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Scalable conjugation and characterization of immunoglobulins with stable mass isotope reporters for single-cell mass cytometry analysis

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Abstract

The advent of mass cytometry (CyTOF®) has permitted simultaneous detection of more than 40 antibody parameters at the single-cell level, although a limited number of metal-labeled antibodies are commercially available. Here we present optimized and scalable protocols for conjugation of lanthanide as well as bismuth ions to immunoglobulin (Ig) using a maleimide-functionalized chelating polymer and for characterization of the conjugate. The maleimide functional group is reactive with cysteine sulfhydryl groups generated through partial reduction of the Ig Fc region. Incubation of Ig with polymer pre-loaded with lanthanide ions, produces metal-labeled IgG without disrupting antigen specificity. Antibody recovery rates can be determined by UV spectrophotometry and frequently exceeds 60%. Each custom-conjugated antibody is validated using positive and negative cellular control populations and is titrated for optimal staining at concentrations ranging from 0.1 to 10 µg/ml. The preparation of metal-labeled antibodies can be completed in 4.5 hrs., and titration requires an additional 3 to 5 hrs.

Keywords

CyTOF; mass cytometry; conjugation; antibody; immunoglobulin; IgG; lanthanide; bismuth; isotope; titration; phenotype; phosphorylation; MaxPAR; chelator; polymer

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1. Introduction

1.1. Background

Multicellular biological systems require the interplay of a diversity of cellular phenotypes. The advent of monoclonal antibody technology allowed the precise definition of many cellular phenotypes, first in the immune system, and more recently in solid tissues and tumors. Cellular phenotypes are most often defined by combinations of extracellular surface antigens. Many of these markers, such as those best understood in the immune system, are gained and lost during developmental maturation and in response to environmental stimuli. As the knowledge of cellular roles, particularly among immune cell subtypes, has become increasingly detailed, phenotypic definitions have begun to involve intracellular regulatory proteins or protein modifications that can act as proxies for cellular function: these include transcription factors, cytokines, and post-translational modifications of signaling proteins (e.g., phosphorylation, acetylation, cleavage).

Multiparametric single-cell fluorescence cytometry platforms are unique in their ability to measure multiple features per cell on thousands or millions of cells per experiment—allowing for quantitative capturing of subtle or wholesale shifts in cell subset frequencies and marker expression across diverse cellular phenotypes. The absolute number of cellular components that can be measured simultaneously on each cell is limited in fluorescence-based cytometry by constraints inherent in light-based measurements and emission spectral overlap of available fluorophores. This restriction in the number of simultaneous measurements has limited the scope of inquiry regarding the biological system under study such as human immune system states and cancers.

Recognizing the need for increased simultaneous measurement and quantification on a per cell basis, the Tanner group at the University of Toronto created a new detection modality, in which antibodies were tagged with stable heavy metal isotopes and quantified using a technology called inductively-coupled plasma mass spectrometry (ICP-MS) [1]. By combining sensitive and highly multiparametric ICP-MS immunoassay technology with a single-cell acquisition source, Tanner and colleagues produced the first mass cytometry platform, which was later released commercially as the CyTOF® [2].

To date, this technology has been employed to analyze multiple facets of biology, biochemistry and molecular regulation at the single cell level. Using the protocols described herein our groups have created numerous customized antibody panels, including those for studying: human hematopoiesis and regulatory cell signals [3]; cell and context specific kinase inhibitor activity in a high throughput assay [4]; broad facets of cell cycle across the human hematopoietic compartment [5]; cellular apoptosis and necrosis [6]; activation profiles of virus-specific cytotoxic T cells; and comparison of regulatory phosphorylation kinetics governing T cell receptor activation across different populations [7].

Using CyTOF®, more than 40 antibody-based parameters can be analyzed simultaneously at the single-cell level [3, 4, 8], though reagents for its implementation are not as currently widespread as fluorophore-conjugated materials. Additionally, the pursuit of new biology combined with the enormity of possible combinations of measurement reagents will likely

always necessitate the creation of novel, custom-conjugated antibodies. Designing an optimal panel to investigate relevant biological questions of interest requires custom conjugation of purified antibodies with heavy metal ions such that bound antibodies can be detected by inductively coupled plasma time-of-flight mass spectrometry (ICP-TOF-MS). To standardize and optimize this process we have developed a protocol for labeling of purified monoclonal and polyclonal antibodies designed to maximize conjugation efficiency while maintaining desired binding affinity.

