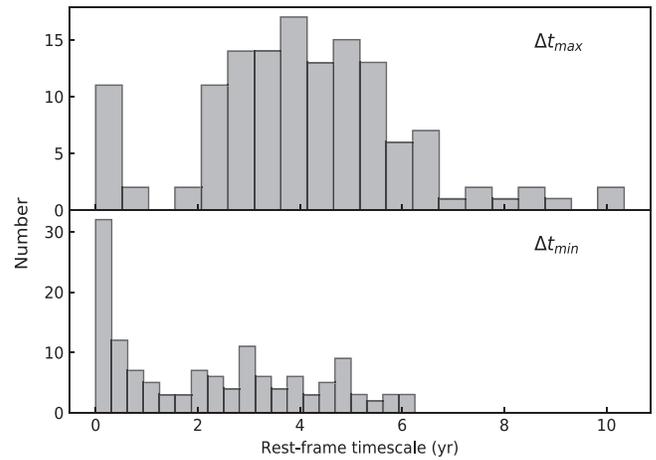


Figure 1. Distribution of the maximum (top panel) and minimum (bottom panel) sampled rest-frame timescales of the 134 Mg II-BAL QSOs in our sample.

Table 2
Properties of Mg II-BAL QSOs in the Sample

Name (SDSS)	z	N_e	R^*	M_i
J010352.46+003739.7	0.703	5	6.25	−25.73
.
J235843.48+134200.2	1.134	3	−1.0	−25.67

Note. N_e is the number of epochs; M_i is the absolute i -band magnitude (Schneider et al. 2010); R^* is the radio-loudness (Shen et al. 2011), where $R^* = -1$ means not available in that catalog.

(This table is available in its entirety in machine-readable form.)

($\Delta z \geq 0.01$) from different catalogs (e.g., Gibson et al. 2009; Schneider et al. 2010; Pâris et al. 2017), as these measurements are affected by strong absorption. If a discrepancy was found in at least two other quasar catalogs, we redetermine their redshifts based on the following criteria:

1. If typical narrow emission lines (e.g., [O II], [O III]) are present in the spectra, we choose the redshift that best matches the positions of these lines.
2. If narrow emission lines are absent but the Mg II broad emission line is present with a symmetric profile, we choose the redshift that best matches the Mg II line profile using the SDSS non-BAL-quasar composite template (Vanden Berk et al. 2001).
3. For a few objects with available near-IR spectra (see Section 5.5.3), we determine their redshift using the [O III] or H α emission line.
4. For objects that do not meet any of the three conditions above, we choose the redshift that best matches with the positions of the variety of emission features present. During this process, high-ionization emission lines have a low priority because they are often blueshifted with respect to the systemic velocities of quasars (e.g., Shen et al. 2016).

In conjunction with other quasar catalogs (Schneider et al. 2010; Shen et al. 2011), we tabulate several basic properties of our quasar sample in Table 2.

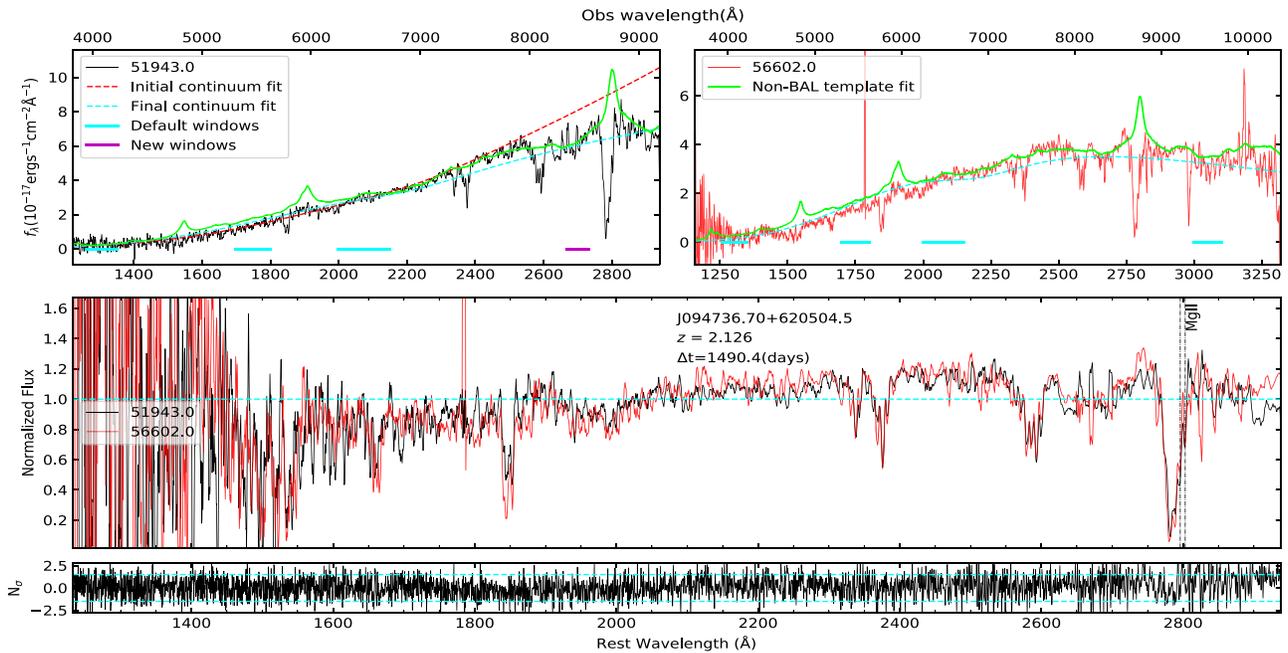


Figure 2. Demonstration of the continuum and non-BAL template fits: the top-left panel displays the differences between initial (red dashed line) and final (cyan dashed line) fits for the spectrum of the first (SDSS-I/II) epoch at MJD = 51943 with a narrower wavelength coverage. The top-right panel shows the BOSS spectrum at MJD = 56602, which covers a wider wavelength range. The non-BAL template fits are plotted above the two-epoch spectra (green lines). Comparisons between the two continuum-normalized spectra are presented in the middle and bottom panels (N_p ; see Section 4.2). All spectra are smoothed by an 8 pixel boxcar filter for display.

2.1. Continuum Fits

Our spectroscopic fitting can be separated into two processes: the continuum fit and the non-BAL template fit. The continuum fit is executed first to determine the continuum level, which in turn is adopted as a benchmark for the non-BAL template fit.

In previous studies of BAL variability, a variety of models have been adopted to fit the continuum, such as power-law models (e.g., Capellupo et al. 2011, 2012), reddened power-law models (e.g., Gibson et al. 2008, 2009; Filiz et al. 2013), and polynomial models (e.g., Lundgren et al. 2007). Following previous studies (e.g., Gibson et al. 2009; Filiz et al. 2013; Grier et al. 2016), we adopt a reddened power-law model to fit the continuum emission with a nonlinear least-squares fitting algorithm. We modeled the continuum in each spectrum using an Small Magellanic Cloud (SMC)-like reddened power-law function from Pei (1992) with free parameters including the amplitude, power-law index, and extinction coefficient. The initial continuum-fit windows are composed of relatively line-free (RLF) regions defined by Gibson et al. (2009): 1250–1350, 1700–1800, 1950–2200, 2650–2710, 2950–3700, 3950–4050, and 4140–4270 Å. However, these default windows do not always suitably sample the continuum for all objects, so they are adjusted where necessary to reach an acceptable final fit. In particular, obvious emission/absorption lines present in the default windows among all spectra have been excluded.

A number of operations were performed before and during the continuum-fit process, including pixel masking for each continuum-fit window and setting additional constraints (details are given in the following paragraph). All spectra are then converted to the rest frame using redshifts as discussed above. Emission and/or absorption features, in some cases, appear to be frequently present in the same fitting regions. Therefore, we adopt a sigma-clipping algorithm that consists of fitting the continuum function to the RLF windows for each

spectrum, and then rejecting data points that deviate by more than 3σ from the continuum fit for each pixel in each window. The final continuum fit is obtained by refitting the remaining data points. We do not attach physical meaning to the values of $E(B - V)$ obtained from our fits because there is an obvious degeneracy between the UV spectral slope and the magnitude of intrinsic reddening. The uncertainty of the continuum fit is obtained via a Monte Carlo approach through randomizations of spectral errors in the RLF windows.

In cases where BAL QSOs have spectra from both SDSS and BOSS, we choose the highest S/N spectrum from BOSS as a reference to set additional constraints to fit SDSS-I/II spectra, as BOSS spectra have a wider wavelength coverage. This aspect is particularly important in the scenario where the default number of RLF windows is different between the two spectra because of their difference in wavelength coverage. Using the additional constraints, the final continuum fit of the SDSS spectrum can be improved to be consistent with its BOSS counterpart that has a wider wavelength coverage. An example is shown in the top-left panel of Figure 2, where the initial SDSS-I/II fit (red dashed line) would be significantly inconsistent with that from the BOSS spectrum displayed in the top-right panel of Figure 2.

The continuum-fit process works well for most LoBAL QSOs in our sample. However, for $\sim 20\%$ of the objects in the sample, heavy absorption is often seen, or the 2200–3000 Å regions are contaminated by complex Fe II and Mg II emission/absorption lines, or the Mg II-BAL troughs lie in particularly noisy regions of the spectrum. In such cases, automatic fits may be unreliable, as the RLF regions may be unsuitable for use in these spectra. We identified these cases by visual inspection and manually refit them either by re-identifying RLF windows, increasing/decreasing weights to different windows, or adopting polynomial functions.

2.2. Non-BAL Template Fit

While our reddened power-law fits provide us with a reasonable estimate of the continuum level for our quasars, these fits do not take emission features into account, and thus they are insufficient for BAL studies in spectra with absorption troughs at low velocities that superimpose them on the Mg II emission line; the continuum fits also do not take into account the underlying blended contamination from Fe II (see examples in Figure 3), etc. Based on an investigation of a sample of 68 Mg II-BAL profiles, Zhang et al. (2010) reported that the Mg II-BAL composite spectrum is similar to the non-BAL composite spectrum of Vanden Berk et al. (2001) except for some subtle differences in terms of narrow emission lines and Fe II features. Therefore, we adopt a model combining the non-BAL composite spectrum (Vanden Berk et al. 2001) and an SMC-like reddening function (Pei 1992) as a template to fit the spectra in our sample.

During the initial template-fitting process, we only include the local region between 2200 and 3400 Å, where most spectra can be matched by the same non-BAL template with different reddening. The reddened non-BAL template can be simply expressed as the following function:

$$f(\lambda) = af_i(\lambda)e^{-\tau_\lambda}, \quad (1)$$

where f_i is the non-BAL-quasar template and τ_λ is a reddening factor that depends on the wavelength λ (Pei 1992). Because our reddened power-law fits can reproduce the underlying continua to a higher precision, they were adopted as benchmarks to guide the non-BAL template fits. Only data points above 95% of the continuum-normalized spectra were taken into account as the default, which effectively clips most absorption troughs. The template fits have independent $E(B - V)$ values from those derived from the corresponding continuum fits, though the two values are approximately equivalent in most cases.

Generally, the initial template fit works well for most cases where the Mg II emission lines are unabsorbed or slightly absorbed. In cases where the flux in the initial template fits around the Mg II emission line is underestimated, additional Gaussian components (no more than two) are adopted to fit the Mg II emission line. During this process, we use unsmoothed spectra in the wavelength range between 2790 and 2810 Å to capture the peak of the Mg II line. For intermediately and heavily absorbed Mg II emission lines, however, no adjustments have been made after the initial template fits even if the fits appear to overestimate the apparent peak strength of Mg II emission lines (e.g., J0947+6205 and J1030+3120 in Figure 3) as long as they are consistent among different spectroscopic epochs for the same object. The overfitted parts of the Mg II emission lines likely have little effect on the measurement of relative BAL variability because no dramatic Mg II emission-line variability was found in the sample, in agreement with that from Sun et al. (2015). The overfitted regions are consistent with each other over different epochs. Uncertainties may be introduced when reconstructing absorbed Mg II emission lines, especially in cases where the emission line is very heavily absorbed by a low-velocity trough. We visually inspect all cases where the Mg II-BAL troughs are attached to, or superimposed on, the Mg II emission lines.

In most cases, our initial template fits match the spectrum well on the redward side of Mg II, at $\lambda > 2800$ Å. However, a

few objects showing significant Fe II and Mg II absorption troughs or other unusual features may have large uncertainties due to the difficulty in reconstructing their intrinsic spectra. Therefore, additional broadened Fe II components were also taken into account during the fitting process for such objects. We use a combination of UV Fe II templates from Salviander et al. (2007) for the 2200–3090 Å region and from Tsuzuki et al. (2006) for the 3090–3500 Å region. Because some Fe II broad bumps ubiquitously appeared among these spectra at $\lambda > 2820$ Å, the original Fe II template was split into three main regions: $2830 < \lambda < 2910$ Å, $2910 < \lambda < 3050$ Å, and $3050 < \lambda < 3400$ Å. Before fitting, these Fe II components were linearly interpolated and then broadened by 5 pixel Gaussian kernel smoothing. Due to the absorption, we did not use additional Fe II components to fit Fe II emission features at $\lambda < 2800$ Å; thus, the fits in this region may deviate from the spectra, due to strong Fe II emission features (e.g., J0245+0005 and J0911+4446 in Figure 3).

We use the same fitting procedures to fit the spectra around C IV and Al III ($\lambda < 2200$ Å) in our C IV-BAL subsample, which allows BAL variability from low- to high-ionization species to be investigated simultaneously (see Section 5.7 for details). Many objects in our sample have two apparently different spectral slopes at blue ($\lambda < 2200$ Å) and red ($\lambda > 2200$ Å) wavelengths, which leads to an inability to fit the whole spectrum with a single reddened non-BAL-quasar template. To alleviate this problem, we opted not to tie the amplitude and reddening of the regions around the other emission lines to those from the local fit around Mg II. Instead, they are treated as independent parameters during the fitting process. Thus, in some cases, a break at 2200 Å caused by the independent fits can be seen. However, such a break does not affect our measurements of BAL variability, as the break is located far from the central positions of the two lines (at 1860 Å and 2800 Å for Al III and Mg II, respectively).

2.3. Consistency of the Two Methods

To compare the results derived from the reddened power-law fits and non-BAL template fits, we measure the quantity ΔEW (the difference in EW for the same BAL trough at two different epochs) for Mg II and C IV BALs using the two methods.

In general, the C IV BALs have much deeper and wider absorption troughs than those of Mg II BALs, although the actual optical depths are often hidden due to reddening and partial covering. In cases where objects have been intermediately absorbed, the reddened non-BAL template can model their unabsorbed spectra in a reasonable sense over different epochs for the same object, which may provide a more reliable normalization than that derived from a reddened power-law fit. For heavily absorbed objects, particularly for the template fit around the C IV emission line at the blue end of the spectra, the uncertainty in the EW of a trough may increase significantly, due to the effects of reddening, low S/N, abundance of heavy absorption features, and most importantly, a lack of identifiable continuum regions, leading to a larger scatter (more than one standard deviation in Figure 4) and discrepancy in the ΔEW derived from the two methods.

