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**Improved Uranium Isotopic Ratio Determinations for the Liquid Sampling-Atmospheric Pressure Glow Discharge Orbitrap Mass Spectrometer by use of Moving Average Processing**

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10 Improved Uranium Isotopic Ratio Determinations for the Liquid Sampling-  
11 Atmospheric Pressure Glow Discharge Orbitrap Mass Spectrometer by use  
12 of Moving Average Processing  
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## Abstract

The liquid sampling-atmospheric pressure glow discharge (LS-APGD) is a versatile combined atomic and molecular (CAM) ionization source capable of ionizing elemental species, small polar compounds, low-polarity polycyclic aromatic hydrocarbons, and proteins. While the LS-APGD has been proven capable of determining the  $^{235}\text{U}/^{238}\text{U}$  isotope ratio in enriched and natural uranium, recent efforts have strived to reduce the analysis time of individual measurements by employing higher-order data processing techniques, specifically, moving average methods. The use of a moving average (of data windows of various widths) improves the precision of the ratio measurements and reduces the number of scans needed to be collected to generate high-precision results. Additionally, use of the moving average minimizes the quantity of sample that needs to be analyzed while reducing the measurement time. These reductions have allowed isotope ratio (IR) determinations to be made using injections instead of direct infusion of the analyte. For example, employing a 40-point window width in the moving average to direct infusion data reduced the percent relative standard deviation (%RSD) of the  $^{235}\text{U}/^{238}\text{U}$  values from 3.4% to 0.5%. For the injection of a 100  $\mu\text{L}$  aliquot, the %RSD was reduced from 5.3% to 0.7%.

## Introduction

Isotope ratio (IR) determinations have implications for a multitude of diverse scientific disciplines. In geochemistry, isotope ratio determinations of radioactive constituents allow for determination of the dates of specific geological events.<sup>1</sup> In forensic sciences, isotope ratios have been used for source identification in numerous applications, including analyzing explosives, ignitable liquids, illicit drugs, paints, soils, fibers, tapes, plastics, safety matches, microbial studies, documents, and poisons.<sup>2, 3</sup> Nuclear forensics uses isotope ratio measurements to generate signatures of known materials, which can be compared to measurements collected from seized nuclear materials, providing information on the material's origin and history.<sup>4-6</sup> Isotope ratio measurements are one of the many tools used by the nuclear safeguards community to verify declarations made by states regarding the status and nature of their nuclear program; thus, the practical aspects of the determination of  $U^{235}/U^{238}$  isotope ratios are of continuing interest.<sup>7, 8</sup>

Traditionally, high precision isotope ratio measurements of uranium and other actinides are performed using thermal ionization mass spectrometry (TIMS) or multi-collector inductively coupled plasma mass spectrometry (MC-ICP-MS).<sup>9-13</sup> While the current benchmark methods, TIMS and MC-ICP-MS, are not without drawbacks. TIMS instruments are large, complex, expensive, and often require extensive and complicated sample preparation techniques prior to analysis.<sup>11</sup> MC-ICP-MS instruments are also costly with large footprints, but the methods do not require as extensive sample preparation as typically required for TIMS. However, chemical separations are often required to remove molecular and elemental isobaric interferences before analysis.<sup>14, 15</sup>