This antibody labeling protocol utilizes MaxPar® chelating polymers commercially available from Fluidigm. These water-soluble polymers contain a sulfhydryl-reactive bismaleimide group and a trivalent metal cation-chelating 1,4,7,10-tetraazacyclododecane-1,4,7,10-tetraacetic acid (DOTA) or diethylene triamine pentaacetic acid (DTPA) group. The binding affinities of DOTA and DTPA for lanthanide metal reporters approach 10^{-16} M [9]. Importantly, an advantage of this platform is that there are 44 mass channels within the optimal mass cytometry measurement range that can be occupied by stable isotopes of transition metals, mainly the lanthanide series. These transition metals readily form stable trivalent salts in solution with an oxidation state of (III) (Table 1). Consequently, antibody reagents for all 44 mass channels can be created using the protocol described herein.

The process of antibody conjugation has three fundamental steps:

1. The MaxPar® polymer is incubated in a trivalent metal salt solution to facilitate chelation with high efficiency.
2. To generate sites for maleimide labeling, the purified, carrier-free immunoglobulin, type G (IgG) is incubated in a low concentration of tris-carboxyethyl phosphine (TCEP) to preferentially reduce disulfide bonds within the F_c region, ideally without compromising the antigen specificity of the F_{ab} region [10, 11].
3. Lastly, the chelated polymer and partially reduced antibody are mixed and incubated to achieve full conjugation.

Notably, antibodies, as well as many buffer components such as phosphates, have a propensity to precipitate out of solution containing even low concentrations of free lanthanide ion; therefore, it is critical to chelate metal ions and wash the polymer thoroughly prior to addition of the reduced antibody. Furthermore, the tertiary structure of Fab regions of antibodies incubated under harsh reducing conditions may become altered due to disruption of structural disulfide bonds. As such, the concentration of Tris-carboxyethyl phosphine (TCEP) in reducing buffer and the length of incubation are critical, and the protocol below should be followed precisely as described. To maximize conjugation efficiency, we utilize a series of buffers optimized for metal loading, antibody reduction, polymer coupling to the antibody, and subsequent washing. It is also essential to ensure that carrier protein (i.e., BSA) is removed from the antibody solution as the carrier may compete for free maleimide groups of the polymer. If the monoclonal or polyclonal antibody preparation to be used includes carrier protein, these proteins may be removed by Melon gel (Pierce) or Protein G column purification. Using purified antibodies, the coupling reaction of

polymer to partially reduced antibody approaches completion, resulting in covalent binding of around six polymers to each IgG.

1.2. Experimental Considerations

The overriding advantage of mass cytometry over other biological analysis platforms is its ability to acquire single-cell, 40–50 parameter data with negligible spectral overlap. Although this cytometric analysis is best known as a method for analyzing immunologic subpopulations [3, 8], the utility of high-parameter single-cell analysis goes well beyond blood and bone marrow—it is useful in virtually any biological system that can be prepared as a single-cell suspension. For example, the multiparametric and quantitative data afforded by mass cytometry is valuable in studies of solid-tissue stem cell differentiation, cellular heterogeneity in tumors [12, 13], coordinated anti-tumor immunity across an entire organism [14]; defining cellular phenotypes in autoimmunity [15]; tumor-stroma interactions, stochasticity and kinetics in cell-culture models of apoptosis and cell cycle [5, 6], network analysis of the interplay between phosphorylation events, and as a highly parallelized drug screening platform capable of monitoring many kinase targets simultaneously [4].

The common theme of most of these applications is the need for simultaneous detection of many cellular components at a single-cell level to enable the fine-grained discrimination of many heterogeneous cell types, to efficiently multiplex many functional assays in a single analysis, or to gain insights into correlated phenomena and emergent properties that can only be mined from quantitative, high-dimensional data [16, 17]. These high dimensional single-cell approaches create a challenge and an opportunity to leverage the mutual information encoded in these experiments to make new models of human systems and take unsupervised approaches to cellular identification and disease classification [12, 18–20].