We found strong linear correlations of ΔEW (see Figure 4) using the two methods based on Pearson tests ($r > 0.8$ and $p < 10^{-23}$), suggesting that our non-BAL template fits do not introduce false variability signals and are thus unlikely to adversely affect our BAL variability analysis. Because the

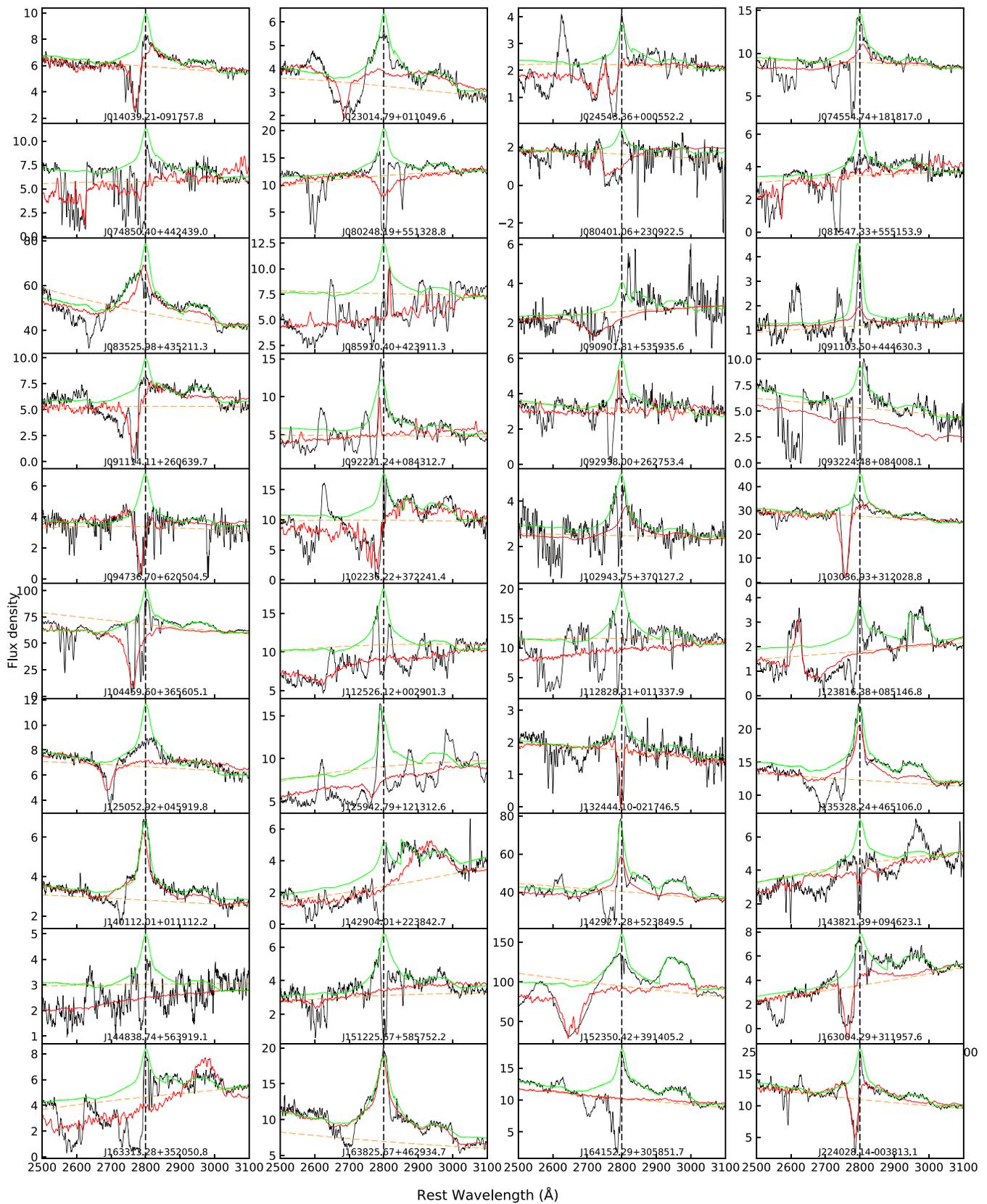


Figure 3. Demonstration of the diversity of various typical profiles around the Mg II emission line in our sample. Vertical dashed lines mark the center of the Mg II doublet. For each object, the actual spectrum (black line), best-fit spectral model (red line) from the SDSS pipeline, our reddened power-law fit (dashed orange line), and our non-BAL template fit (green line) are indicated. A few quasars show prominent bumps at $\lambda_{\text{rest}} \sim 2600 \text{ \AA}$, likely due to Fe II emission; they did not affect our measurements of relative BAL variability between different epochs (see the text for details).

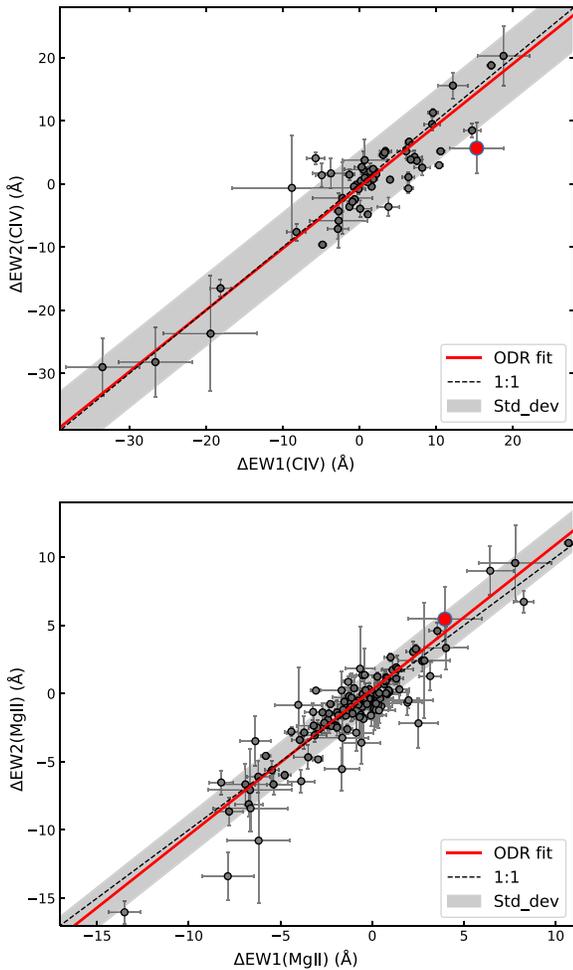


Figure 4. Comparison in EW variations from non-BAL template fits (ΔEW1) and reddened power-law fits (ΔEW2). The black dashed lines show the boundary where ΔEW1 equals ΔEW2 . Gray regions present linear fits based on orthogonal distance regression within a standard deviation. The big red circles refer to measurements in J0947+6205 as shown in Figure 2.

non-BAL template fits are likely to yield more accurate EWs that better characterize BALs, we adopt these as our standard method for normalizing spectra for analyses throughout. A large fraction of best-fit models from the SDSS pipeline failed to match the spectra in our sample (as shown in Figure 3), highlighting the importance of a new fitting method for this work. Compared with best-fit models from the SDSS pipeline, our non-BAL template fits provide much more reasonable fits to these spectra.

3. Mg II-BAL Identification and Measurement

As we imposed a requirement of $\text{BI}_{M,0} \geq 10 \text{ km s}^{-1}$ when compiling the sample, each object is expected to show at least one obvious trough blueward of the Mg II emission line. However, the identification and investigation of Mg II BALs can be somewhat difficult, as these troughs are often contaminated by Fe II emission/absorption lines, the Balmer continuum, and dust reddening. Indeed, the spectral shape between 2200 and 3400 Å in our sample differs from object to object, and sometimes even changes from epoch to epoch for an individual object (see Section 3.2).

Following previous studies (e.g., Trump et al. 2006; Filiz et al. 2013), we define velocities associated with blueward

absorption troughs to be negative. Positive velocities indicate features that are at longer wavelengths than the rest-frame emission-line center. Wavelengths are converted to LOS velocities using the red component ($\lambda = 2803 \text{ \AA}$) of the Mg II doublet.

3.1. Identification of Mg II-BAL Troughs

Mg II broad emission and absorption lines have a wide variety of characteristics (see Figure 3). Mg II-BAL troughs are typically weaker and narrower than those from C IV in the same object. The Mg II emission lines in the sample usually show slight asymmetry and blueshift with respect to the [O II] or [O III] emission lines, but most of them are blueshifted within the range of intrinsic uncertainties ($< 250 \text{ km s}^{-1}$; see Shen et al. 2016). In addition, some objects' profiles are obviously characterized by deep, wide troughs around the Mg II emission line plus significant reddening and apparent Fe emission/absorption, making the identification of “clean” Mg II-BAL components difficult.

After performing the non-BAL template fits, we smoothed each spectrum using a boxcar filter over five pixels ($\sim 69 \text{ km s}^{-1}$ per pixel) to aid in identifying BALs and mini-BALs (for definition, see Hall et al. 2002; Hamann & Sabra 2004). We then measured EWs, minimum/maximum velocities, velocity widths, trough depths, and variable regions (VRs; defined below), which all can be used to quantify BAL properties.

Both BAL and mini-BAL troughs signal the presence of circumnuclear outflows along our LOS. We include both BAL/mini-BAL troughs in our analysis and do not distinguish between them throughout this work. Note that the Mg II-BAL doublets with a separation of 769 km s^{-1} cannot be distinguished if the corresponding absorption lines are saturated and wider than the doublet separation. We thus choose a velocity-width threshold of 1250 km s^{-1} to search for all BAL/mini-BAL troughs after considering both the separation of 769 km s^{-1} and minimum velocity width of 500 km s^{-1} for mini-BAL troughs.

For our study, we consider only BAL troughs in the wavelength range from 2560 to 2820 Å ($-25,000$ to 1800 km s^{-1}). In general, most objects only show a single prominent Mg II-BAL trough, but this is a conservative estimate because ~ 40 objects exhibit apparent Fe II absorption troughs, which in turn may contaminate Mg II-BAL troughs and render them indistinguishable in the spectra. For simplicity, we exclude Mg II-BAL troughs blended with other species such as Fe II unless Al III and/or C IV show BAL troughs in a similar velocity range (for details, see Section 5.7). Fe II troughs are identified by checking whether UV62/63 Fe II* absorption troughs are present in an LOS velocity range similar to the Mg II troughs if UV1 and UV2/3 Fe II absorption troughs are clearly seen in the spectrum.

Although the actual errors in EW measurements are dominated by the continuum placement and reconstruction of the Mg II emission line, the propagated errors that are derived from statistical errors of the spectra and Monte Carlo simulations of the continuum fit often reflect systematic uncertainties well, particularly for quantitative analyses of BAL variability. In cases where absorption troughs are superimposed on the Mg II emission-line profile, the uncertainties in EW may increase significantly if the Mg II emission line cannot be reconstructed well. However, this work is mainly

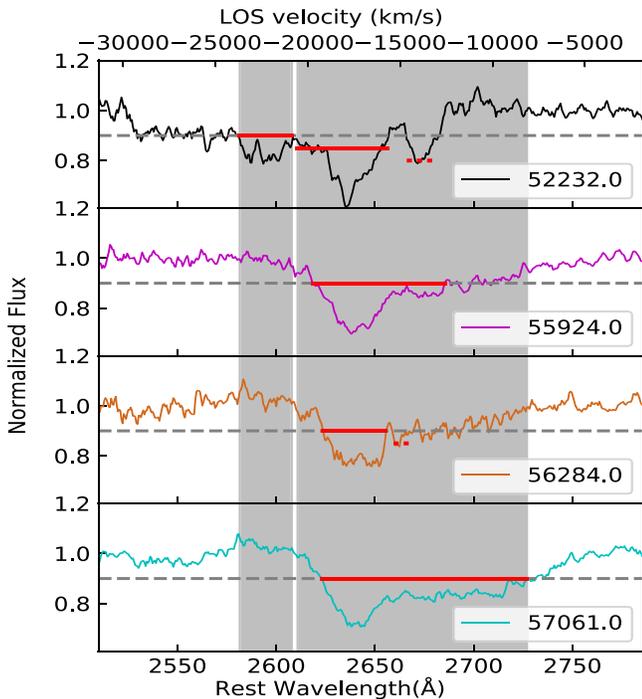


Figure 5. A demonstration of our procedure for identifying BAL complexes (see the text for details) in four spectra of J0835+4352. Red solid lines and dashed lines show BALs and mini-BALs, respectively. The two gray regions show the final ranges for the two independent BAL complexes identified by our algorithm.

focused on relative BAL variability, which is generally not sensitive to the reconstruction of the emission line provided the continuum placements are close to the true continuum level at each individual epoch.

3.2. BAL Troughs and BAL Complexes

Previous canonical definitions of BAL troughs associated with BI were mainly suitable for finding BAL troughs in a single-epoch spectrum. Our primary purpose in this work, however, is focused on BAL variability among multi-epoch spectra. Therefore, we use a slightly modified BAL trough definition, which is derived from both spectra for each epoch pair. Following a similar approach to Filiz et al. (2013), we define the “BAL complex” to deal with the issue. Defining a BAL complex is often necessary, as some absorption troughs may appear in one spectroscopic epoch with isolated components, and later disappear or show quite different shapes.

As shown in Figure 5, the spectral profiles and features of Mg II emission/absorption lines sometimes show different profiles in different epochs. The procedure for dealing with this issue during spectral analyses is as follows:

1. After dividing by the non-BAL template fits, all absorption troughs with velocity width larger than 1250 km s^{-1} are sorted by order of LOS velocities in each spectrum, and each one is flagged and marked with an identifier and its velocity ranges (minimum and maximum velocities) for the purpose of cross-comparisons among all unique pairs of epochs for the same object.
2. We then compare all results from every spectrum for that object. A BAL trough is identified as an overlapping pair if its velocity range partially or totally overlaps the range

of another BAL from different epochs for the same object.

3. Finally, we consider all pairs of overlapping troughs as a single “BAL complex,” with a velocity range that spans all of the overlapping troughs.

We demonstrate this procedure for identifying BAL complexes in the QSO J0835+4352 (Figure 5). In the top panel in the first spectrum, there are two BALs (thick red line) and one mini-BAL (dotted line) initially meeting our definition for the two types. Then, we gathered all unique troughs by examining regions where the velocity ranges of the troughs overlap or do not overlap in subsequent epochs, which yields two BAL complexes as shown in the two shaded regions in Figure 5.

4. Quantifying BAL Variability

Adopting a single indicator of variability can yield questionable results, due to the difficulty of quantifying the systematic uncertainties inherent in the spectra; some visible variations can be caused by photon noise or systematic uncertainties. In addition, using a single metric to quantify variability may face challenges due to the large variety of line profiles and shapes (see Figure 3) and the sometimes complicated variability patterns of BALs from epoch to epoch, as demonstrated by Figure 5. To alleviate these issues, we used three different metrics to quantitatively measure BAL variability. Our three chosen metrics ($\sigma_{\Delta EW}$, N_{σ} , and χ^2_{1-2}) are complementary to one another and when combined can gauge BAL variability more reliably.