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3 In addition, MC-ICP-MS instruments require plasma gas flow rates of up to 16 L min<sup>-1</sup>,<sup>16</sup>  
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5 contributing to the operational overhead. While both platforms provide excellent  
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7 performance, it would be advantageous to have the capacity to deliver performance for  
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9 the intended purpose on less complex, lower cost, and higher throughput instruments.  
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11 Taken a step further, instruments that are operable in less sophisticated environments,  
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13 perhaps field deployable, would also be desirable.  
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17 In an effort to reduce the complexity, the footprint, and capital costs of isotope  
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19 ratio determinations, a microplasma ionization source, the liquid sampling-atmospheric  
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21 pressure glow discharge (LS-APGD), has been coupled to a benchtop Thermo Scientific  
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23 Q Exactive Focus Orbitrap FTMS.<sup>16-20</sup> The LS-APGD ionization source, developed by  
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25 Marcus and co-workers, operates at low power consumption (<50 W) and low solution  
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27 flow rate (<100 µL min<sup>-1</sup>), with total consumption of analyte solutions.<sup>21</sup> In addition to  
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29 elemental analysis, the LS-APGD functions as a combined atomic and molecular  
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31 source, capable of ionizing small polar molecules, low-polarity polycyclic aromatic  
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33 hydrocarbons, and proteins.<sup>22-28</sup> The LS-APGD's ability to successfully couple to  
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35 instrumentation typically reserved for molecular mass spectrometry while having  
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37 minimal gas, solution, and power requirements has allowed advances to be made  
38  
39 towards simplified instrumentation, lower cost, and higher mass resolution performance  
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41 in isotopic ratio analysis. Indeed, the ultra-high resolution afforded by the orbitrap  
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43 analyzer has the potential to greatly lower the need for complex sample clean-up, as  
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45 demonstrated in the ability to mass resolve <sup>87</sup>Sr and <sup>87</sup>Rb ( $m/\Delta m > 350$  k).<sup>26</sup> With  
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47 regards to uranium isotopic ratio measurements, a first-level comparison of the  
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49 measurement precision between the microplasma/Orbitrap combination, TIMS,  
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3 scanning sector-field, and quadrupole ICP-MS across a range of degrees of isotopic  
4 depletion/enrichment displayed comparable levels of performance between the  
5 microplasma approach and the more widely applied methods.<sup>20</sup> This was particularly  
6 true for the samples of <sup>235</sup>U enrichment, a reflection of the limited dynamic range of the  
7 standard Orbitrap data system. That study provided the impetus for the continued  
8 development of the present methodology with regards to yielding a practical approach  
9 to high precision uranium isotope ratio analysis. It is yet a further goal of subsequent  
10 efforts to address methods of performing higher accuracy measurements.  
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21 Previous efforts regarding uranium isotope ratio measurements with the LS-  
22 APGD/Orbitrap coupling looked at many different aspects of plasma operation, use of  
23 collisional dissociation, the roles of concomitant ions, and advanced data acquisition  
24 systems.<sup>16, 20, 24, 26, 29</sup> The measurement of the natural abundance <sup>235</sup>U/<sup>238</sup>U ratio of  
25 ~0.0072 represents a non-trivial challenge in terms of the dynamic range and stability of  
26 an analytical system. The present effort focuses on a means of reducing the analysis  
27 time required to reach targeted levels of isotope ratio precision. The typical spectral  
28 acquisition workflow has consisted of 100 scans, each consisting of 10 microscans.  
29 One microscan entails the injection of an ion packet from the C-trap (where ions are  
30 initially accumulated), with a subsequent 100 millisecond signal (transient) acquisition,  
31 with the individual time-domain transients averaged prior to processing.<sup>20</sup> Transients  
32 (signals vs. time) are Fourier transformed using an enhanced Fourier transformation  
33 technique (eFT) to yield frequency domain spectra which are directly correlated with ion  
34 m/z<sup>16, 30</sup> using the manufacturer's standard data acquisition hardware and computational  
35 methods. Additional details on the eFT technique used with orbitrap mass  
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3 spectrometers have been described.<sup>30</sup> A complete isotope ratio analysis to this point  
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5 has consisted of the average of 3, 100-scan acquisitions, with each sample analyzed in  
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7 triplicate.<sup>20</sup> The work presented in this manuscript investigates the potential to reduce  
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9 the 100-scan acquisition protocol by using an alternative data processing method,  
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11 specifically a moving average. While moving averaging has been used previously with  
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13 ion cyclotron resonance (ICR) FTMS instruments,<sup>31</sup> to the authors' knowledge, this is  
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15 the first instance reported of using a moving average approach to improve the precision  
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17 of isotope ratio determinations, regardless of the spectrometer platform. The approach  
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19 is suggested to be effective in reducing the number of scans (i.e., analysis time) to  
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21 achieve the precision for a specific application, both in the case of continuous sample  
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23 solution infusion as well as the analysis of volume-limited samples via discrete  
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25 injections. It is believed that the approach holds promise for other quantitative  
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27 measurements on FTMS (ICR and Orbitrap) instruments as well.  
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34 It should be noted that accuracy is not discussed in this manuscript as accuracy  
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36 cannot be effectively explored until the targeted analytical precision has been optimized.  
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38 Future studies will focus on accuracy with the application of mass bias corrections as is  
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40 common for many forms of isotope ratio determinations.<sup>32, 33</sup>  
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## 43 **Experimental**

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46 A dual-electrode LS-APGD ionization source, as previously described<sup>24</sup> and  
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48 depicted in Fig. 1, was operated at a solution flow rate of 30  $\mu\text{L min}^{-1}$ , with a discharge  
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50 current of 30 mA per electrode, an electrode gap distance of 1.5 mm, and a helium flow  
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52 rate of 0.5  $\text{L min}^{-1}$  for all analyses. The LS-APGD source consists of two stainless steel  
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54 anode electrodes (weldable feedthrough, MDC Vacuum Products, LLC, Hayward,  
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3 California.) The solution cathode consists of an outer stainless-steel capillary (0.04 in  
4 I.D., 1/16 in O.D.; McMaster Carr, Elmhurst, IL) that delivers the helium sheath gas with  
5 a fused silica inner capillary (250  $\mu\text{m}$  I.D., 360  $\mu\text{m}$  O.D.; Molex, Lisle, IL) that delivers  
6 the analyte solution to the plasma. The plasma is generated between the solution  
7 cathode and the anodes. Power, solution flow, and gas flow are controlled through a  
8 custom control box (GAA Custom Electronics LLS, Kennewick, WA). The 2% nitric acid  
9 carrier electrolyte solution was prepared by diluting 70% Nitric acid (BDH/VWR, Radnor,  
10 PA) with deionized water prepared from an Elga PURELAB flow water purification  
11 system (18.2  $\text{M}\Omega\text{ cm}^{-1}$ ) (Veolia Water Technologies, High Wycombe, England). A  
12 natural-abundance uranium standard (3 g  $\text{L}^{-1}$ ) (High Purity Standards, Charleston SC)  
13 was diluted to 100 ppb in 2% nitric acid. A  $^{235}\text{U}/^{238}\text{U}$  value of 0.007277 was determined  
14 by MC-ICP-MS by the ORNL collaborators.  
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31 A Thermo Scientific Q Exactive Focus Orbitrap mass spectrometer was used  
32 with no modifications other than removing the ESI source. A six-port two-position  
33 Rheodyne 7125 injection valve with a 100  $\mu\text{L}$  injection loop was used for discrete  
34 sample analysis. Akin to other plasma-based ionization sources, instrument 'warm-up'  
35 was accomplished by operation of the plasma solely on the electrolyte solution for  
36 typically 30-60 min. Direct infusion measurements were made after 5 min of initiation  
37 of the sample flow, with each acquisition consisting of 100 scans, with each scan made  
38 of 10 microscans. A complete sample analysis consists of 3 acquisitions. Using this  
39 protocol, each acquisition takes approximately 5 min, using 0.14 mL of test solution.  
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41 Data acquisition was begun approximately 60 min following the initiation of flow to allow  
42 for plasma stabilization. Discrete sample injections were made into the plasma  
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operating with electrolyte solution flow, including 154 scans, each scan made of 10 micro scans. The number of scans collected during injection analysis represents initiation at the moment of injection to account for the dead volume between the injector and LS-APGD. Typically, injection measurements are made using just the transient maximum for determinations; however, for the application of moving average analysis, points from the transients' front and trailing edges were included to use the full sample response. By utilizing the transient front/tails, the number of scans included was increased to approximately 100 in comparison to the approximately 50 scans covering just the transient plateau.