One minor limitation is the nature of the immunoglobulins used with success in this protocol. IgGs from mouse, rat, rabbit, goat, and sheep have been tested extensively and are compatible with the protocol described here. Attempts to use type E and type M immunoglobulins (Igs) have been less successful presumably due to disulfide bonds in these antibody types which are required to maintain structure and binding activity. We have also occasionally observed that labeling Igs from an Armenian hamster background decreases binding activity.

1.3. Experimental design

When designing a mass cytometry experiment, the researcher must first take into consideration the technological limitations of the current generation of mass cytometry instruments: *i)* The expected data capture rate is only ~30% of the input number of cells for each sample depending on the staining protocol and cell introduction system. *ii)* The cell acquisition rate should be limited to 500–1000 cells/second to maximize data quality and avoid double cell events. *iii)* This is a destructive method. Cells are vaporized as they enter the plasma ionization source, thus no cell recovery is possible. *iv)* Lastly, investigator-specific reagents must be labeled and tested as detailed in the protocol herein. Although many experiments have been designed to circumvent these limitations, there are some experiments that are simply not well suited for mass cytometry analysis. Mainly,

experiments that involve an extremely rare cell population such as hematopoietic progenitors [3] or antigen specific T cells [8] require either very large numbers of cells, some sort of pre-enrichment with the use of carrier cells to be discriminated *in silico*, or both.

Mass cytometry and the use of elemental isotopic reporters overcome many of the limitations inherent with fluorescent or colorimetric reporter technologies, namely spectral overlap and background signal inherent in biological samples. Still, there are sources of interference that can confound analysis, namely: oxide formation, isotopic contamination, and, to a lesser extent, spectral overlap ('signal bleed') when strong signals are adjacent to weaker ones on the mass scale (Figure 1). Isotopic reporter signals that differ by $>10^2$ may cause visible spectral bleed from the higher-abundance ion into the lower-abundant mass channel next to it on the mass scale. For example, a small percentage of a strong ^{169}Tm signal may be present in the ^{170}Er measurement window (Figure 1A) despite no expected signal. Because the magnitude of this 'signal bleed' is only a very small proportion of the overall interfering signal (^{169}Tm), if the expected signal in the channel targeted by the interference (^{170}Er) is not 100 times (two orders of magnitude) lower than the interfering signal, it is not expected to confound the analysis. Additionally, most of this spectral overlap in time-of-flight mass spectrometry, as in the CyTOF mass cytometer, tails in the M+1 direction (i.e., the ^{169}Tm has a higher propensity to be measured as ^{170}Er rather than the other way around).

The two primary sources of convoluting reporter signal interference are isotopic impurities (Figure 1B) and oxide formation during ionization (Figure 1C). Isotopic impurities are a result of incomplete purification from the naturally occurring element, which can be a mixture of stable isotopes. As a general rule, the most common isotopic contaminants are in those elements that have +1 or -1 mass adjacent isotopes. For example, the contaminants in 97% pure ^{145}Nd are likely ^{144}Nd and ^{146}Nd . In contrast, ^{151}Eu can be obtained in 99% purity with little or no contaminating ^{153}Eu (the only other stable Eu isotope) because the additional mass resolution allows for more efficient purification. A profile of the contaminating isotopes is generally available from the supplier of the isotopically enriched material. Other heavy elements (La, Pr, Tb, Ho, and Tm) are natural or near natural (>99.9% pure) mono-isotopes, therefore isotopic contamination is also not a concern in these cases. These natural mono-isotopes and series of mass adjacent isotopic reporters are also noted in Table 1 and were reviewed in Ornatsky [21].

Oxide, and to a much lesser extent hydroxide, formation occurs during analysis when incomplete vaporization/ionization results in the formation of adducts between the elemental isotopic reporter with oxygen or a hydroxide, thus adding 16 or 17 amu to the reporter mass, respectively [22]. For example, ^{139}La , one of the most likely elements to oxidize, will also have a small signal in the ^{155}Gd channel resulting from the oxidation product ($^{139}\text{La}+^{16}\text{O}$) (Figure 1C). While oxidation creates this M+16 artifact for certain metal isotope reporters the mass cytometer is tuned such that this occurrence is typically 3% or less of the total signal. The level of oxidation is dependent on the oxide bond strength of the atomic ion of the reporter element and the local temperature of the plasma. The relative likelihoods of oxide or hydroxide formation for common mass cytometry elements are summarized in Table 2. The most significant sources of interference due to oxide formation combined with

common isotopic interferences are summarized in Table 1 and should be considered in the context of expected signal levels when selecting panels of elemental isotopic reporters for mass cytometry analyses. For example, antibodies against low-abundance antigens should not be conjugated to an isotope that will receive considerable oxidation from a reporter metal used to label an antibody targeting a high-abundance, or “bright”, marker.