4.1. BAL Variability Metric I: $\sigma_{\Delta EW}$

For each spectroscopic pair with times MJD1 and MJD2, the related quantities utilized in this work are defined as follows:

$$\Delta EW = EW_2 - EW_1; \text{Err}_{\Delta EW} = \sqrt{\sigma_{EW_1}^2 + \sigma_{EW_2}^2}, \quad (2)$$

where EW_1 and EW_2 are the EWs measured from an epoch pair at epochs MJD1 and MJD2. σ_{EW_1} and σ_{EW_2} are the corresponding errors, which are propagated from the uncertainty in the continuum fit and the spectral statistical error. $\text{Err}_{\Delta EW}$ is the final uncertainty of ΔEW .

For an individual BAL QSO, the fractional EW measurements of all BALs and mini-BALs in each epoch pair are used to measure the overall BAL variability. The fractional EW variation and its uncertainty are determined as follows:

$$\frac{\Delta EW}{\langle EW \rangle} = \frac{(EW_2 - EW_1)}{(EW_2 + EW_1) \times 0.5},$$

$$\text{Err}_{\frac{\Delta EW}{\langle EW \rangle}} = \frac{4 \times (EW_2 \sigma_{EW_1} + EW_1 \sigma_{EW_2})}{(EW_2 + EW_1)^2}, \quad (3)$$

where $\text{Err}_{\frac{\Delta EW}{\langle EW \rangle}}$ is the final uncertainty of $\frac{\Delta EW}{\langle EW \rangle}$. Both variations in the EW and fractional EW, as introduced above, can be chosen to quantify BAL variability with respect to relative changes in amplitude and proportion, respectively. Based on these quantities, we define the significance of amplitude/fractional

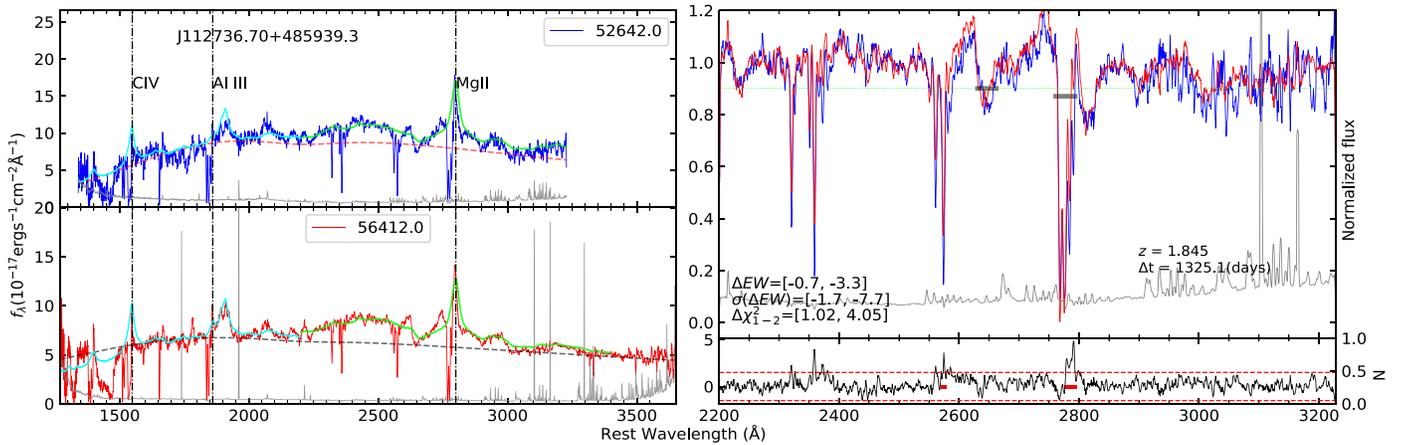


Figure 6. Demonstration of pair comparisons between two-epoch spectra for a given quasar. Left panels display different spectroscopic epochs (blue and red lines), errors (gray lines) and non-BAL template fits (green/cyan lines stand for fits around Mg II and C IV) for the same object. The top-right panel shows the spectra normalized by the non-BAL template fits, in which gray horizontal lines indicate all BAL troughs found in the pair. The bottom values enclosed in square brackets are ΔEW , $\sigma_{\Delta\text{EW}}$, and χ^2_{1-2} for each trough pair ordered from short to long wavelengths. The bottom panel presents the distribution of N_s for each pixel, in which variable regions are marked by thick red lines between 2560 and 2820 Å.

EW variations as follows:

$$\begin{aligned} \sigma_{\Delta\text{EW}} &= \Delta\text{EW}/\text{Err}_{\Delta\text{EW}}, \\ \sigma_{\frac{\Delta\text{EW}}{\langle\text{EW}\rangle}} &= \frac{\Delta\text{EW}}{\langle\text{EW}\rangle} / \text{Err}_{\frac{\Delta\text{EW}}{\langle\text{EW}\rangle}}. \end{aligned} \quad (4)$$

4.2. BAL Variability Metric II: N_σ

In some cases, variability is present across the entire BAL (or mini-BAL) trough, while in other cases only a portion of the trough varies. The EW may not necessarily be a good metric of variability in cases where only a small portion of the trough varies, or both increasing and decreasing portions appear in a BAL trough. As an alternate approach, bona fide variable troughs can be defined as a trough containing at least one significantly VR. To identify these VRs, we measure deviations between two spectra for each pixel in units of sigma, which is defined by the following equation:

$$N_\sigma(\lambda) = \frac{F_2 - F_1}{\sqrt{\sigma_2^2 + \sigma_1^2}}. \quad (5)$$

F_1 and F_2 are the normalized flux densities. σ_1 and σ_2 are the corresponding (normalized) flux-density uncertainties at wavelength λ . Both σ_1 and σ_2 include spectral errors and quantitative uncertainties from the fitting procedures mentioned above. Initially, the regions that were significantly variable were defined as those where $|N_\sigma| \geq 1$ in a consistent direction for at least five consecutive pixels (e.g., Gibson et al. 2008; Filiz et al. 2013), which allows the detection of VRs wider than $\approx 275 \text{ km s}^{-1}$ in our spectra. This requirement was imposed to minimize the possibility of random fluctuations being categorized as VRs.

Due to the diversity of Mg II-BAL troughs and contamination by Fe II emission/absorption, we use a more conservative threshold ($|N_\sigma| > 1.5$) to define our VRs compared to that ($|N_\sigma| > 1$) from Filiz et al. (2013). Adopting this more conservative threshold is particularly helpful for quantitative analyses in the blue/red ends of spectra, due to flux-calibration uncertainties based on our visual inspection (see Figure 6 for an example).

4.3. BAL Variability Metric III: χ^2_{1-2}

In cases where an absorption trough contains some regions of increasing EW and other regions of decreasing EW, using the variance (mean square deviation) to quantify variability can better reflect true variability. We thus calculate the reduced χ^2 for each distinct trough pair, which combines features from both the overall EW and individual VRs in a quantitative way. This quantity is defined as

$$\chi^2_{1-2} = \sum \frac{N_\sigma(\lambda)^2}{N}, \quad (6)$$

where N is the number of pixels spanning the BAL trough. The greater the value of χ^2_{1-2} , the more likely that the observed variations are not produced by systematic noise.

4.4. Classification of BAL Variability

In addition to utilizing the three above-mentioned variability metrics, we conduct a visual inspection of at least one spectroscopic pair for each object in our sample, which guarantees that our results are not affected by issues such as an improper fit. These three metrics all have different strengths, and thus, different weights are assigned to their reliability, depending on the specific properties of each object. For example, if a BAL trough has low S/N, the VR may not be suitable for quantitative analyses and instead the significance of EW variations in the trough may better characterize BAL variability; if a wide trough varies only in a small portion, then N_σ is more suitable for BAL variability analyses.

We investigate the relation between the $\sigma_{\Delta\text{EW}}$ and χ^2_{1-2} metrics sampled from all unique Mg II-BAL troughs. The $\sigma_{\Delta\text{EW}}$ and χ^2_{1-2} metrics are highly correlated (see Figure 7; a Pearson test yields $r = 0.76$). However, some apparent scatter can be seen in the distribution, which is likely linked to large deviations in extreme cases. It is therefore necessary to combine these metrics for a more reliable analysis of BAL variability.

To identify cases of true, significant variability, we thus adopt the following criteria:

Table 3
Mg II-BAL Trough Identifications and Quantitative Measurements

Name (SDSS)	R.A. (J2000)	Decl. (J2000)	MJD1	MJD2	χ_{1-2}^2	VR ^a	v_{\max}^b (km s ⁻¹)	v_{\min}^c (km s ⁻¹)	d1 ^d	d2 ^d	EW1 (Å)	EW2 (Å)
J0103+0037	15.96864	0.62772	51816	53726	1.9	0	-11334	-8665	0.22	0.15	5.4 ± 0.16	3.8 ± 0.16
			51816	55214	3.23	1	-11334	-8665	0.22	0.14	5.4 ± 0.16	3.4 ± 0.11
			51816	55475	2.09	0	-11334	-8665	0.22	0.16	5.4 ± 0.16	4.1 ± 0.09
			51816	57279	4.51	2	-11334	-8665	0.22	0.12	5.4 ± 0.16	2.9 ± 0.12
			53726	55214	0.68	0	-11001	-9134	0.18	0.16	3.2 ± 0.13	2.8 ± 0.09
			53726	55475	0.79	0	-11068	-8732	0.16	0.17	3.6 ± 0.15	3.9 ± 0.08
			53726	57279	0.95	0	-11001	-9134	0.18	0.15	3.2 ± 0.13	2.6 ± 0.1
			55214	55475	1.6	0	-11068	-8732	0.14	0.17	3.2 ± 0.11	3.9 ± 0.08
			55214	57279	0.65	0	-10935	-9267	0.17	0.16	2.6 ± 0.09	2.5 ± 0.09
			55475	57279	2.94	1	-11068	-8732	0.17	0.12	3.9 ± 0.08	2.7 ± 0.11
.	
.	
.	

Notes. This table summarizes our identifications and measurements of all unique Mg II-BAL troughs in the sample.

^a The number of variable regions (VRs) in the trough pair.

^b The maximum velocity (km s⁻¹) limits of the trough.

^c The minimum velocity (km s⁻¹) limits of the trough.

^d BAL depths at MJD1 and MJD2.

(This table is available in its entirety in machine-readable form.)

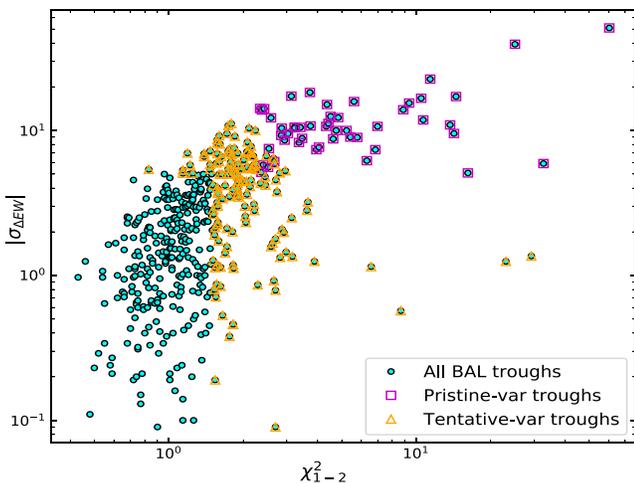


Figure 7. Distribution of the absolute $\sigma_{\Delta EW}$ vs. χ_{1-2}^2 from all BAL troughs (cyan), in which pristine (magenta squares) and tentative (orange triangles) variable troughs are indicated.

1. To be considered a “pristine” variable trough, a spectral pair must (i) have $\sigma_{\Delta EW} > 5$, (ii) have at least one VR in the trough, and (iii) have a χ_{1-2}^2 value larger than 2.3.
2. We define a trough to have “tentative” variability if it has at least one VR, or $\chi_{1-2}^2 > 1.5$, or $\sigma_{\Delta EW} > 5$.
3. Nonvariable troughs are defined as those not meeting either of the two conditions above.

Two types of BAL variability are often seen in our sample. The first is that both increasing and decreasing portions can be present in the same BAL trough, leading to small $\sigma_{\Delta EW}$ but large χ_{1-2}^2 . Another is that only a small portion of a wide BAL trough varies (either increasing or decreasing), causing large N_σ but small χ_{1-2}^2 . The three different quantitative metrics ($\sigma_{\Delta EW}$, N_σ , and χ_{1-2}^2) are therefore meant to complement one another in detecting different types of BAL variability in a sample with

a variety of absorption-line profiles from object to object and significant profile variability from epoch to epoch accompanied by varying S/N.

5. Statistical View of the Sample

In this section, we present the distributions of our measurements and our corresponding analyses.

5.1. Distribution of EW Variation versus Timescale

Measurements of all Mg II-BAL troughs are provided in Table 3 and related figures in this section. The quasar J1411+5328 has two unique Mg II-BAL troughs, and each of them has 1081 pair-wise combinations of spectra based on the available 47 epochs; this object thus contributes $\approx 76\%$ of the data points in the Mg II-trough distribution of the sample. Because we do not want a single object to dominate the distribution, particularly for small EW variations on short timescales, for this object we randomly choose three different-epoch spectra (corresponding to six combinations when searching for BAL troughs) for the statistical analysis.

The distributions of BAL variability versus timescale are displayed in Figure 8, in which the three groups (all, pristine variable, and tentative variable Mg II troughs) appear to show preferentially negative offsets in the distribution of EW variations, which indicate that strengthening troughs ($\Delta EW > 0$ Å) are less common than weakening troughs ($\Delta EW < 0$ Å). We adopted a nonparametric triples test (Randles et al. 1980) to examine the distribution of ΔEW for all BAL troughs, and this asymmetry was found to be significant at $>99\%$. Note that the nonparametric triples test does not assume the distribution is centered about zero, so as a check, we applied a two-sample Kolmogorov–Smirnov (K-S) test for the distributions of all weakening (based on absolute values) and strengthening BAL troughs, which also indicates a significantly asymmetric distribution around zero ($p = 0.0002$).