All measurements were made in the positive ion mode. The ion transfer capillary temperature was set to 250°C, the quadrupole bandpass range was set to  $268.5 \pm 25$  Da, and the signal digitization range was set to frequencies corresponding to  $268.5 \pm 5$  Da. The injection time of 100 ms with automatic gain control (AGC) target of 1 million charges was used. The resolution was set to  $m/\Delta m$  of 70,000 ( $m/z = 200$ ). A higher-energy collisional dissociation (HCD) energy of 120 eV and an in-source collision dissociation energy of 90 eV was used to remove clusters related to water and nitric acid.<sup>34</sup> Measurements were made using uranium dioxide cation ( $\text{UO}_2^+$ ) species, per previous efforts.<sup>20</sup>

*Moving Average Methodology* - Moving average, commonly referred to as a simple moving average, is a powerful time-domain filtering process that is frequently used to minimize the impact of random noise on the data collected.<sup>35, 36</sup> A moving average consists of selecting a window (sometimes referred to as a boxcar) size in terms of the number of data points and averaging all points within that boxcar. Other similar forms of

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3 data processing have been reported, with Savitzky-Golay smoothing being a prominent  
4 example. Savitzky-Golay smoothing uses a set of weighted coefficients and a  
5 normalization constant to replicate least-square fitting of a polynomial, typically a  
6 quadratic or quartic, through a set of data points.<sup>37-39</sup> Moving average analysis can be  
7 viewed in terms of Savitzky-Golay smoothing as fitting the data to a zero-degree  
8 polynomial (a non-zero constant flat line) where the coefficients are all one  
9 (unweighted), and the normalization factor is equal to the number of data points in the  
10 boxcar.<sup>39</sup>

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12 For this application, a data point is one scan (consisting of 10 micro scans)/mass  
13 spectrum and the individual isotopic signals therein. This process is graphically  
14 represented in Fig. 2 for a typical 100  $\mu$ L injection total ion current chromatogram. In  
15 this example, a 10-point window would contain points 35-44. The boxcar is then moved along  
16 the x-axis by one point (adding the new point to the end of the window while dropping a  
17 point at the origin), and the points within the window are averaged. In the example, the  
18 next boxcar in the example above would be from points 36-45). Moving averaging was  
19 applied after the fact to the computed isotope ratio results for the individual scan  
20 measurements acquired by the mass spectrometer.

## 21 22 **Results and Discussion**

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24 *Continuous infusion of "bulk" solutions* - Three consecutive acquisitions of 100 scans  
25 each were collected sequentially, as per the previous uranium isotope ratio  
26 measurements.<sup>20, 29</sup> Moving averaging of different scan window sizes (10 – 100 scans)  
27 was applied to the isotope ratios of individual scan measurements for all 300 scans  
28 collected. As with the previous work, the average across all 300 scans was also  
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3 computed. The total analysis time for 300 scans was 13.7 minutes. The isotope ratios  
4 for each individual scan, the different scan window sizes, and the 300-scan average are  
5 presented in Fig. 3. Results for moving average scan window sizes of 10-100 scans  
6 are shown in Fig. 3. As seen, there is a dramatic improvement in the precision of the  
7 measurements at even modest scan window sizes.  
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15 It must be noted that there is a negative determinate error in the determined  
16 values versus the MC-ICP-MS determined value of 0.007277 for this sample, presented  
17 as the solid red line in the figure. The tendency for lower  $^{235}\text{U}/^{238}\text{U}$  values on this  
18 platform has been addressed in prior publications, being a product of the instrument's  
19 data processing protocol as well as basic particle physics within the orbitrap cell.<sup>16, 20, 40</sup>  
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The accuracy of the determined values is a different topic and is outside the scope of this manuscript which is focused on improvements in precision. Of note, the values reported herein are reported without the use of any mass bias correction, which is a common practice in isotope ratio determinations that corrects for biases inherent in the measurement process.<sup>7, 13, 41</sup>

As a practical matter, it was hoped that the use of the moving average method would reduce the analysis time, and thus sample consumption, necessary to achieve consistent isotope ratio (IR) values. The reduction in analysis time afforded by the method is illustrated in Fig 4 for the case of the first 100 data points of the standard 300-scan data acquisition. Figure 4a shows the difference in %RSD values obtained between the continuous (no averaging) case and when averaging windows of 10 and 20 scans are employed. As shown, the %RSD is far better for the moving average case, with the larger scan window providing better precision, as anticipated. What is clear as

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3 well is that successive accumulation of the per scan data does not reduce the overall  
4 %RSD as might be initially thought. In fact, the more correct way to view improvements  
5 in measurement precision is in the context of the standard error of the mean as  
6 successive scans are processed. The standard error of the mean is a measure of how  
7 the sample mean varies around the population mean, the true value for sample  
8 measurements.<sup>42</sup> Figure 4b shows the corresponding standard error of the mean after  
9 at least 10 data points have been included in the standard deviation and illustrates how  
10 the quantities change with analysis time using the continuous and moving average data.  
11 In this light, the anticipated improvements as a function of the number of samplings  
12 (time) are clear. In this vein, the anticipated standard error in the mean decreases by  $\sim$   
13  $n^{1/2}$  as shown in the fit response curve and the regression equation. Seen as well is the  
14 clear benefit of the moving average data treatment, as the standard errors are far less  
15 than in the individual scan data. Most importantly, it is seen that the analysis time to  
16 provide high stable IR values is less than 90 seconds in the case of the 20-point boxcar  
17 width, whereas the continuous data has still not reached a stable situation after 275  
18 seconds. Thus the anticipated benefits are realized here.