Finally, the CyTOF utilizes TOF mass measurement in conjunction with a series of mass filters in order to remove overly abundant ions inherent in biological samples as well as the ions from argon plasma that can be detrimental to the detector. Current mass cytometry instrumentation can be tuned with a mass window of approximately 130 atomic mass units (amu). While this allows the detection of stable isotopic reporters with masses between ~80 and 238 the peak sensitivity typically lies between 160–170 amu and drops off sharply towards the low mass end and more gradually towards the higher end. The relative sensitivity of various isotopic mass reporters is summarized in Table 1 and should be considered in the context of the expected antigen expression level on a cell when assigning a mass reporter to an antibody. Specifically, low-abundance or “weak” antigens are often best measured using reporter isotopes in the peak sensitivity range. However, because these channels can receive bleed from the oxidation of lighter isotopes, effective panel design aims to optimize these factors to minimize confounding signal as is routinely performed for fluorescence-based methods.

2. Materials

2.1. General considerations

1. Barium is a commonly occurring element in many detergent products and is frequently found at high concentrations in bottles cleaned in laboratory dishwashers. For optimum sensitivity and lifetime of the CyTOF® instrument, wash solutions used in the immunostaining protocol must be nearly free of barium (< 1 ppb). Many commercially available biological reagents (e.g., 500 mL liquid bottles of liquid GIBCO DPBS) contain high amounts of barium and should be avoided in later steps of the staining protocol. The recipes below are specifically designed to avoid barium contamination, but it is recommended that each laboratory test every wash solution in the workflow for barium contamination before running the first set of samples on the CyTOF.

2.2. Reagents

1. 100–500 µg immunoglobulin
2. Tris-carboxyethyl phosphine (TCEP), neutral pH (0.5 M in 10 µl aliquots) (Thermo Scientific)
3. MaxPar X8 or DN3 Antibody Labeling Kit (Fluidigm):
 - a. MaxPar X8 or DN3 Antibody Labeling Reagent (one test per 0.1 mg of Ig)
 - b. L-Buffer (suitable substitution: 20 mM ammonium acetate, pH 6)

- c. R-Buffer (suitable substitution: 0.1 M phosphate buffer with 2.5mM EDTA, pH 7.2)
 - d. C-Buffer (suitable substitution: tris-buffered salt with 1 mM EDTA, pH 7.5)
 - e. W-Buffer (suitable substitution: tris-buffered salt, pH 7.5)
 - f. Trivalent metal lanthanide solution (0.05 M stocks of XCl_3 or $X(NO_3)_3$ in L-buffer, where X is the elemental metal isotope)
4. Modified C-Buffer, 150 mM tris, 150 mM NaCl, 1 mM EDTA, pH 7.5
 5. 10x PBS, 320 g of NaCl, 8 g of KCl, 46 g of $Na_2HPO_4 \cdot 7H_2O$, and 8 g of KH_2PO_4 in 3 L of ddH₂O. Bring solution to pH 7.4 using concentrated aqueous NaOH. Bring volume to 4 L with ddH₂O. To create a 1X stock mix 1 part of 10X stock with 9 parts ddH₂O.
 6. FACS buffer, 500 ml PBS, 2.5 g BSA (final concentration: 0.5% wt/vol), and 100 mg sodium azide NaN_3 (final concentration: 0.02% wt/vol). Store at 4 °C for up to 4 months.
 7. Antibody stabilization buffer, 0.1% (wt/vol) (NaN_3) in Antibody Stabilizer solution. Store at 4 °C for up to several years.
 8. 16% Paraformaldehyde (PFA) ampules (wt/vol in water).
 9. DNA intercalator: 1 ml PBS, 100 μ l of 16% PFA, and 0.25 μ l of Ir-Intercalator (500 μ M stock concentration, Fluidigm).
 10. Methanol, store at 4 °C.
 11. Positive and negative control cells (or cell populations) of interest.
 12. Monensin Solution (1000X, Biolegend).
 13. Brefeldin A Solution (1000X, Biolegend).