To display the overall trend in ΔEW versus timescale, we separately calculate the median of ΔEW using a sliding window of 15 time-ordered data points for weakening and

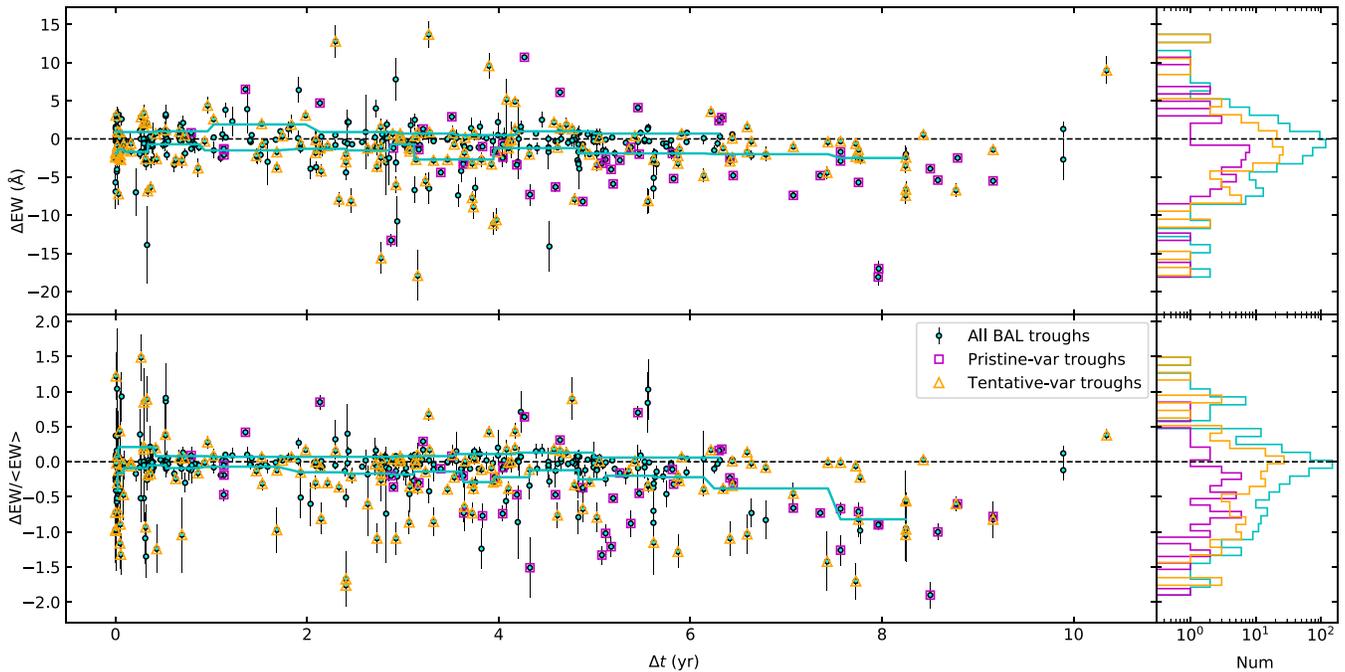


Figure 8. Distributions of ΔEW and $\Delta EW/\langle EW \rangle$ vs. the rest-frame timescale (Δt), in which pristine (magenta squares) and tentative (orange triangles) variable troughs are overplotted on all BAL troughs (cyan) between successive epochs. Solid cyan lines in the left panels represent the median ΔEW within a sliding window of 15 time-ordered weakening ($\Delta EW < 0$) or strengthening ($\Delta EW > 0$) troughs. In the right panels, we show the corresponding histograms of the distributions for the three groups. An apparent feature of the distributions is that the number of weakening troughs is larger than that of strengthening troughs.

strengthening troughs (see solid cyan lines in Figure 8). In general, both absolute and fractional EW variations become larger with the increase of timescale for weakening troughs; in addition, almost all troughs are from the pristine/tentative subsets at $\Delta t > 6$ yr, indicating that Mg II-BAL variability occurs with greater frequency on long timescales. For the strengthening troughs, there is no clear tendency regarding the distribution of ΔEW versus timescale.

Such a phenomenon of unequal weakening and strengthening rates of pre-existing BALs has not been reported previously. Rogerson et al. (2018) noted that when newly emerged BAL candidates are observed six to 12 months later, their ΔEW values show a large range but correspond to an overall average decline in EW (the cyan point in their Figure 20); however, unlike us, they studied a biased subset of the BAL population.

5.2. BAL Variability versus EW

Previous studies have found that HiBAL variability tends to become larger in amplitude with the increase of timescale both for absolute and fractional EW variations (e.g., Gibson et al. 2008; Filiz et al. 2013). We here examine the distributions of EW variability versus mean EW while first separating the LoBAL sample into short, intermediate, and long timescales.

The data in Figure 9 show that the maximum absolute and fractional EW variations of Mg II-BAL troughs at the 90% quantile level at $\Delta t < 1$ yr (-6 Å and -1 , respectively; see the left two panels in Figure 9) are obviously larger than those from Filiz et al. (2013), where the maximum values of the absolute and fractional EW variations of the C IV-BAL troughs are approximately equal to 2 Å and 0.3 at the 90% quantile level, respectively (see Figures 15 and 16 in their work). The fractional EW variations of weak Mg II-BAL troughs

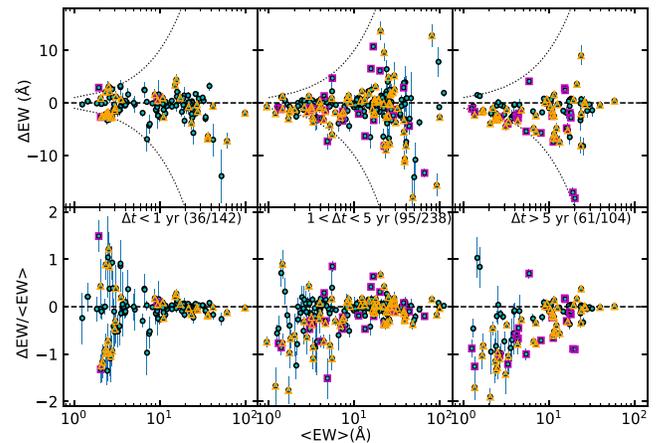


Figure 9. Distributions of EW variability vs. $\langle EW \rangle$ sampled for Mg II BALs over short, intermediate, and long timescales, in which pristine (magenta squares) and tentative (orange triangles) variable troughs are overplotted. Dotted curves denote the boundary where $|\Delta EW|$ is equal to $\langle EW \rangle$. The numbers of pristine+tentative and all troughs in each panel are given in parentheses. There is a clear trend wherein the longer the timescale is sampled, the more asymmetric the distribution of EW variations appears.

($\langle EW \rangle < 10$ Å) are dramatically larger than those from HiBALs on short timescales, although these weak Mg II-BAL troughs have large fractional uncertainties. On the other hand, the level of asymmetry for the EW variability shows an increasing trend as the sampling timescale increases (see the spread of EW variation versus timescale in Figure 8). We also note that a similar trend for the HiBAL sample of Filiz et al. (2013) for both C IV and Si IV BALs may start to appear at $\Delta t > 2.5$ yr (see Figure 16 in their work), although they do not comment on it. However, the large differences in the timescale

coverage, the average number of spectroscopic epochs, and the ionization potentials for the two samples in this work and Filiz et al. (2013) altogether make comparisons difficult.

Quantitatively, we analyze the correlations of $|\Delta EW|$ versus $\langle EW \rangle$, and $|\Delta EW|/\langle EW \rangle$ versus $\langle EW \rangle$, based on the Spearman rank correlation test. We find strong correlations between $|\Delta EW|/\langle EW \rangle$ and $\langle EW \rangle$ ($>99.9\%$) over all the three timescales. When considering the distribution of $|\Delta EW|$ versus $\langle EW \rangle$, we find a strong correlation ($>99.9\%$) only on the intermediate timescale. No correlations between $|\Delta EW|$ and $\langle EW \rangle$ were found over short and long timescales. The statistical results of the fractional EW variations for Mg II BALs are consistent with the HiBAL sample of Filiz et al. (2013) and the LoBAL sample of Vivek et al. (2014). Together, they confirm the similar tendency of larger fractional EW variations occurring at lower EWs in the whole BAL population.

As a comparison, significant correlations, both in the absolute and fractional EW variations, were found for HiBAL variability by Filiz et al. (2013); however, they also reported that the significance from Si IV BALs ($>95\%$) is lower than that from C IV BALs ($>99\%$). The weakening trend of correlations between EW variations and mean EWs from high- to low-ionization BALs suggests an underlying link between BAL variability and ionization potential, which may contribute to differences between HiBAL and LoBAL variability. Investigations of the relation between BAL variability and ionization potentials will be presented in Section 5.7.

5.3. BAL Variability versus BAL-profile Properties

BAL-profile properties, such as trough width, trough depth, and LOS velocity, provide useful diagnostics for the analysis of BAL variability. We investigate the relationships of these properties in this subsection.

Consistent with Vivek et al. (2014), the fractional EW variations are generally larger at higher velocities of $v > 10,000 \text{ km s}^{-1}$ than those at lower velocities of $v < 10,000 \text{ km s}^{-1}$ (see Figure 10), although our sample size is ~ 8 times larger than their sample. The apparent deficiency of data points between $\sim 5 \times 10^3$ and $\sim 7 \times 10^3 \text{ km s}^{-1}$ may be caused by the exclusion of troughs blended with Fe II troughs among FeLoBAL QSOs (see Section 3). We also found that there is a strong anticorrelation between LOS velocities and trough depths (see the third panel of Figure 10). High-velocity ($>21,000 \text{ km s}^{-1}$) Mg II-BAL troughs tend to have both shallow depths and narrow trough widths, which are mainly associated with weak BAL troughs ($\langle EW \rangle < 5 \text{ \AA}$). By contrast, low-velocity ($<4000 \text{ km s}^{-1}$) Mg II BALs tend to have higher depths and wider trough widths, as well as stronger BALs than those troughs at $>21,000 \text{ km s}^{-1}$. Similar observational results were reported by Filiz et al. (2014) for their sample of HiBAL QSOs.

Quantitatively, we found a significant correlation between LOS velocity and $|\Delta EW|/\langle EW \rangle$ using the Spearman test ($r_s = 0.39$, $p_s < 10^{-10}$); there is also a weak correlation between LOS velocity and $|\Delta EW|$ ($r_s = 0.22$, $p_s = 10^{-6}$). These results are different from Filiz et al. (2013), who found no significant correlations in both distributions for C IV, supporting our speculation of potential differences between HiBAL and LoBAL variability. The larger fractional EW variability occurring at higher velocities can be explained by the fact that higher velocity troughs are weaker, and trough weakness is the main driver behind the observed increasing

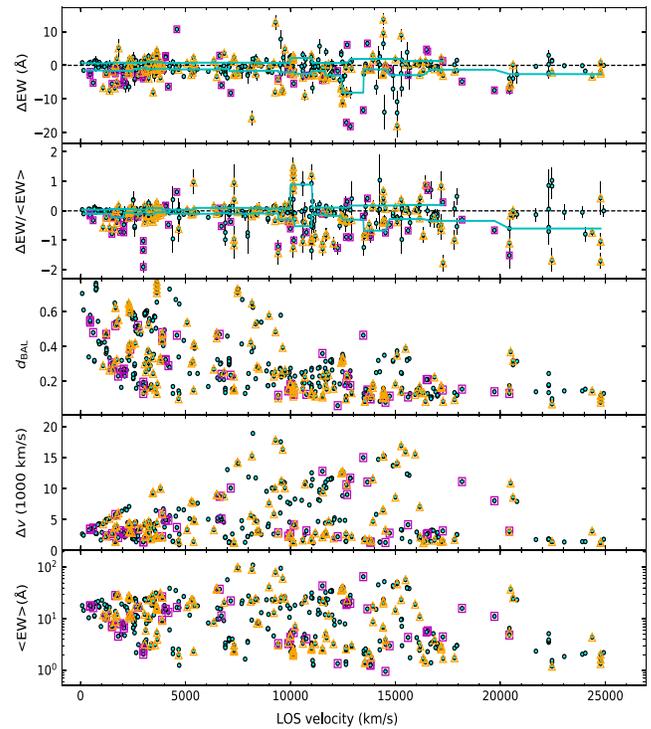


Figure 10. Distributions of the mean velocity vs. ΔEW , $\Delta EW/\langle EW \rangle$, mean BAL depth, velocity width (1000 km s^{-1}), and mean EW based on all Mg II-BAL troughs. Pristine (magenta) and tentative (orange) variable troughs are overplotted. Cyan solid lines represent the median values of the absolute and fractional EW variations within a sliding window of 15 velocity-ordered data points (all with $\Delta EW < 0$ or $\Delta EW > 0$). There are significant correlations of the LOS velocity with BAL depth, and LOS velocity with fractional EW variation.

fractional EW variations at high velocities. In addition, we found that the distributions of depth, width, LOS velocity, and $\langle EW \rangle$ sampled by all Mg II troughs and pristine+tentative variable troughs are consistent with each other ($p = 0.19$, $p = 0.97$, $p = 0.56$, $p = 0.74$, respectively) based on the two-sample K-S tests.

In addition, the distributions of EW variability versus width and depth are presented in Figure 11, in which we can see three apparent features. First, larger absolute EW variations tend to occur in wider ($\Delta v > 10,000 \text{ km s}^{-1}$) troughs. Second, distributions of fractional EW variation versus width and depth show a similar decreasing trend. Third, there is no clear dependence for the distribution of ΔEW versus depth. Consistent with Filiz et al. (2013), the deepest BAL troughs (those with $d_{\text{BAL}} > 0.6$) appear to show less variation than shallower ones, particularly for the distribution between fractional EW variations and depths, where a “flat” tendency appears at $d_{\text{BAL}} > 0.3$. However, we found that shallow Mg II BALs ($d_{\text{BAL}} < 0.3$) on average decrease their EWs, opposite to the result for C IV BALs from Filiz et al. (2013; see Figure 17 in their work). This finding provides a critical clue regarding the difference of BAL variability between HiBAL and LoBAL QSOs, which will be systematically investigated in Section 6.

5.4. Variable BAL-trough and BAL-quasar Fractions

To find out the highly variable portions over the whole BAL troughs in the sample, we analyze the VRs as defined in Section 4.2 for the sample.

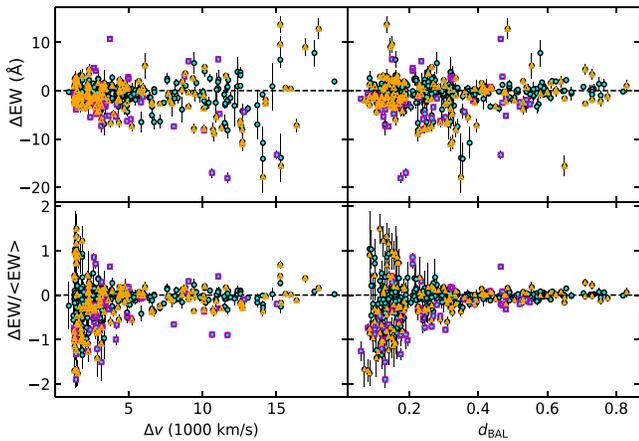


Figure 11. Distributions of EW variability vs. trough width (Δv) and depth (d_{BAL}) sampled by all Mg II troughs (cyan), in which pristine (magenta) and tentative (orange) variable troughs are overplotted. The distributions of $\Delta\text{EW}/\langle\text{EW}\rangle$ vs. Δv and d_{BAL} show a similar decreasing trend.

We first search for the total number of identified VRs from all unique epoch pairs in our sample. To eliminate overlapping VRs from the same object over different-epoch pairs, the same analysis used to define BAL-trough complexes (see Section 3.2) is adopted to generate a set of independent VRs for each object. We found 101 independent Mg II VRs (see the red circles in the inset panel of Figure 12) in our sample of 134 quasars over all spectroscopic epochs, and almost all of them have VR widths less than 2000 km s^{-1} (see the large panel of Figure 12). The peak in the distribution of VR widths is located at ~ 270 to 370 km s^{-1} , which is close to the minimum threshold (five consecutive pixels) set in searching for VRs.

Using the VR as the criterion to search for variable troughs, we found that about $37_{-4.5}^{+5.2}\%$ of Mg II-BAL troughs have at least one VR. As a comparison, the fractions of pristine and tentative variable Mg II-BAL troughs are about $10_{-2.3}^{+2.9}\%$ and $29_{-3.7}^{+4.4}\%$, respectively (the 1σ error bounds are calculated following Gehrels 1986), according to the criteria defined in Section 4.4. The apparent low fraction of pristine variable troughs arises from the strict criteria for an unambiguous identification of BAL variability. Thus, the fraction either from VRs or pristine+tentative variable troughs in our sample is in agreement with that from Vivek et al. (2014) with a fraction of $\sim 36\%$ from a sample of 22 (Fe)LoBAL QSOs.