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21 To illustrate and better understand the improvements in the precision of the  
22 isotope ratios with increasing scan window sizes, the %RSD of the isotope ratios are  
23 plotted vs. the size of the moving average window size and shown in Fig. 5. It should be  
24 pointed out that the first data point represents the precision across the 300 individual  
25 scans. Clearly seen, the precision improves as the number of points included in the  
26 data window is increased. In fact, as shown in the fit, the improvement is just as  
27 expected for Poisson statistics, with an  $n^{1/2}$  dependence. In many respects, this level of  
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3 agreement validates the efficacy of the moving average approach towards uranium  
4 isotope ratio precision. As final evidence of the utility of the moving average approach,  
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6 Fig. 6 presents the cumulative accuracy and precision as a function of the number of  
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8 scans included in the window. In this box and whisker plot, solid boxes represent the  
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10 range of points between the end of the 1<sup>st</sup> quartile and the end of the 3<sup>rd</sup> quartile (50%  
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12 of data points), while the whiskers represent the start of the 1<sup>st</sup> quartile and the end of  
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14 the 4<sup>th</sup> quartile. As can be seen, while the precision is certainly improved, the centroid  
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16 of the values remains consistent, though perhaps increasing some via better S/N  
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18 characteristics. The dotted line across the figure represents the average value of the  
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20 isotope ratios across all of the scan window sizes. In general, the average values tend  
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22 to increase (though not to a statistically significant extent) with the number of scans  
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24 included in the scan window, which is believed to be due to a reduction in the influences  
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26 of low points (the fourth quartile consistently has the largest spread) on the overall  
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28 average with increasing scan window size. Based on these significant improvements in  
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30 precision, it is rationalized that by applying the moving average method to isotope ratio  
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32 measurements, the number of total scans needed to produce target-level results could  
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34 be reduced, thus reducing analysis times and/or sample volumes as demonstrated in  
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36 Fig 4.  
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45 *Discrete injections of volume-limited solutions* - There is a consistent challenge in the  
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47 field of isotope ratio mass spectrometry in terms of how much sample must be analyzed  
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49 to achieve the target levels of precision and accuracy. This is particularly true for  
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51 samples of nuclear forensics interest, where raw volumes are either very small and/or  
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53 operator exposure must be minimized. Thus, there is a need to characterize the ability  
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3 to capture sufficient data and achieve sufficient statistical performance on signals which  
4 are likely transient (i.e., not constant in time) in nature. By extension, this situation is  
5 relevant for samples introduced in the course of chromatographic separations, as is  
6 common in many IR applications. Ideally, there is some amount of time in which the  
7 signals of the respective species reach a steady state for sufficiently long times to allow  
8 for adequate sampling. Almost by definition, the analysis of volume-limited samples  
9 occurs under non-steady-state signal conditions. Herein lies the benefit of detection  
10 schemes wherein all relevant signals are monitored simultaneously, as in the case of  
11 multi-collector, time-of-flight, and indeed Fourier transform mass spectrometers such as  
12 the Orbitrap. That said, such measurements are still challenging. As an example,  
13 Vanhaecke and co-workers have recently described very detailed studies of the roles of  
14 detection dwell times and mass window widths in the coupling of high-performance ion  
15 chromatography (HPIC) with MC-ICP-MS.<sup>43</sup>  
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33 Based on the performance presented above, it was believed that the use of the  
34 moving average might allow for better utilization of transient data. To this end,  
35 additional studies were conducted on 100  $\mu\text{L}$  injections of 100  $\text{ng mL}^{-1}$  natural uranium  
36 solutions as a means of reducing both the sample volume and extracting higher IR  
37 precision from signals which are transient in nature. Typically, injection measurements  
38 are made using just the transient maximum for determinations. As depicted in Fig. 7 for  
39 the total ion current chromatogram for a typical 100  $\mu\text{L}$  injection on the LS-  
40 APGD/Orbitrap system, the output of the ionization source does not reach a true  
41 steady-state (plateau) across the injection volume. According to the total ion response  
42 profile in the figure, a seven-minute acquisition (154 scans) was performed on the 100  
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3  $\mu\text{L}$  injection. For the moving average analysis, the isotope ratios found for the  
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5 transient's front and tail were processed, beginning with scan 34 and ending at scan  
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7 131, making better utilization of the sample's complete response.  
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10 The effects of applying different scan window sizes to the isotope ratios found  
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12 and the individual scan isotope ratio determinations are shown in Fig. 8. As in the case  
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14 of the direct infusion responses, the temporal variability is very much buffered with the  
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16 increasing size of the window; this is particularly true for the data obtained on the  
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18 ascending and descending portions of the transient. As the total number of scans was  
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20 only 98, this practically limited the size of the windows to no more than 50 scans. As  
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22 might be expected, the variation in the raw values is greatly lessened in the central  
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24 portion of the transient (identified as the plateau in Fig. 7), as would be expected. And  
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26 while the variability improves in this region, the absolute IR values are increased,  
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28 suggesting better recoveries of the minor  $^{235}\text{U}$  signals. This agrees with the data  
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30 presented in Fig. 6 for the continuous infusion case.  
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35 To highlight the specific level of improvement realized with the moving average  
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37 approach, Fig. 9 presents the total ion transient, along with the single scan  $^{235}\text{U}/^{238}\text{U}$   
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39 isotope ratio values and the moving average values for the case of the 25-scan window.  
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41 Again, far greater variability in the single-scan IR values is seen on the leading and  
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43 trailing edges of the transient, with the horizontal bars added to guide the eye  
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45 representing  $\pm 5\%$  deviations of the average found for the single-scan values. This  
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47 variability is improved overall using the moving average (green line), but in addition, the  
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49 moving average allows for the data in the leading and trailing edges to be used in the  
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51 data set. As a point of reference, using the central  $\sim 50\%$  centroid of the transient  
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3 (nominally scans 65-95), as suggested by Vanhaecke et al.,<sup>43</sup> yields a  $^{235}\text{U}/^{238}\text{U}$   
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5 precision of 3.3 %RSD for the single-point data, while the 25-point window applied  
6  
7 across those data points yields a value of 0.2 %RSD across that same window. As  
8  
9 such, the moving average adds great improvements in precision, even for the most-  
10  
11 consistent portions of the transient response.  
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14  
15 The respective improvements in the cross-transient isotope ratio precision as a  
16  
17 function of boxcar size are depicted in Fig. 10. The first point of comparison with the  
18  
19 direct infusion case (Fig. 6) is the fact that the single scan precision across the transient  
20  
21 (~5.2 %RSD) is degraded relative to the steady operation (~3.4 %RSD), as expected.  
22  
23 As in the case of the continuous infusion analysis, increasing the number of scans  
24  
25 encompassing the window has a profound effect, again yielding the expected  $n^{1/2}$   
26  
27 proportionality. In fact, for the 50 scan window, the 0.54 %RSD precision derived for  
28  
29 the transient data is very similar to the 0.44 %RSD seen for the continuous infusion  
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31 case. The key here is that the data for the continuous infusion was acquired over a time  
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33 span of 13.7 min for 300 total scans, while that for the transient represents only 4.4 min  
34  
35 of analysis time and a total of 98 scans. Taken a step further, the 50-scan window in  
36  
37 the transient case only employs the central 49 scans, as the window rolls across the  
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39 total scan count, whereas in the continuous case, there are a total of 251, 50-scan data  
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41 points comprising the data set.  
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## 47 **Conclusions**