2.3. Equipment

1. Amicon Ultra-0.5 mL Centrifugal Filter Unit with Ultracel-3 membrane (Millipore)
2. Amicon Ultra-0.5 mL Centrifugal Filter Unit with Ultracel-50 membrane (Millipore)
3. Amicon Ultrafree Durapore 0.1 μ m PVDF 0.5-mL centrifugal filters (Millipore)
4. Screw-top Eppendorf tubes
5. Pipettes
6. Filter pipette tips
7. Polystyrene round bottom test tubes (FACS tubes)
8. Pasteur pipettes

9. Vacuum flask connected to vacuum line
10. Water bath heated to 37 °C
11. Room temperature centrifuge with rotor for microtubes
12. Refrigerated centrifuge with rotor for FACS tubes
13. A low volume (µl) UV/Vis spectrophotometer
14. CyTOF mass cytometer
15. Flow cytometry analysis software (we use Cytobank [23], www.Cytobank.org)

3. Methods

3.1. Antibody conjugation

1. The following conjugation procedure has some critical timing steps that are important to the success of the protocol. These steps are noted in text and summarized in a workflow diagram in Figure 2.
2. In the main text, we describe the conjugation of 100 µg of immunoglobulin. Due to the inevitable loss of a certain amount of protein during the conjugation procedure, conjugation of <100 µg in one reaction is not recommended. However, conjugation of multiples of 100 µg is possible and might be desirable in cases in which frequent usage is anticipated and where potential batch-effects between different conjugations are to be avoided. In order to conjugate >100 µg (we have tested conjugation of up to 500 µg), the presented protocol has to be slightly modified which will be pointed out and referred to in the Notes section.
3. Conjugation of antibodies to Bismuth (²⁰⁹Bi) requires slightly adjusted reagents and again, this will be referred to in the Notes section.

3.1.1. Preloading the chelating polymer (40 min)

1. Per 100 µg of immunoglobulin (see Note 1) to be conjugated, spin one tube containing the MaxPar chelating polymer for 10 s in a microcentrifuge. Polymer is difficult to see by eye and can escape from the tube easily upon opening. Spinning beforehand ensures that the reagent is at the bottom of the tube.
2. Reconstitute the MaxPar reagent in 95 µl of L-Buffer per labeling reaction using a filter pipette tip (for conjugation of >100 µg of antibody see Note 2 and for conjugation of antibodies to ²⁰⁹Bi see Note 3).
3. Add 5 µl of 0.05 M stock of metal solution to the polymer solution (final concentration: 2.5 mM). Vortex briefly to mix (for conjugation of >100 µg of antibody see Note 4).
4. Incubate at room temperature (RT) for 40 min, vortexing every 10 min. In order to ensure that the polymer and antibody are ready for conjugation simultaneously, proceed to section 3.1.2 after approximately 30 min of the incubation has elapsed (see Figure 2).

3.1.2. Buffer exchanging and reducing the antibody (40 min)

1. Add 300 μ l of R-buffer to a 50-kDa MWCO micro-filter device (see Note 5).
2. Add 100 μ g of antibody (see Note 6) to the R-buffer in the 50-kDa MWCO micro-filter device (see Note 7).
3. Reduce volume by spinning at 12,000 *g* for 10 min at RT. Discard the flow-through. Final volume should be 20 μ l or less before proceeding.
4. Mix 8 μ l of TCEP stock with 992 μ l of R-buffer (final concentration: 4 mM TCEP).
5. Add 100 μ l of the diluted TCEP solution to the concentrated antibody in the 50-kDa MWCO micro-filter device. Tap the tube by hand to mix. Mixing too vigorously by vortexing at high speeds can compromise the structural integrity of the antibody when mixed with the mild reducing agent TCEP.
6. Incubate covered for 30 min at 37 °C. The antibody should not be left in TCEP for more than 30 min; longer incubation may result in full reduction of disulfide bonds necessary for the structural integrity of the protein.