We further examined those LoBAL QSOs with at least one VR sampled by all epoch pairs. As a result, 101 independent Mg II VRs are found in 54 quasars ($\sim 40\%$); additionally, 28 of these quasars ($\sim 21\%$) are classified as pristine variable type. The above results further support the argument that the incidence of Mg II-BAL variability is significantly lower than that of CIV-BAL variability (typically $\sim 50\%$ – 60% ; see Capellupo et al. 2012; Filiz et al. 2013), especially when considering the longer timescales covered in our sample. This is yet another piece of intrinsic difference that may exist between HiBAL and LoBAL variability. We will test this hypothesis in the following sections.

5.5. BAL Variability Dependence on Quasar Properties

Filiz et al. (2013) found that CIV-BAL variability does not show any strong dependences on quasar bolometric luminosity, redshift, radio-loudness, black hole (BH) mass, or Eddington

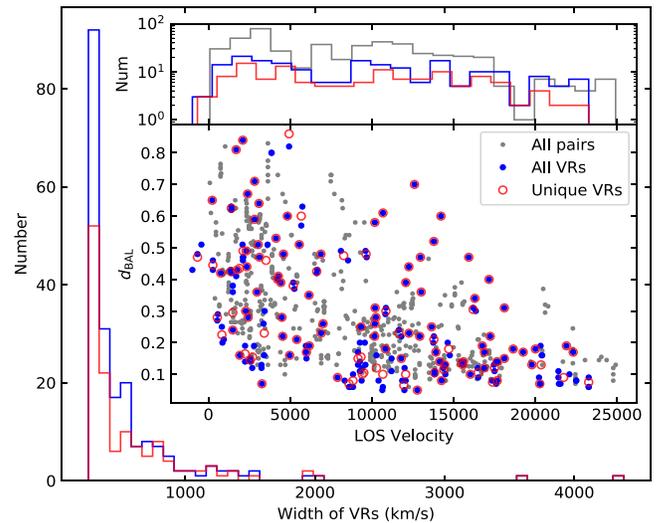


Figure 12. The large panel shows the velocity-width distributions of variable regions, in which the blue histogram represents all variable regions and the red histogram represents the results after the BAL-complex analysis. The inset panel displays the relation between the mean velocities and depths from all VRs (blue dots) and unique VRs (red circles) compared with the distribution of all Mg II-BAL troughs (gray dots). The depth of the Mg II-BAL troughs decreases with the increase in LOS velocities.

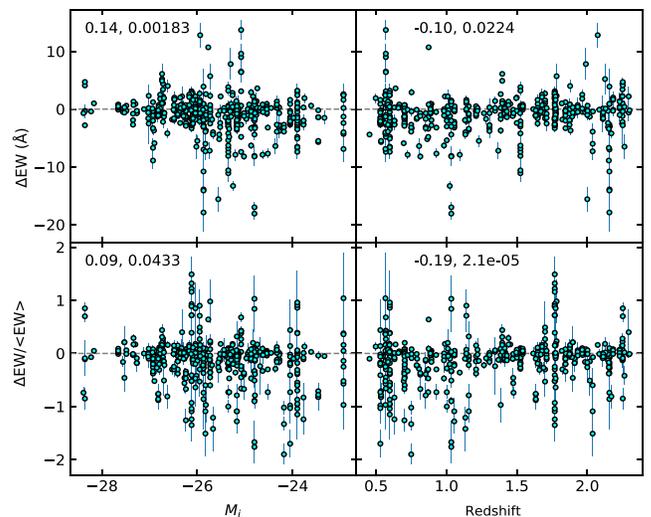


Figure 13. Distributions of ΔEW and $\Delta\text{EW}/\langle\text{EW}\rangle$ vs. the absolute i -band magnitude (M_i) and redshift, where no correlations are found. Spearman test results (r_s , p_s) using $|\Delta\text{EW}|$ are shown in each panel.

ratio. We here present the results of our investigation of these dependencies in our Mg II-BAL sample.

5.5.1. Luminosity and Redshift

The results are displayed in Figure 13, in which we find no evidence that the systemic redshift has any correlation with either ΔEW or $\Delta\text{EW}/\langle\text{EW}\rangle$ in our sample, disfavoring the argument that highly variable LoBAL QSOs tend to cluster at low redshifts as proposed by Vivek et al. (2014). No correlation between BAL variability and redshift may imply that Mg II BALs have little cosmological evolution in this redshift range ($0.46 < z < 2.3$). We also found no significant correlation between Mg II-BAL variability and luminosity, consistent with previous studies using HiBAL QSOs.

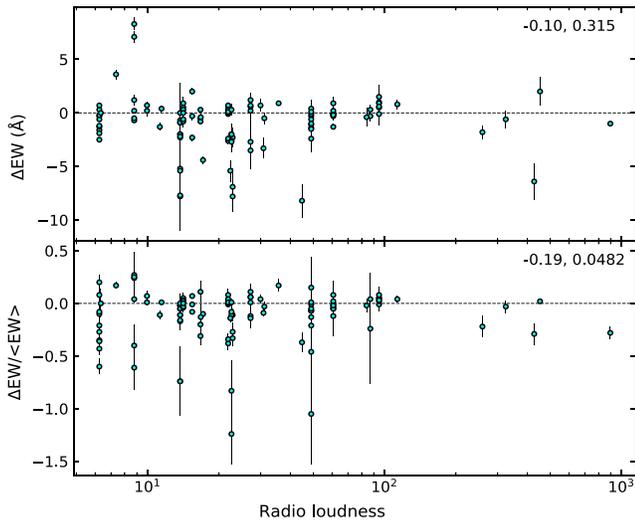


Figure 14. Distributions of ΔEW and $\Delta EW/\langle EW \rangle$ vs. radio-loudness, in which there is no clear dependence. Spearman test results (r_s , p_s) using $|\Delta EW|$ are shown in each panel.

5.5.2. BAL Variability of Radio-loud LoBAL QSOs

Radio-loud BALQSOs are currently not well understood, as they are rare and it was once thought that strong radio emission prohibited the presence of BAL troughs (e.g., Stocke et al. 1992; Becker et al. 2000). In this section, we examine BAL variability in the radio-loud subset of our sample.

Our sample consists of $\sim 23\%$ radio-loud quasars with radio-loudness (R^*) larger than 10, and only three are among the objects reported by Becker et al. (2000). This fraction is anomalously high in our sample, as it is at least 23 times the radio-loud fraction in the BAL population ($< 1\%$; Shen et al. 2011); in addition, it is two times higher than the average radio-loud fraction ($\sim 10\%$) in the whole quasar population. Moreover, 6 of the 32 objects have $R^* > 100$. Note that these objects have significantly high reddening, and 14 of them are selected from the “special” list of 104 objects (see Section 2), so the high radio-loud fraction is therefore likely biased to a large extent.

The distributions of the absolute/fractional EW variations versus radio-loudness are shown in Figure 14. A Spearman test ($r_s \approx -0.09$, $p_s \approx 0.32$) reveals no correlation between $|\Delta EW|$ and R^* . Similarly, no significant correlation between $|\Delta EW/\langle EW \rangle|$ and R^* has been found. Similar results were also reported for C IV-based BAL variability studies (e.g., Filiz et al. 2013). The high fraction of radio-loud LoBAL QSOs in our sample and the lack of a significant difference in BAL variability from radio-loud to radio-quiet quasars (e.g., Welling et al. 2009; Filiz et al. 2013; Vivek et al. 2016), in turn, may provide important insights into the inner structure of radio-loud LoBAL QSOs and the origin of jets and BAL outflows. Because powerful jets are naturally thought to interact with absorbing gas along our LOS and hence to play a role in BAL variability, it is thus worth exploring the underlying physics of radio-loud LoBAL QSOs in a dedicated work in the future.

5.5.3. Central BH Mass and Eddington Ratio

BAL outflows are believed to be launched from the nuclear or circumnuclear region of the QSO, leading to the possibility that BAL variability may depend on the activity level of the

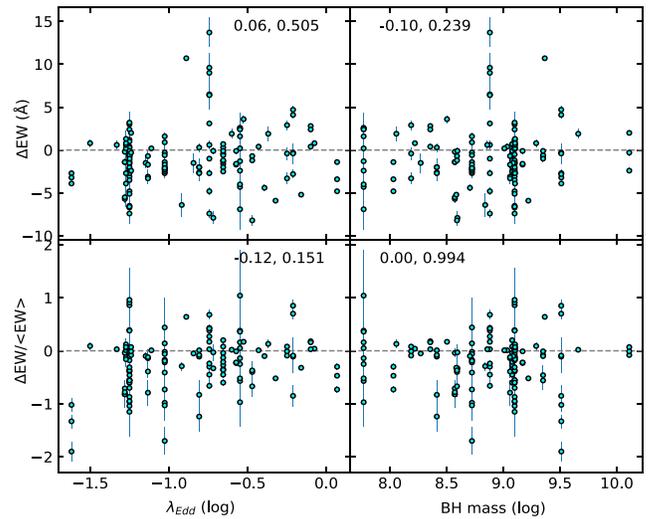


Figure 15. Distributions of the absolute/fractional EW variations vs. Eddington ratios and BH masses in the “clean” subsample of 36 Mg II-BAL QSOs with H β - or H α -based BH masses, in which no correlations are found. Spearman test results (r_s , p_s) using $|\Delta EW|$ are shown in each panel.

central engine. Thus, we may expect to find a correlation or an anticorrelation between EW variations and the Eddington ratio. However, the Mg II broad emission lines in our sample are usually affected by absorption. Therefore, we require alternate BH mass estimators that do not rely on Mg II. In addition, reddening increases significantly at shorter wavelengths for some quasars in the sample. Therefore, a reliable BH mass estimate based on the single-epoch virial relation must avoid these complications.

To construct a “clean” subsample, a search for H β -based BH masses has been done by cross-matching our sample with the SDSS DR7 quasar catalog (Shen et al. 2011), in which 30 quasars are found. In addition, four LoBAL QSOs were found from a near-IR spectroscopic study using the H α emission line (Schulze et al. 2017). Recently, four LoBAL QSOs (two of them from the 30 H β -based objects) were observed at near-IR wavelengths by the TripleSpec instrument at the Palomar Hale 200 inch telescope (P200/TripleSpec; Wilson et al. 2004). We estimate the BH mass and Eddington ratio from the high-S/N near-IR spectra using the same method as Schulze et al. (2017). For the two quasars with H β -based BH masses from Shen et al. (2011), we refine their BH mass using the H α estimator from near-IR spectroscopy, as their H β lines are located at the red end of the SDSS spectra with low S/N. This process produces a sample of 36 quasars with BH masses and Eddington ratios derived from the hydrogen Balmer lines, allowing us to investigate the LoBAL variability dependence on the BH mass/Eddington ratio in a more reliable and uniform way, at the cost of reducing the sample size.

We find no significant correlations ($|r_s| < 0.15$, $p_s > 0.15$ based on Spearman tests) between EW variability and Eddington ratio, or between EW variability and BH mass (see Figure 15). The results, in combination with those from Filiz et al. (2013), probably indicate that the Eddington ratio is not a dominant driver of BAL variability if we assume that the BH masses from their sample are not biased by the C IV estimator. However, limited by the subset size, we do not exclude the possibility of correlations entirely. A larger uniform sample is required to definitely determine the role of BH mass and Eddington ratio in LoBAL variability.

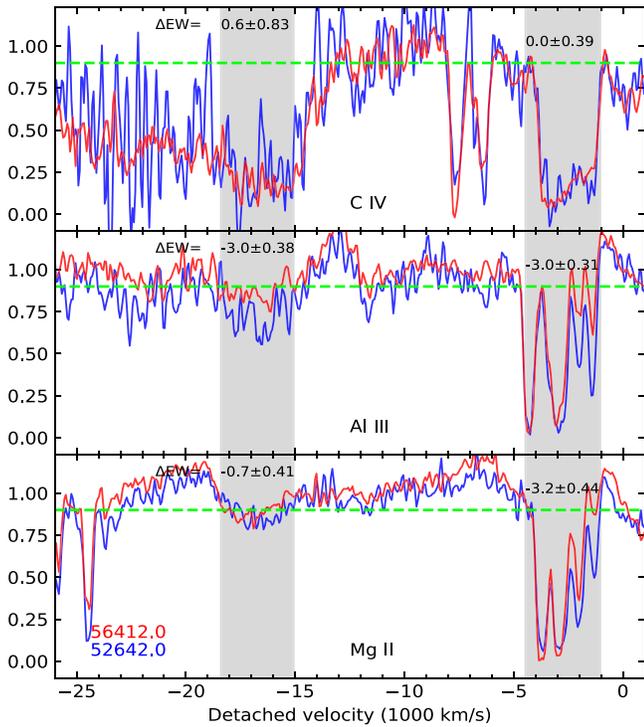


Figure 16. Demonstration of coordinated BAL variability from the same ion and the comparison between EW variations from BALs caused by different ions (C IV, Al III, and Mg II; see Section 5.7) in J1127+4859. Horizontal green lines represent the level at 90% of the normalized continuum. Vertical gray zones represent different-velocity troughs with corresponding measurements of ΔEW .

5.6. Investigation of Coordinated Variability over Different-velocity Mg II-BAL Troughs

Previous studies based on high-ionization BAL QSOs with multiple troughs from the same species have demonstrated that variations of multiple C IV troughs are strongly correlated (e.g., Capellupo et al. 2012; Filiz et al. 2012, 2013; Wang et al. 2015). In our sample, some objects have multiple Mg II-BAL troughs. Quasars with multiple BAL troughs from the same ion provide unique and powerful diagnostics to investigate differences/similarities between separated BAL troughs, allowing further understanding with respect to the origin of outflows and BAL variability.