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49 The preliminary findings of the use of moving average analysis for isotopic ratio  
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51 determinations for the LS-APGD coupled with an Orbitrap mass spectrometer present  
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53 substantial improvements in precision over the cumulative averaging of scans across an  
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3 entire acquisition. The benefits of the moving average approach were very  
4 straightforward for the case of continuous infusion of test solutions, with the expected  
5  $n^{1/2}$  improvement in precision realized for the use of windows of increasing scan  
6 numbers. In fact, this relationship reveals that even at a challenging  $^{235}\text{U}/^{238}\text{U}$  of  
7  $\sim 0.0073$ , the system still follows Poisson statistics. It was clearly demonstrated that the  
8 relevant consideration of the standard error of the mean of the accumulated data  
9 reveals that dramatic reductions in analysis time and sample volumes can be achieved,  
10 while still providing more precise IR values. The ability to characterize and predict  
11 levels of measurement precision will allow for better logistical planning of  
12 measurements tailored to meet target levels of precision without wasting time and  
13 resources. In fact, the goal here was not to obtain ultimate levels of precision but to  
14 point to rational means of improving the overall process. In addition, this study is not  
15 focused on the accuracy of the isotope ratio found, only on the reduction of the temporal  
16 variation in the measurement. Future studies will focus on accuracy with mass bias  
17 corrections applied.

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38 These findings have led to the use of moving averaging as a means of achieving  
39 improved performance for discrete sample injections rather than direct infusion  
40 techniques for sample introduction to the LS-APGD ionization source. The use of the  
41 moving average method allows for more effective use of samples while analytical  
42 responses are temporally evolving, i.e., performing measurements outside of steady-  
43 state conditions. Here again, Poisson statistics are obeyed, even for temporally varying  
44 signals. This is a key attribute of the present studies as it points again to a means of  
45 tailoring experiments to yield the targeted levels of isotope ratio measurement precision  
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3 in those cases where sample volumes are limited or time is of the essence. Ultimately,  
4 these efforts contribute to the fundamental literature supporting the use of Orbitrap  
5 mass spectrometry, particularly in the case of sampling the LS-APGD, in the area of  
6 high-resolution isotope ratio mass spectrometry.  
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15  
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19 of Defense Nuclear Nonproliferation Research & Development  
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## 28 **Conflicts of interest**