3.1.3. Washing pre-loaded MaxPar labeling reagent (60 min)

1. Following the 40 min incubation, add 200 μ l of C-buffer to the metal-loaded polymer. Pipette the mixture or briefly vortex the column to mix (for conjugation to ²⁰⁹Bi see Note 8).
2. Transfer the mixture to the 3-kDa MWCO micro-filter device.
3. Reduce the volume by centrifugation at 12,000 *g* for 25 min at RT. Discard the flow-through.
4. Add 300 μ l of C-buffer to the 3-kDa MWCO micro-filter. Pipette the mixture or briefly vortex the column to mix.
5. Reduce the volume by centrifugation at 12,000 *g* for 30 min at RT. Discard the flow-through. Final volume should not exceed 20 μ l. A higher volume could result in excess free metal concentration and induce antibody precipitation.

3.1.4. Washing the partially reduced antibody (30 min)

1. Following the 30 min incubation (section 3.1.2), collect the partially reduced antibody from the 37 °C incubator. Add 300 μ l of C-buffer to the partially reduced antibody in the 50-kDa MWCO micro-filter device. Pipette the mixture or briefly vortex the column to mix.
2. Reduce the volume by centrifugation at 12,000 *g* for 10 min at RT. Discard the flow-through.
3. Add an additional 400 μ l of C-buffer to the 3-kDa MWCO micro-filter device. Pipette the mixture or briefly vortex the column to mix.

4. Reduce the volume by centrifugation at 12,000 *g* for 10 min at RT. Discard the flow-through.

3.1.5. Coupling metal-loaded polymer to partially reduced antibody (1 h)

1. Remove all micro-filter devices from the centrifuge. Resuspend the metal-loaded polymer in 60 μ l of C-buffer in the 3-kDa MWCO micro-filter device using a pipette equipped with a filter tip.
2. Transfer the contents of the 3-kDa MWCO micro-filter device into the corresponding 50-kDa MWCO micro-filter device containing the partially reduced antibody of choice. Pipette the mixture or briefly vortex the column to mix.
3. Incubate at 37 °C for at least 60 min. Incubation time can be extended up to 2 h, though the reaction should approach completion after 60 min.

3.1.6. Washing and recovering the conjugated antibody (1 h)

1. Add 250 μ l of W-buffer to the antibody conjugation mixture in the 50-kDa MWCO micro-filter device. Pipette the mixture or briefly vortex the column to mix.
2. Centrifuge at 12,000 *g* for 10 min at RT. Discard the flow-through. Volume should not exceed 20 μ l after spin.
3. Add 400 μ l of W-buffer to the antibody conjugation mixture in the 50-kDa MWCO micro-filter device. Pipette or briefly vortex to mix.
4. Centrifuge at 12,000 *g* for 10 min at RT. Discard flow-through. Volume should not exceed 20 μ l after spin.
5. Repeat steps 3–4 twice.
6. Add 50 μ l of W-buffer to the 50-kDa MWCO micro-filter device. Pipette to mix and rinse the walls of the column.
7. Invert the micro-filter device into a new collection tube (supplied with the AMICON filters).
8. Centrifuge at 1,000 *g* for 2 min at RT.
9. Gently remove micro-filter device from collection tube. Add an additional 50 μ l of W-buffer to the 50-kDa MWCO micro-filter device. Pipette to mix and rinse the walls of the column.
10. Invert the micro-filter device into the same collection tube.
11. Centrifuge at 1,000 *g* for 2 min at RT.
12. Using a pipette equipped with a filter tip, transfer the conjugated antibody to a screw-top polypropylene tube (to prevent evaporation) for long-term storage. The antibody can be stored in W-buffer at 4 °C for at least a week. For long-term storage, the antibody should be diluted to the appropriate concentration as

determined by titration in antibody stabilization buffer supplemented with NaN_3 . Ideally, the antibody should be diluted such that 1 to 2 μl is sufficient for a 100 μl cell staining reaction. This facilitates the creation of low volume staining cocktails containing more than 20 antibodies.