The subset for investigating coordinated BAL variability is constructed from an automatic search of all objects having two or more independent Mg II-BAL troughs. One of the difficulties is that approximately 40 FeLoBAL QSOs exhibit apparent Fe II absorption troughs, among which high-velocity Mg II-BAL troughs are likely blended with Fe II components. Because this work is focused on Mg II-BAL variability, we did not account for multiple BAL components in most FeLoBAL QSOs. However, additional Mg II-BAL troughs were re-identified in the FeLoBAL subsample with the aid of Al III- and/or C IV-BAL troughs appearing in a similar velocity range (see Figure 16). These features are added to the subsample to investigate coordinated variability because these outflowing absorbers associated with different ions at same velocities are likely formed in the same region. This procedure, in turn, provides an effective way to assess the reliability of weak Mg II-BAL troughs. To exclude further any multiple troughs not caused by Mg II, all objects in the subsample are visually inspected. As a result, 23 objects hosting multiple Mg II-BAL

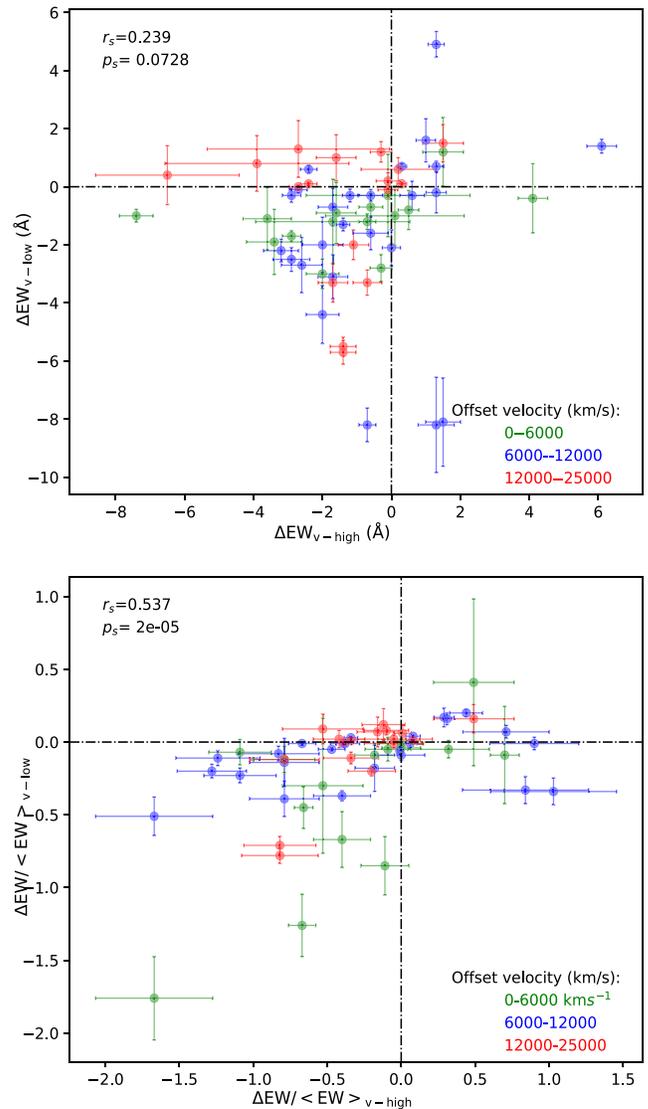


Figure 17. Distributions of absolute EW variations (top panel) and fractional EW variations (bottom panel) among BAL quasars with multiple Mg II troughs. Colors indicate the mean velocity separation between BAL-complex troughs. r_s and p_s values are derived from Spearman tests, where no correlation is found for absolute EW variations.

troughs are identified, and we separate them into three groups according to the offset velocity (see Figure 17).

Based on our measurements of absolute/fractional EW variations, we perform a Spearman test to examine whether possible correlations of BAL variability exist among different-velocity Mg II-BAL troughs. We found that there is a significant correlation between the fractional EW variations. In comparison, the correlation between the absolute EW variations in our sample is not highly significant (see Figure 17), which is obviously different from those based on HiBAL variability studies (e.g., Filiz et al. 2013; Wang et al. 2015), where highly significant correlations have been found using C IV-BAL troughs. Specifically, the absolute EW variations from the lowest offset-velocity group (green) show a significant correlation while the other two groups (blue and red) do not show any correlations, probably implying an offset-velocity dependence of the coordinated BAL variability. This finding is consistent with the results of Rogerson et al. (2018; their Section 4.7). However, the size of this subset is rather

small, and thus we require a larger sample to draw a firm conclusion.

For coordinated Mg II-BAL variability, a typical example is shown in Figure 16 (see Figure 6 for unnormalized spectra). The object (J1127+4859) has two Mg II-BAL troughs with an offset velocity of $13,000 \text{ km s}^{-1}$. One of them has a VR, $\sigma_{\Delta\text{EW}} > 5$, and $\chi_{1-2}^2 > 2.2$, which is identified as a pristine variable LoBAL QSO. It is apparent that the high-velocity trough nearly disappeared while the low-velocity trough depth decreased in EW in the later epoch. In addition, BAL variations occur across the whole high-velocity trough while only a portion of the low-velocity trough varied, likely due to saturation of the low-velocity trough. This object shows unambiguous coordinated LoBAL variability between the two different-velocity Mg II troughs along with similar Al III-BAL variability in a corresponding velocity range.

For uncoordinated Mg II-BAL variability, a typical example is shown in Figure 5, where one of the two Mg II-BAL troughs varies from epoch to epoch. Noticeably, after combining $\sigma_{\Delta\text{EW}}$ and χ_{1-2}^2 , we found that the low-velocity BAL trough composed of the first (MJD = 52232) and last (MJD = 57061) epoch spectra has a small $\sigma_{\Delta\text{EW}}$ but large χ_{1-2}^2 , which is caused by approximately equal weakening/strengthening portions occurring in the same Mg II trough ($\Delta\text{EW} = 0.4 \text{ \AA}$), and thus is hard to explain by ionization changes.

Coordinated variability between widely separated troughs in the same ion can be most naturally explained by changes in the ionization state, although we cannot rule out the possibility that the coordinated variability of absorption troughs is a combination of other effects. The fraction of uncoordinated Mg II-BAL variability in this subset can be roughly represented by these data points with opposite EW variations ($\sim 26\%$). However, this fraction is a lower limit because there is a dramatically high fraction ($\sim 42\%$) of Mg II-BAL troughs in this subset having $\sigma_{\Delta\text{EW}} < 5\sigma$ but $\chi_{1-2}^2 > 1.1$, which is potentially associated with the phenomenon where both increasing and decreasing portions are present for the same BAL trough (see Figure 7 for an overall distribution in the sample). Therefore, we argue that this phenomenon, as well as partial covering for Mg II-BAL absorbers with relatively high optical depths (see Section 6), could dominate the behavior of Mg II-BAL variability over different-velocity troughs in this subset and hence lead to the significantly weaker correlations in coordinated variability found in this subset compared to HiBAL QSOs.

5.7. Investigation of BAL Variability from Low- to High-ionization Species

In addition to the coordinated variability of troughs of the same ion at different velocities, correlations between EW variations of BAL troughs caused by C IV and Si IV have been reported in several sample-based studies. Gibson et al. (2010) and Capellupo et al. (2012) found no clear correlations in the absolute EW variations between C IV and Si IV BAL troughs, although tentative correlations were found in fractional EW variations. However, highly significant correlations in EW variations of different HiBALs were found from larger samples (e.g., Filiz et al. 2013; Wang et al. 2015). In addition, Filiz et al. (2014) reported that only a marginally significant correlation in EW variations was found between C IV and Al III. To date, no such work has been done for Mg II-BAL troughs, as previous Mg II-BAL studies did not meet requirements for both the sample size and redshift range.

In this section, we further investigate EW variations of BAL troughs caused by different ions at similar velocities. This subset includes 58 LoBAL QSOs with Mg II, Al III, and C IV BALs simultaneously present in the spectra for each quasar. The main advantages of studying BAL variability among different-ionization species are the following:

1. The C IV and Al III troughs are usually deeper than those of Mg II in LoBAL QSOs, which is particularly helpful in setting boundaries or identifying shallow multiveLOCITY components from Mg II-BAL troughs.
2. Different-ion BALs are quite useful for selecting “clean” Mg II-BAL components in FeLoBALs, where high-velocity Mg II BALs tend to be contaminated by Fe II absorption features. They can also be used as additional diagnostics to identify Mg II BALs attached to the Mg II emission line.
3. BAL variability in different ions at similar velocities also helps probe changes in ionization state, if their ionization potentials are comparable, such as Mg II and Al III, or C IV and Si IV.
4. Mg II, Al III, and C IV BALs appearing in the same object provide a unique and powerful probe to study BAL variability simultaneously from low- to high-ionization transitions (the ratio of ionization potentials is 1:2:4).

5.7.1. BAL Variability between Mg II and Al III

Due to the differences in ionization potentials (28.5 eV for Al III and 15.0 eV for Mg II) and the minimum photon energies needed to ionize Al II (18.8 eV) and Mg I (7.65 eV), Al III troughs are expected to be more common than Mg II troughs, as higher ionization troughs appear more frequently than lower ionization troughs in BAL quasars (e.g., Hall et al. 2002; Filiz et al. 2014). The presence of Al III also places a quasar in the LoBAL family; therefore, Al III can be used to compare different LoBAL subtypes with different-ionization potentials.

We restrict our subset to the 58 quasars showing both C IV and Mg II, as well as Al III, BALs to enable an investigation of all three species simultaneously. The widths and depths of Al III-BAL troughs are wider and deeper than Mg II troughs in general. To make appropriate comparisons, we use the same velocity ranges identified from the Mg II troughs to exactly match the Al III troughs for each object (see Figure 16 for an example).

Our measurements are shown in Figure 18. After performing Spearman tests, we found highly significant correlations between Mg II and Al III-BAL variability, both in absolute and fractional EW variations. Furthermore, the Pearson test reveals a strong linear correlation ($r = 0.78$) in the distribution of absolute EW variations between Mg II and Al III, implying that the two different-ion BALs are strongly associated. The EW variations of Mg II BALs tend to be stronger than those for Al III, as we measure the slope of the best linear fit (dashed line) to be smaller than the one-to-one (solid black) line. This tendency is similar to that from Filiz et al. (2014), where they found that the EW variations of Al III BALs are stronger than those of C IV BALs on average.

Compared with HiBAL variability studies, highly significant correlations, either in the absolute or fractional EW variations, were also reported between C IV and Si IV BALs (e.g., Filiz et al. 2013). We compare BAL variability correlations over

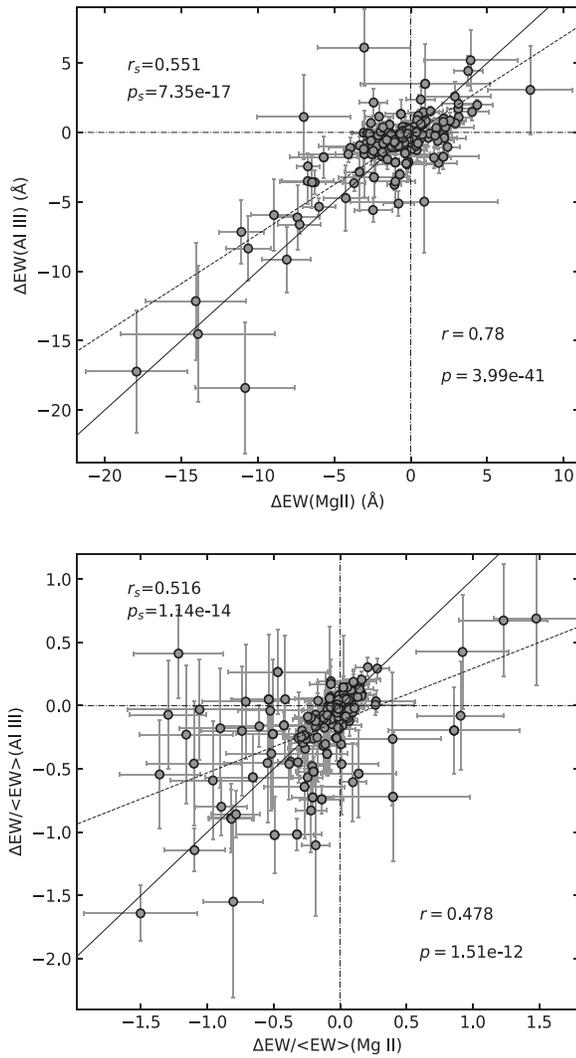


Figure 18. Comparison of EW variations (top panel) and fractional EW variations (bottom panel) between Mg II and Al III troughs. Spearman test results are shown in the top right of each panel; Pearson test results are shown in the bottom right of each panel. The solid black lines show the same absolute/fractional EW variations. The dotted lines represent the best linear fits. There is a strong linear correlation in the distribution of ΔEW between Mg II and Al III.

different species from low- to high-ionization transitions in Section 5.8.

5.7.2. BAL Variability between Mg II and C IV

Investigating the relationships between Mg II and C IV is complicated by wavelength-dependent reddening and larger differences in ionization potentials (64.5 eV for C IV and 15.0 eV for Mg II) and the minimum photon energies needed to ionize C III (47.9 eV) and Mg I (7.65 eV). C IV-BAL troughs also tend to exhibit lower S/N and lower flux-calibration accuracies (due to their location at the blue end of spectra), reducing the reliability of quantitative measurements. Consistent with Filiz et al. (2014), another common feature in the subset is that these C IV BALs usually exhibit much deeper and wider troughs than those from Mg II and Al III, although the actual C IV-BAL depths are hidden among those objects that are heavily affected by intrinsic reddening. Therefore, only a

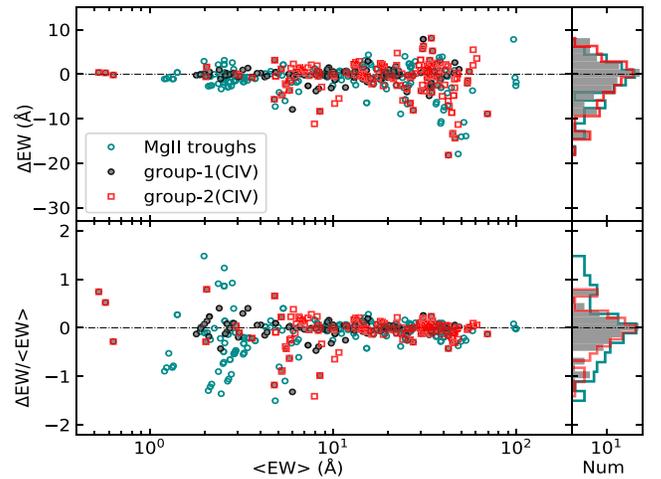


Figure 19. Left panels show the distributions of EW variations as a function of mean EWs in C IV BALs measured by the Mg II-BAL matched (group 1) and entire C IV (group 2) troughs, respectively; right panels are the corresponding histogram distributions. Cyan circles are the Mg II troughs used for matching C IV BALs. In general, C IV BALs tend to have higher EWs and show larger absolute EW variations but smaller fractional EW variations than Mg II BALs.

lower limit on the real depth can be derived from normalized spectra in such cases.

Note that C IV-BAL troughs usually appear to be less variable in the velocity range exactly matched with a Mg II-BAL trough while being more variable in other portions for the same BAL trough (see the high-velocity C IV BAL in Figure 16 as an example). We measure the EWs of the C IV BALs from both an exact match of the Mg II-BAL width that is defined as group 1 and the entire C IV-BAL width that is defined as group 2. Indeed, the absolute EW variation of the C IV-BAL troughs derived using the former method (see black dots in Figure 19), on average, is smaller than that derived using the latter method (red squares in Figure 19). Two reasons can explain this phenomenon. First, the C IV-BAL trough is ubiquitously stronger than the Mg II-BAL trough when both of them are present in the same spectrum. Second, C IV-BAL components corresponding to group 1 tend to be more saturated compared to the entire C IV-BAL troughs (group 2) and hence become less variable. Conversely, the absolute EW variations in C IV-BAL troughs from group 1 also appear to be smaller than those of corresponding Mg II-BAL troughs; a “flat” tendency in the distribution of fractional EW variations of group 1 C IV-BAL troughs starts to appear at $\langle EW \rangle > 10 \text{ \AA}$, which is apparently different from that of Filiz et al. (2013), where the “flat” tendency appears at $\langle EW \rangle > 40 \text{ \AA}$ (see Figure 18 in their work). Such differences are likely attributed to a higher likelihood of saturated C IV-BAL troughs in our sample, as most of them exhibit one (or more) nonblack saturation shape (s) characterized by a roughly constant but nonzero residual flux, a strong signature of saturation under a partial covering condition. Furthermore, the similar “flat” tendency of the fractional EW variability between Mg II and group 1 C IV troughs indicates that Mg II troughs are also saturated but at a lesser level.