29  
30 The authors declare no competing financial interests.  
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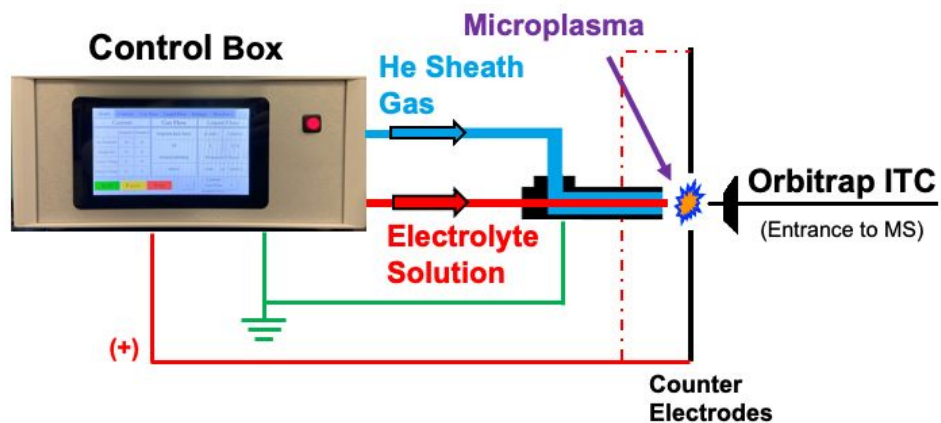


Fig. 1

Figure 1. Graphic depiction of the components of the dual electrode, liquid sampling-atmospheric pressure glow discharge (LS-APGD) ionization source, and controller unit.

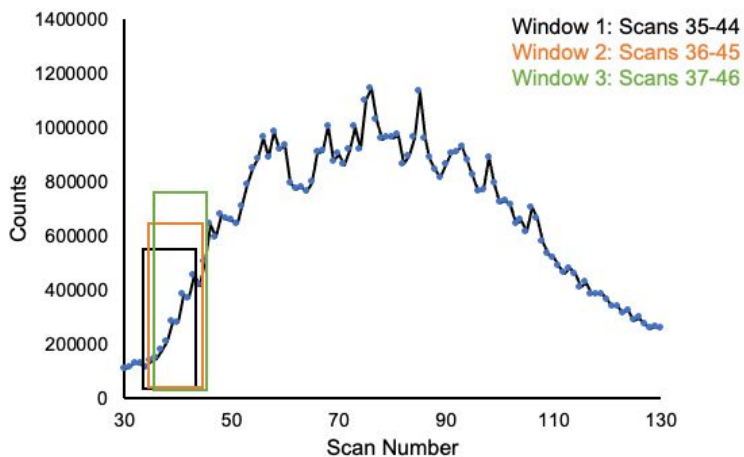


Fig. 2

Figure 2. Graphic illustration of the concept of the moving average methodology for a generic transient signal.

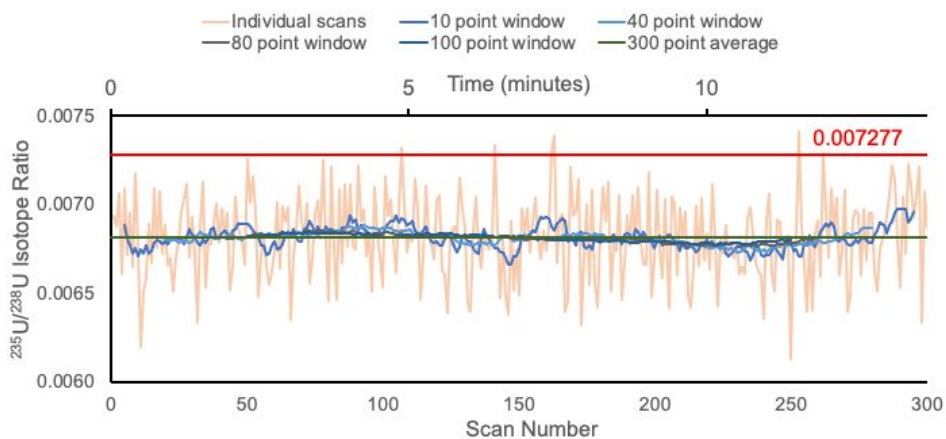


Fig. 3

Figure 3. Individual scan and moving average  $^{235}\text{U}/^{238}\text{U}$  values as a function of window width. The solid horizontal line represents MC-ICP-MS determined  $^{235}\text{U}/^{238}\text{U}$  value for the test solution.



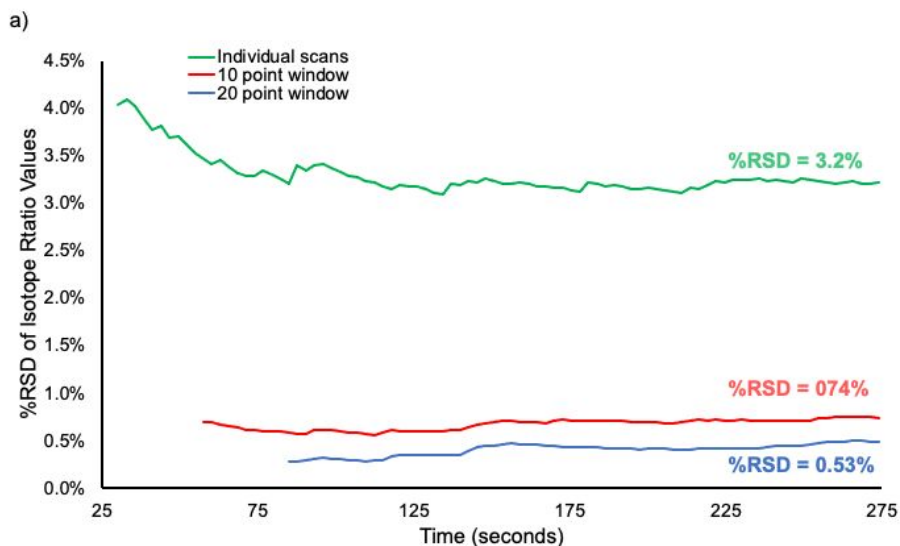


Fig. 4a

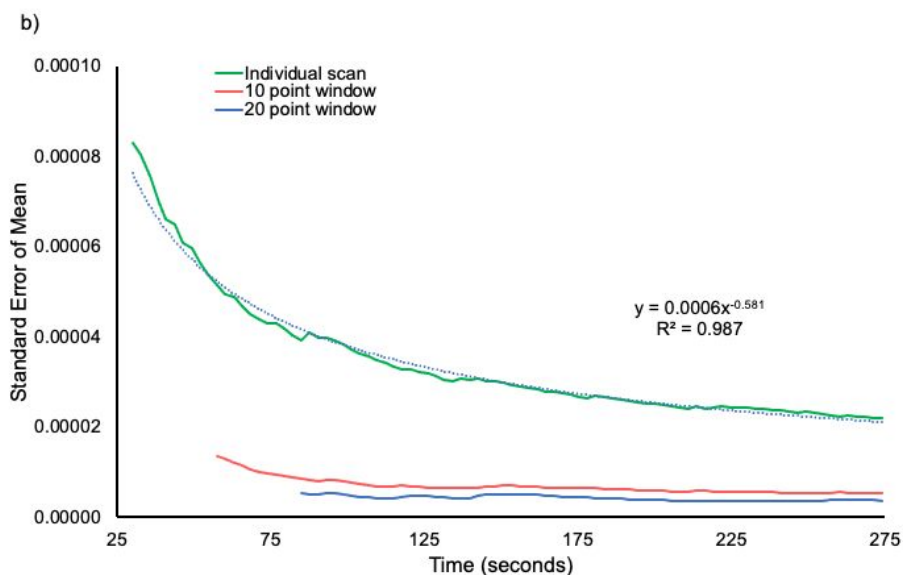


Fig. 4b

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Figure 4. Comparison of  $^{235}\text{U}/^{238}\text{U}$  precision as a function of scan number for continuous (no averaging) processing and the use of moving average with 10- and 20-point window widths. a) Data presented in regards to the cumulative %RSD as a function of the number of scans. b) Data presented in regards to the standard error of the mean as a function of the number of scans. The start of each line is at the point where at least 10 data points are included in the standard deviation calculation.

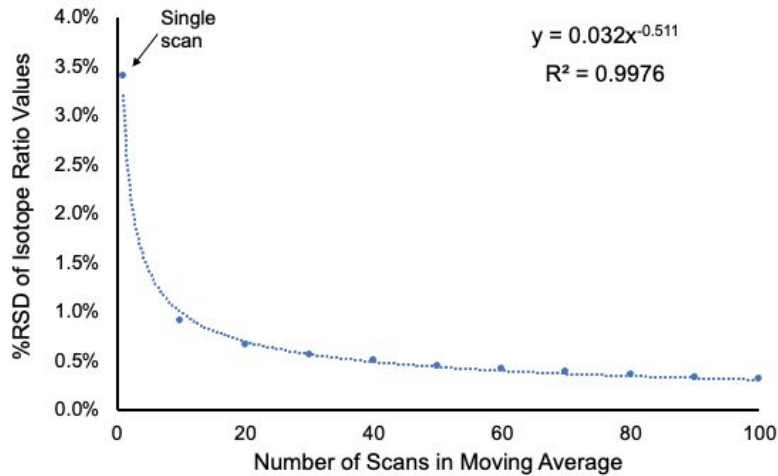


Fig. 5

Figure 5. Precision of determined  $^{235}\text{U}/^{238}\text{U}$  values as a function of averaging window width.

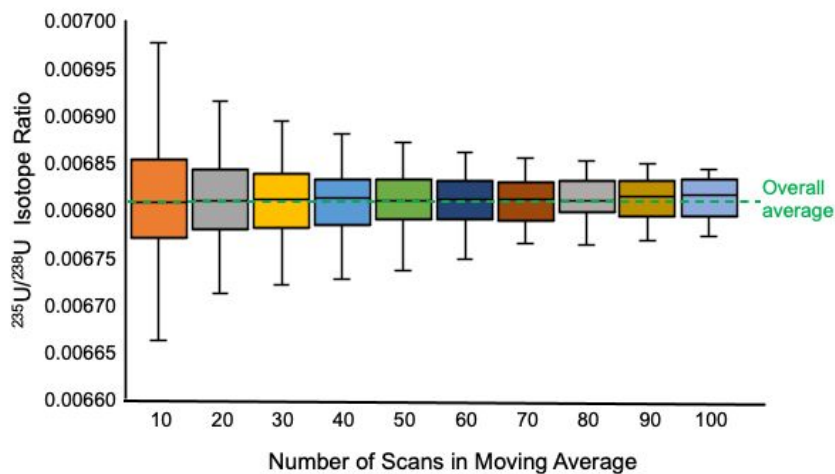


Fig. 6

Figure 6. Graphic depiction of the effects of averaging window width on isotope ratio precision and accuracy.