Although the EW variations of the C IV BALs measured by the two above methods are apparently different (particularly for the absolute EW variations), the results obtained by the two methods, from a statistical point of view, are consistent with each other regardless of which boundaries are used to measure the C IV-BAL EW (see the Pearson test results in Figure 20).

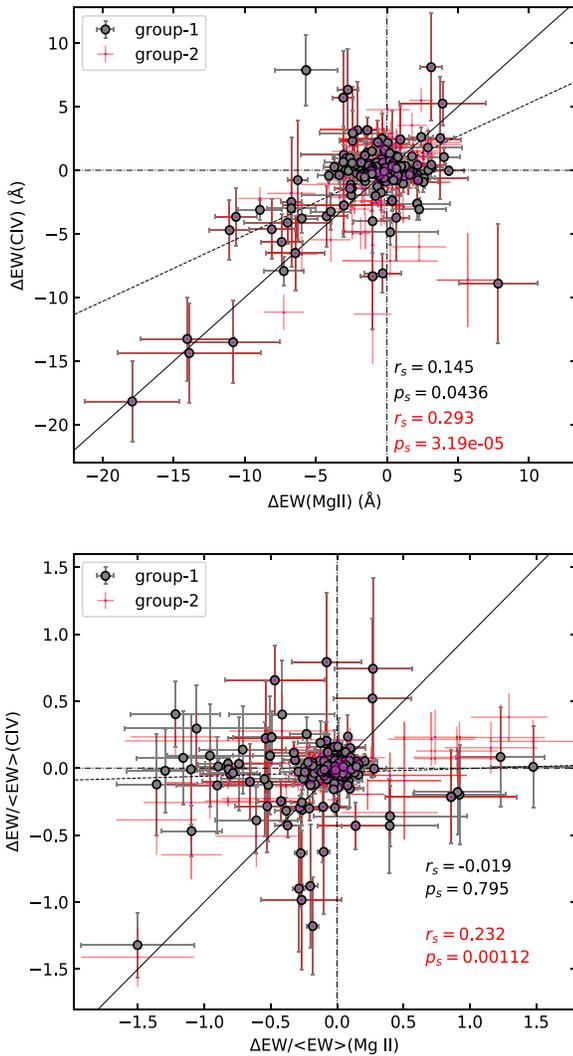


Figure 20. EW variations from Mg II-BAL matched (group 1) and the whole C IV-BAL velocity ranges (group 2) against Mg II-BAL troughs. Spearman test results are shown in the bottom right of each panel. The solid black lines show the same absolute/fractional EW variations in group 1. The dotted line represents the best linear fit in group 1. This figure reveals a significantly weaker correlation between Mg II and C IV compared to that between Mg II and Al III in ΔEW .

Obviously, statistical results indicate that the correlations of BAL variability between Mg II and C IV are significantly weaker than those between Mg II and Al III, implying that Mg II-BAL absorbers have stronger connections with Al III-BAL absorbers than with C IV-BAL absorbers. The significantly weaker correlations compared to previous HiBAL variability studies can be explained, to a large extent, by saturation effects and/or large differences in ionization potential and density. For an individual example, Figure 16 demonstrates that the Mg II-BAL variability behavior highly resembles that of Al III, while BAL variability is uncertain in C IV.

In combination with the investigations of coordinated BAL variability for Mg II (see Section 5.6), our results suggest that Mg II and Al III-BAL absorbers have strong connections while Mg II- and C IV-BAL absorbers, as well as different-velocity Mg II-BAL absorbers for the same quasar, appear to be more independent of each other.

5.8. Comparison of BAL Variability from Mg II, Al III, and C IV

As C IV and Mg II possess ionization potentials of 64.5 eV and 15.0 eV, in combination with the minimum photon energies of 47.9 eV and 7.65 eV to form them, respectively, we do not expect to find strong correlations in BAL variability such as those observed between Al III and Mg II. The presence of Al III-BAL troughs (28.5 eV and 18.8 eV for the ionization potential and minimum photon energy, respectively) provides a natural bridge over the gap from low- to high-ionization transitions (with the ionization-potential ratio among Mg II, Al III, and C IV $\approx 1:2:4$).

Our statistical analyses (see Section 5.7) indicate that the correlation strength of BAL variability between Mg II and Al III is significantly stronger than that between Mg II and C IV (see Table 6). The result that species with closer ionization potentials are more correlated is consistent with that of Filiz et al. (2014), who reported that the correlation of BAL variability between C IV and Si IV is highly significant compared to the marginal correlation between C IV and Al III.

These findings are consistent with the case where a gas cloud contains both C IV-BAL and Mg II-BAL absorbers (with a large difference in the ionization potential) at the same velocity, and the C IV BALs are often saturated due to its higher abundance. Consequently, saturation effects must play an important role in determining these correlations mentioned above, given the large difference in abundance and ionization potential between Mg II and C IV.

For an overview of the various correlations measured throughout this entire section, we tabulate the Spearman test results in Tables 4–6.

6. Discussion

We here discuss the implications of the results from Section 5 and propose a model to further address the time-dependent asymmetric variability (the preference for the EW to weaken rather than strengthen over time) observed in the Mg II-BAL sample. However, an exhaustive examination of potential models is beyond the scope of this work, so we note that while our proposed model is consistent with our data, there may be additional models that will describe the data well.

6.1. Asymmetry in EW Variability

In this subsection, we systematically analyze the asymmetric EW variability, one of the most dramatic differences between LoBAL and HiBAL variability. Previous variability studies of the full HiBAL population did not find any significantly asymmetric distributions with respect to the weakening and strengthening of BAL troughs (e.g., Gibson et al. 2008; Filiz et al. 2013; Wang et al. 2015), although we note that the asymmetric EW variations for the HiBAL sample of Filiz et al. (2013) may start to appear at $\Delta t > 2.5$ yr (see Figure 16 in their work).

The observed preference for negative changes in EW are unlikely due to biased measurements, as the distributions of the ΔEW derived with the reddened power-law and non-BAL template fits are consistent (see Figure 4). Additionally, they are not biased by cases where both increasing and decreasing portions occur in the same BAL trough as these tentative variable troughs show similar distributions (see Figure 8). Note that there are ~ 40 QSOs in the sample with apparent Fe II absorption troughs. We checked the distributions for

Table 4
A Statistical View of Mg II-BAL Variability vs. Direct Measurements from the Entire Sample

	Δt	$\langle \text{EW} \rangle\text{-S/I/L}$	$\langle \text{EW} \rangle$	v_{LOS}	d_{BAL}	Δv
$ \Delta \text{EW} $	$0.14, 2 \times 10^{-3}$	N/Y/N	$0.18, 4 \times 10^{-5}$	$0.22, 9 \times 10^{-7}$	$0.15, 6 \times 10^{-4}$	$0.33, 3.6 \times 10^{-14}$
$ \Delta \text{EW} /\langle \text{EW} \rangle$	$0.16, 4 \times 10^{-4}$	Y/Y/Y	$-0.53, 5 \times 10^{-36}$	$0.4, 1 \times 10^{-19}$	$-0.67, 6 \times 10^{-64}$	$-0.31, 2.1 \times 10^{-12}$
v_{LOS}	$-0.26, 4 \times 10^{-9}$...	$-0.63, 1 \times 10^{-60}$	0.0, 0.92

Note. Spearman test results (r_s, p_s) of Mg II-BAL EW variability versus various properties measured from the entire sample. $\langle \text{EW} \rangle$ and $\langle \text{EW} \rangle\text{-S/I/L}$ represent mean EWs on the entire and short/intermediate/long timescales, respectively, in which ‘‘Y’’ and ‘‘N’’ refer to correlation and noncorrelation. Highly significant correlations ($r_s > 0.5, p_s > 10^{-3}$) are highlighted in bold.

Table 5
A Statistical View of Mg II-BAL Variability vs. Physical Properties from Different Subsets

	M_i	z	R^*	M_{BH}	λ_{Edd}
$ \Delta \text{EW} _{\text{Mg II}}$	0.14, 2×10^{-3}	-0.1, 0.02	-0.1, 0.31	-0.1, 0.24	0.06, 0.5
$ \Delta \text{EW} /\langle \text{EW} \rangle_{\text{Mg II}}$	0.09, 0.04	-0.2, 2×10^{-4}	-0.19, 0.05	0.0, 0.99	-0.12, 0.15
$ \Delta \text{EW} _{\text{C IV}}$
$ \Delta \text{EW} /\langle \text{EW} \rangle_{\text{C IV}}$

Note. Spearman test results (r_s, p_s) of EW variability versus different physical quantities from different subsets.

Table 6
A Statistical View of the Coordinate/Correlated BAL Variability among Different-velocity/Ion BALs

	$ \Delta \text{EW} _{\text{Mg II } 2}$	$ \Delta \text{EW} /\langle \text{EW} \rangle_{\text{Mg II } 2}$	$ \Delta \text{EW} _{\text{Al III}}$	$ \Delta \text{EW} /\langle \text{EW} \rangle_{\text{Al III}}$	$ \Delta \text{EW} _{\text{C IV}}$	$ \Delta \text{EW} /\langle \text{EW} \rangle_{\text{C IV}}$
$ \Delta \text{EW} _{\text{Mg II}}$	0.24, 0.07	...	$0.55, 7 \times 10^{-17}$...	0.14, 0.04	...
$ \Delta \text{EW} /\langle \text{EW} \rangle_{\text{Mg II}}$...	$0.5, 2 \times 10^{-5}$...	$0.52, 1 \times 10^{-12}$...	-0.02, 0.79

Note. Spearman test results (r_s, p_s) of EW variability versus different-velocity Mg II BALs and different-ion BALs at the same velocity from different subsets. $|\Delta \text{EW}|_{\text{Mg II } 2}$ and $|\Delta \text{EW}|/\langle \text{EW} \rangle_{\text{Mg II } 2}$ are derived from those quasars having more than two different-velocity Mg II BALs. Highly significant correlations ($r_s > 0.5, p_s > 10^{-3}$) are highlighted in bold.

asymmetry after excluding these FeLoBAL QSOs and found that the distribution of EW variations is consistent with the entire sample via a two-sample K-S test. This result is somewhat expected because we already exclude most of the Fe II troughs during the identification of Mg II-BAL troughs; in particular, for these troughs mixed with overlapping Fe II troughs, we only keep ‘‘clean’’ Mg II components (see Section 3.1 for details). In addition, there is a high fraction ($\sim 23\%$) of radio-loud LoBAL QSOs in the sample; we also checked the distributions for asymmetry after excluding them. Again, the observed asymmetry is still present.

One possible explanation for the asymmetric EW variability may be associated with selection effects. Note that our initial threshold ($\text{BL}_{M,0} > 10 \text{ km s}^{-1}$) for selecting bona fide Mg II-BAL QSOs misses those variability cases where non-BAL/HiBAL QSOs change to LoBAL QSOs and hence may increase the fraction of positive EW variations in the sample. Therefore, we cannot rule out the possibility of such a selection effect, as the investigation of the emergence rate from non-BAL/HiBAL QSOs to LoBAL QSOs is beyond the scope of this work. However, it is more likely that the selection effect would only lead to a slight (or negligible) asymmetric distribution of EW variations, as BAL emergence/disappearance events are rare in BAL variability, and the HiBAL emergence rate is broadly consistent with the HiBAL disappearance rate (e.g., Rogerson et al. 2018).

Another possible explanation for the asymmetric EW variability is that the lifetimes of Mg II-BAL episodes may be short enough that over long rest-frame timescales ($> 5 \text{ yr}$), more objects will be observed gradually moving toward a non-LoBAL phase than increasing the strength of their LoBAL phase. In our sample, we found that the majority of quasars with more than three-epoch spectra did show a similar long-term declining and short-term rising trend in BAL EWs; in particular, we observed one BAL to disappear over a long timescale ($> 5 \text{ yr}$) and appear on a much shorter timescale ($< 1 \text{ yr}$; Yi et al. 2019). Similarly, Trevese et al. (2013) reported that the EW slowly declines accompanied by a sharp increase in a C IV BAL.

The most likely cause for our observed asymmetric EW variability, however, is that many Mg II-BAL absorbers have relatively high optical depths under partial covering. We assess this possibility and test the effect in Sections 6.2 and 6.3.

6.2. EW Variations of a Mg II Trough in the Ionization-change Scenario

A recent study based on a large sample of 6856 BAL quasars reveals that LoBAL QSOs are ubiquitously accompanied by P V absorption (Hamann et al. 2019), indicating high saturation for the usual HiBALs like N V and C IV. Indeed, observational evidence in support of saturation effects over C IV BALs was

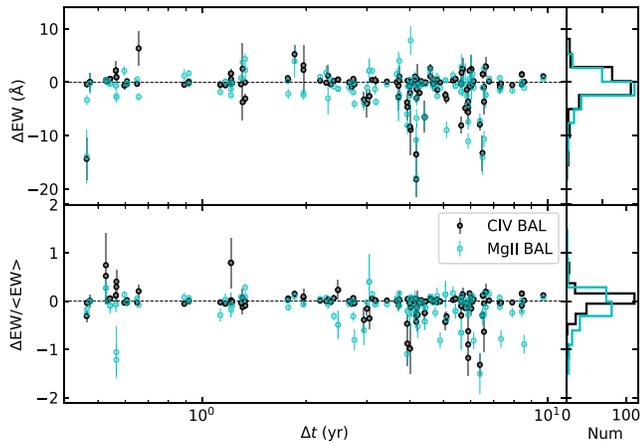


Figure 21. Distributions of rest-frame timescale vs. ΔEW and $\Delta EW/\langle EW \rangle$ for C IV and Mg II BALs, both of which show a similar asymmetric distribution while Mg II BALs appear to have large EW variations.

found throughout Section 5.7 in our sample. Hamann et al. (2019) also found that the Al III doublet components appear to have trough-depth ratios consistent with $\sim 1:1$ in most cases, suggesting saturation for low-ionization gas in LoBAL QSOs.

If saturation effects play a role in the Mg II-BAL troughs, it is natural to expect similar variability behavior in the C IV-BAL troughs at corresponding velocities. We choose QSOs from the subset showing both C IV and Mg II BALs in the same velocity range (see Section 5.7), which to some extent, can be used to investigate whether or not the Mg II BALs are saturated. Figure 21 shows that we see a similar asymmetry in ΔEW for Mg II, with a preference for negative ΔEW as seen in C IV. Moreover, C IV-BAL variability is on average smaller than Mg II both in absolute and fractional EW variations, suggesting that C IV BALs may be more saturated than Mg II BALs at the same velocity. An additional evidence supporting saturation effects among the Mg II BALs, as shown in Figure 19, is the similar “flat” distributions of $\Delta EW/\langle EW \rangle$ versus $\langle EW \rangle$ between Mg II- and matched C IV-BAL troughs, in which $\Delta EW/\langle EW \rangle$ appears to level off at $\langle EW \rangle > 10 \text{ \AA}$ for both C IV and Mg II. Such a phenomenon is different from that in Filiz et al. (2013), where the “flat” distribution appears at $\langle EW \rangle > 40 \text{ \AA}$ (see Figure 18 in their work). Most importantly, shallow Mg II BALs in our sample on average decrease their EWs in the later epoch (see Figure 11), which is opposite to the finding for shallow C IV BALs from Filiz et al. (2013) (see Figure 17 in their work). Such a remarkable difference could be due to the fact that Mg II-BAL absorbers in our sample tend to have relatively higher optical depths (if not saturated) and smaller LOS-covering factors than C IV-BAL absorbers from Filiz et al. (2013), as low-ionization gas is likely embedded inside high-ionization gas when they appear at the same velocity along our LOS (e.g., Arav et al. 1999; Baskin et al. 2014; Hamann et al. 2019).