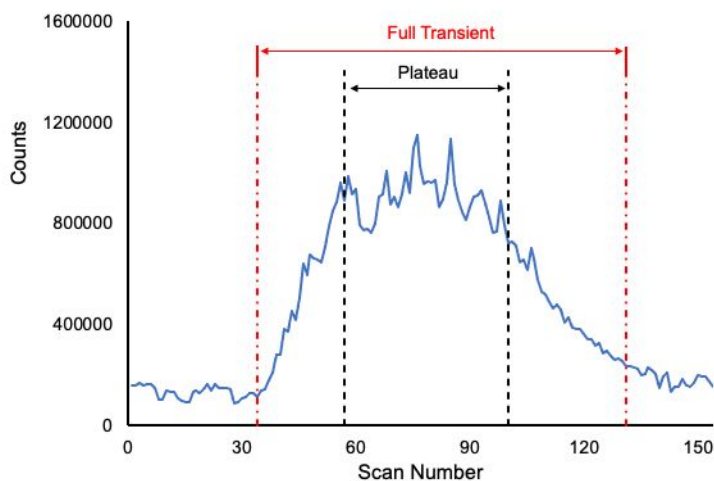


Fig. 7

Figure 7. Graphic depiction of the typical “plateau” data acquisition region along with a signal transient (such as a liquid injection) along with the complete transient coverage afforded by the use of the moving average data processing procedure. The graphic represents the total ion chromatogram from 263.5 - 273.5 Da (encompassing all U isotope responses) as a function of scan number.

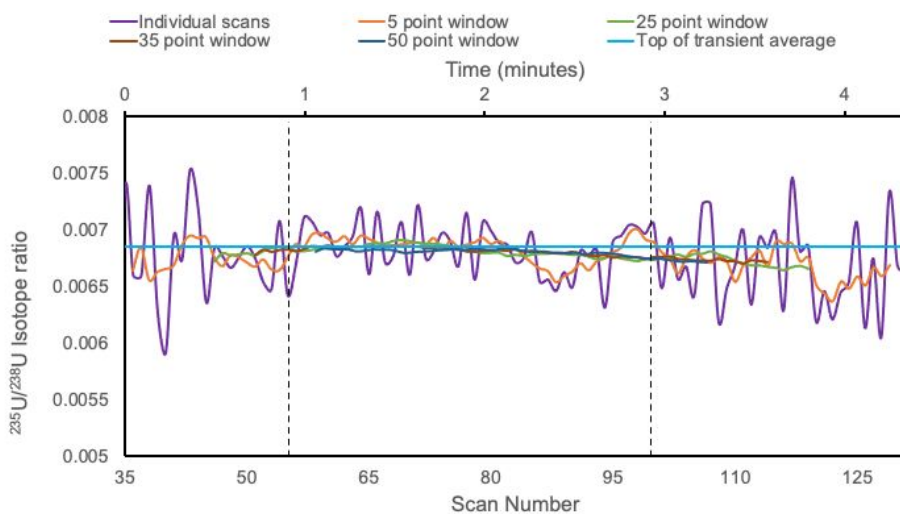


Fig. 8

Figure 8. Individual scan and moving average  $^{235}\text{U}/^{238}\text{U}$  values as a function of averaging window width across the 100  $\mu\text{L}$  injection transient.

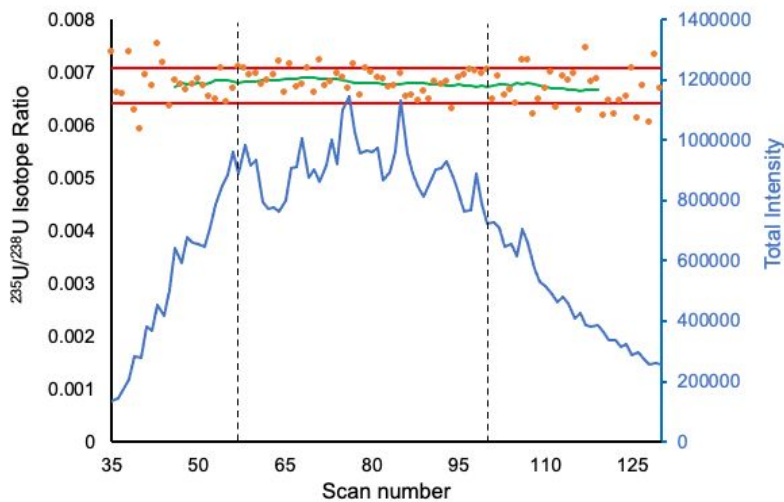


Fig. 9

Figure 9. Scatter plot of the individual scan  $^{235}\text{U}/^{238}\text{U}$  values as well as the trace realized in the use of the 25-scan moving average (red bars represent  $\pm 5\%$  of the average of all scans).

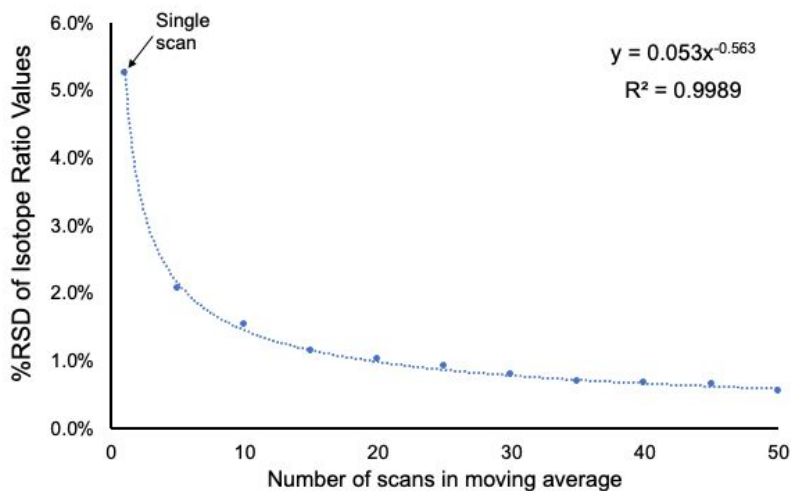


Fig. 10

Figure 10. Precision of determined  $^{235}\text{U}/^{238}\text{U}$  values as a function of window width for the  $100\ \mu\text{L}$  injection transient.