To better illustrate the detection of positive/negative EW variations of BAL troughs with relatively high optical depths and test the above argument, we quantitatively examine EW variations of a doublet with an inherent optical depth ratio of 2 at different optical depths caused by ionization changes. In reality, the profile of a Mg II-BAL trough may have a wide range of shapes (see Figure 3). To demonstrate the final result for Mg II-BAL variability in this sample, we use effective

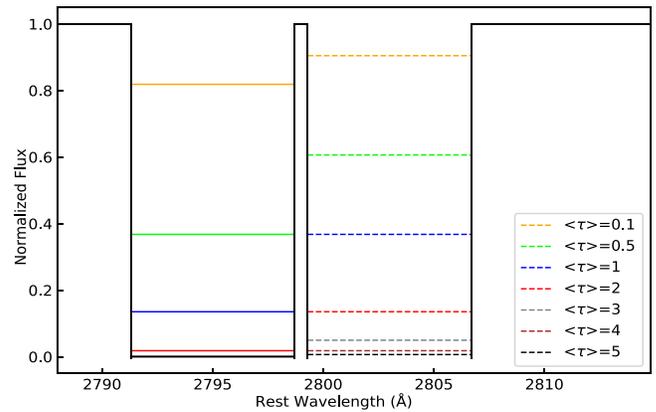


Figure 22. Effective BAL profiles of a doublet at different mean optical depths (marked by different colors) under the full coverage condition. The strong (solid) and weak (dashed) components of the doublet have an inherent optical depth ratio of 2.

troughs of the Mg II doublet at different mean optical depths (see Figure 22), from which we can visually quantify EW variations. In this demonstration, for simplicity, we ignore the EW error and assume that $|\Delta EW_{\text{thres}}| = 1 \text{ \AA}$ (corresponding to the area below the dashed/solid red lines) is the threshold for distinguishing between nonvariable and variable troughs.

If the weak component (dashed) of the doublet has an initial $\langle \tau \rangle = 2$, then the EW ($\approx 14 \text{ \AA}$) of the doublet is equal to the area above the dashed/solid red lines (the total EW of the two rectangle troughs is 15 \AA). As $\langle \tau \rangle$ randomly varies between 0 and 5 due to ionization changes, we cannot detect EW variability in all cases where $|\Delta EW| < 1 \text{ \AA}$. Therefore, for this doublet, we can detect only weakening troughs with $|\Delta EW| > 1 \text{ \AA}$ as $\langle \tau \rangle$ randomly varies between 0 and 5 in the later epoch. The example demonstrated here is an analog for all high-saturation ($\langle \tau \rangle > 5$) and partial covering cases, where this effect would become more evident.

Similarly, when performing the same analysis for shallow, unsaturated (e.g., $\langle \tau \rangle < 0.5$) BAL troughs, we found that we can detect more strengthening than weakening troughs, which naturally explains the finding from Filiz et al. (2013) that shallow C IV troughs tend to increase their EWs among HiBAL QSOs.

This also explains the systematic difference that the fraction of variable Mg II BALs ($\sim 37\%$) found in this work is significantly lower than those of variable HiBALs (50%–60%) found from previous studies, as we cannot detect all strengthening Mg II-BAL troughs below their corresponding detection thresholds.

6.3. Investigating BAL Variability in a Combined Transverse-motion/Ionization-change Scenario

The observation that only portions of BAL troughs show variations (see Figures 12 and 16), the lack of significant correlation in the absolute EW variations over different-velocity Mg II troughs, the presence of strong correlations in BAL variability between Mg II and Al III while there are no correlations in BAL variability between Mg II and C IV, and the observed asymmetry in EW variations altogether indicate that the ionization-change mechanism alone seems incapable to explain our observed BAL variability. Therefore, ionization change and transverse motion may be jointly taken into account to interpret BAL variability for the sample, as we have found

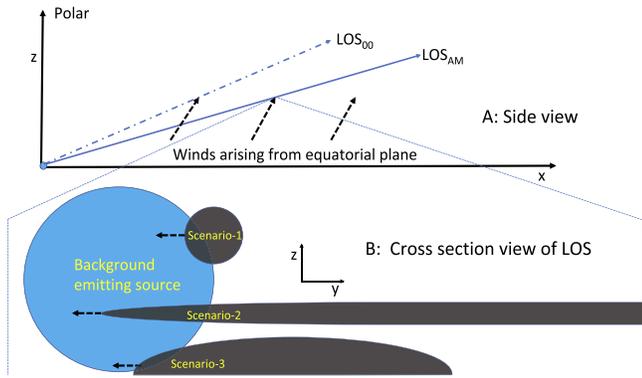


Figure 23. Schematic illustration of BAL absorbers moving across our LOS. Top panel: LOS_{00} and LOS_{AM} represent HiBAL and LoBAL sightlines from a side view, respectively. Bottom panel: cross section of (zoomed-in) LOS_{AM} , where scenario 1, scenario 2, and scenario 3 represent three effective-shape BAL absorbers crossing the LOS_{AM} . The LOS_{AM} is closer to the equatorial plane and has a higher optical depth compared to the LOS_{00} .

strong observational evidence in support of the argument that Mg II-BAL absorbers in our sample tend to have relatively high optical depths (if not saturated) and small LOS-covering factors (see Sections 5.3 and 6.2 for details).

Combining all of the observational results from Section 5 and our analyses of the Mg II-BAL EW variations in the ionization-change scenario, we provide a model for LoBAL variability in the sample that can further address the observed time-dependent asymmetry in EW variation.

Our observational results indicate that Mg II BALs in the sample have an average covering factor of 0.25 derived from the median depth of all Mg II-BAL troughs; in addition, these BALs likely have an initial mean optical depth $\langle\tau\rangle > 1$ at the first epoch. Adopting this covering factor of 0.25 for a BAL absorber with an initial $\langle\tau\rangle = 1$ (corresponding to $EW \approx 3 \text{ \AA}$ and the maximum positive $\Delta EW = 0.9 \text{ \AA}$ by setting the maximum trough depth to 0.25 in Figure 22), we examine EW variability in a combined transverse-motion/ionization-change scenario for an individual quasar.

We use Figures 22 and 23 together to demonstrate the final result. Although the BAL-absorber density is most likely inhomogeneous (e.g., Hamann et al. 2019), we adopt an effective shape with a uniform density (same as the background continuum-source emission) to demonstrate the final result; this result is the same if the “clouds” shown in Figure 23 actually consist of numerous subunits. The effective projected shape of a Mg II-BAL absorber consisting of numerous subunits, in general, could be scenario 1 in Figure 23 (a small cloud), or scenario 2 (a long flow tube), or scenario 3 (a large cloud), depending on the projected-size ratio between the BAL absorber and its background emitting area. Thus, scenario 1 represents all cases where the BAL-absorber size is less than that of the background source while scenario 2 and scenario 3 depict the opposite cases. However, our assessment holds regardless of whether the BAL-absorber structure is scenario 1, scenario 2, or scenario 3. As we adopt 0.25 to be the maximum partial coverage for the BAL absorber, we need the constraint that the large cloud cannot cover its background source beyond 25% at any time in scenario 3. Therefore, scenario 1 and scenario-2 can be applied to the entire sample provided they are uniformly distributed, while scenario 3 may work only for individual objects.

During the analysis, we did not constrain the projected shape of a BAL absorber, as long as it meets the two conditions required by the observations: (1) the absorber has a relatively high optical depth (e.g., $\langle\tau\rangle > 1$) under partial covering, and (2) the timescale (Δt_1) from the point where a BAL absorber starts to increase the LOS coverage to the point it reaches the maximum LOS coverage is less than the timescale (Δt_2) over which the absorber moves across the LOS after reaching the maximum LOS coverage. In short, Δt_1 and Δt_2 represent intrinsic strengthening and weakening timescales in the LOS coverage, respectively, which are independent of detection and projected BAL-absorber shape.

Specifically, we consider the case where $\Delta t_2 = 4 \times \Delta t_1$ and assume $\Delta t_1 = 1 \text{ yr}$ in scenario 1. Adopting the same threshold ($|\Delta EW_{\text{thres}}| = 1 \text{ \AA}$) for the detection of EW variability (see Section 6.2), we now examine the EW variability in a combined (transverse motion and ionization change) scenario with a maximum LOS coverage of 0.25. In this case, we can detect an increase in EW (due to an increase in LOS coverage) within one year from the start ($EW = 0$) to the point the maximum LOS coverage is reached ($EW \approx 3 \text{ \AA}$); after that point, the BAL absorber will take four years to move across our LOS. During those four years, we cannot detect strengthening troughs because the maximum positive EW variation of the doublet ($\Delta EW = 0.9 \text{ \AA}$) is below the detection threshold of 1 \AA , but we can detect weakening cases where $\Delta EW < -1 \text{ \AA}$, due to ionization changes and/or other mechanisms. The example demonstrated here is an analog for all other $\Delta t_2 > \Delta t_1$ and partial covering cases, where this effect would become more evident with increasing Δt_2 when Δt_1 remains constant (e.g., the entire BAL outflow is much larger in size than the BAL structure observed in scenario 2).

This model is supported by observational evidence that the strengthening and weakening rates in EW variability are approximately equal to each other at $\Delta t < 1 \text{ yr}$ but appears to be increasingly different at $\Delta t > 1 \text{ yr}$ (see Figures 8 and 9). In this picture, the detected BAL weakening rate in an individual object is higher than the BAL strengthening rate, leading to an overall decrease in EW as the sampling timescale increases.

This model also explains BAL variability results reported from HiBAL QSO samples (e.g., Filiz et al. 2013; Wang et al. 2015), provided the majority of HiBAL absorbers in HiBAL QSOs have relatively low optical depths at the first epoch of observations. In that case, we will detect similar weakening/strengthening rates in EW variability in an ionization-change, transverse-motion, or mixed scenario. Furthermore, if the majority of HiBAL QSOs have $\Delta t_2 > \Delta t_1$, ionization change would become the main driver of observed BAL variability, as reported by Wang et al. (2015).

7. Summary and Future Work

We have studied BAL variability based on multi-epoch spectra in a sample of 134 Mg II-BAL quasars. Our major findings from the sample-based study are as follows:

1. We identify variable Mg II-BAL troughs using three metrics and find that the fraction ($\sim 37\%$; see Section 5.4) of variable Mg II-BAL QSOs is significantly lower than that from previous HiBAL variability studies ($\sim 50\%–60\%$). The result can be explained by the fact that Mg II-BAL absorbers tend to have relatively high optical depths under partial covering (see Section 6).

2. We found that larger fractional EW variations tend to occur in weak troughs with smaller EWs, particularly in shallower and higher velocity troughs. We do not find any significant correlations of ΔEW or $\Delta EW/\langle EW \rangle$ with the QSO luminosity, redshift, radio-loudness, and Eddington ratio (see Sections 5.3 and 5.5).
3. We found that Mg II-BAL variations usually occur in relatively narrow portions of BAL troughs, consistent with HiBAL variability studies (e.g., Filiz et al. 2013). The majority of VRs have a width of 5 pixels ($\sim 275 \text{ km s}^{-1}$), close to the lower limit set for searching VRs (see Section 5.4).
4. The absolute EW variation shows an increasing trend from short to intermediate timescales ($\Delta t < 5 \text{ yr}$), but appears to level off with longer timescales ($\Delta t > 5 \text{ yr}$); however, the fractional EW variation shows an overall increasing trend at $\Delta t > 0.01 \text{ yr}$ (see Section 5.2).
5. We investigate the behavior of Mg II BALs at different velocities in a small subsample of BALs that host multiple Mg II BALs. There is a significant correlation in the distribution of $\Delta EW/\langle EW \rangle$ with coordinated variability among Mg II-BAL troughs at different velocities. However, we find no correlation in ΔEW , which is notably different from previous BAL variability studies based on HiBAL QSO samples (see Section 5.6).
6. By analyzing simultaneous BAL variability among quasars with Mg II (with an ionization potential of 15.0 eV), Al III (28.5 eV), and C IV (64.5 eV) BALs, we find that two species with a smaller difference in their ionization potentials show significantly stronger correlations in both ΔEW and $\Delta EW/\langle EW \rangle$. One possible cause of the correlations is the difference in ionization potentials (see Section 5.7).
7. The absolute/fractional EW variations for Mg II-BAL troughs show remarkable asymmetric distributions, in that we see more troughs weakening ($\Delta EW < 0$) than strengthening ($\Delta EW > 0$), and the asymmetry increases on longer timescales. We attribute these results to the possibility that transverse motions likely dominate the strengthening BAL troughs while ionization changes and/or other mechanisms dominate the weakening BAL troughs (see Section 6.3).

The systematic comparisons and analyses in this work reveal some significant differences between HiBAL and LoBAL variability. Long-term sampling timescales from a large LoBAL sample act as powerful tools that allow us, for the first time, to pin down the role of main drivers of BAL variability (transverse-motion and ionization-change mechanisms dominate the strengthening and weakening BAL troughs, respectively). These findings highlight the importance of future investigations into BAL variability either from theoretical modeling or observational studies based on larger samples as well as investigations of individual objects, particularly BAL disappearance/emergence events. Compared with previous HiBAL variability studies, the significantly lower fraction of variable Mg II BALs in our sample provides insight into the intrinsic properties of LoBALs that are likely associated with relatively high optical depths under partial covering.

For individual objects, a few quasars exhibit both remarkably stable and significantly variable Mg II-BAL troughs in EW; several candidates show BAL disappearance; some quasars show an apparent monolithic shift in a single or

multiple BAL troughs, possibly indicative of accelerating outflows. These objects, in conjunction with the large blueshift of broad/narrow emission lines, are of great interest for follow-up observations aimed at probing QSO feedback via multi-phase outflows.

In the future, a large-scale investigation of BAL versus broad emission-line properties should give additional insights into the quasar-wind contribution to the formation of high-/low-ionization BALs. With the aid of multiwavelength data, more comprehensive and further understanding of BAL variability can be gained. Furthermore, additional spectroscopic epochs can improve constraints on the fraction of Mg II-BAL QSOs showing variability, BAL lifetime, BAL acceleration events, coordinated Mg II-BAL variability, and correlated BAL variability from low- to high-ionization species. Follow-up data covering longer timescales will allow further assessment of the evolution of diverse Mg II-BAL troughs, and of the properties of Fe II BALs, and perhaps establish the location of BAL outflows. As dedicated campaigns such as TDSS continue to accumulate data, a wide variety of studies will be enabled, which will allow more systematic investigations into the nature of ionized outflows in the circumnuclear region and their effects on QSO feedback.

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