3.2. Quantification of conjugated antibody (15 min)

1. Set up a low volume spectrophotometer according to the manufacturer's instructions. Measure the absorbance of W-buffer at 280 nm and use as a 'blank' for subsequent measurements.
2. Against the blank, measure the absorbance of the conjugated antibody at 280 nm. Calculate the concentration of antibody present in solution. For mammalian IgG, an A_{280} of 1.38 absorbance units corresponds to a concentration of 1 mg/ml. The expected recovery is > 60% of conjugated antibody. For quantification of Bismuth-conjugated antibodies see Note 9.
3. Within a week of labeling proceed to antibody validation and titration in order to select the appropriate storage concentration. If in doubt, dilute the conjugated antibody to a concentration of 0.2 mg/ml in antibody stabilization buffer supplemented with NaN_3 for long-term storage. The antibody can be stored in antibody stabilization solution at 4 °C for 6 months or more. However, before using the conjugated antibody for an experiment on the mass cytometer, the antibody must be validated and titrated as follows.

3.3. Staining samples for validation and titration of metal conjugated antibody (3–5 h)

1. We here focus on the validation and titration of antibodies against stable cell-surface molecules. Cases in which conjugated antibodies recognize inducible intracellular modifications or secreted molecules (i.e., cytokines) will be referred to in Note 10.
2. Obtain a suspension of single cells that are expected to contain the marker of choice (positive control) as well as cells that are not (negative control). Choosing appropriate cell populations is critical to validate that the antigen specificity of the newly conjugation antibody has not been altered. For example, when validating an antibody against anti-human CD3, Jurkat T cells could serve as an appropriate positive control, and Nalm-6 pre-B cells could serve as an appropriate negative control. In this same example, human peripheral blood mononuclear cells (PBMCs) could be used and CD3-positive T cells could be identified with a CD2 or CD5 stain and CD3 negative B cells with a CD19 or CD20 stain. For more examples, see the expected results in Figure 3.
3. Add 1 ml of cell culture media (user's choice based on cell line or cell type) or FACS buffer at 37 °C to two FACS tubes labeled positive and negative. Add 10×10^6 positive control cells or 10×10^6 negative control cells to the FACS tubes, respectively. If using a single control (i.e., when using cells containing known positive and negative cell types; e.g., PBMCs) use a single tube. If the recognized epitope is stimulation dependent, see Note 10.

4. Add 111 μl of 16% paraformaldehyde (1.6% final concentration), and pipette thoroughly to mix.
5. Incubate for 10 min at RT.
6. Centrifuge at 500 g for 5 min at 4 $^{\circ}\text{C}$. Aspirate supernatant using a vacuum equipped Pasteur pipette. Vortex to resuspend cells. Leaving the cells in minimal residual volume greatly enhances the efficiency of these wash steps. We prefer to aspirate the supernatant rather than decanting FACS tubes. This also maximizes cell recovery. Immediately continue to the following washing steps to prevent over-fixation of cells.
7. Add 3.3 mL of FACS buffer to each tube.
8. Add 500 μl of the above FACS buffer cell mixture into each of six labeled FACS tubes.
9. Centrifuge at 500 g for 5 min at 4 $^{\circ}\text{C}$. Aspirate supernatant using a Pasteur pipette equipped with a fresh pipette tip, leaving cells in 60 μl residual volume.
10. If surface antibody staining is not being titrated, dilute the appropriate amount of antibody or antibodies for each staining reaction in FACS buffer to a final volume of 40 μl per sample. Transfer the 40 μl to each cell sample and vortex to mix. Then proceed to the incubation (step 18). If titrating the surface antibody staining cocktail proceed as follows: create an antibody staining cocktail by diluting 4 μg of each antibody for titration to a total volume of 200 μl in FACS buffer (final concentration: 20 $\mu\text{g}/\text{ml}$ per antibody). If the antibody stock solution was initially diluted to 0.2 mg/ml , then 20 μl of the antibody stock will contain 4 μg .
11. This dilution is designed to produce a final concentration of 8 $\mu\text{g}/\text{ml}$ for each antibody in a total staining volume of 100 μl for the first titration step. Therefore, if staining will be performed in a larger volume or the antibody was diluted to a different initial concentration, adjust these guidelines accordingly. Also, this titration is designed for two series (i.e., positive and negative controls) of six concentrations. If only using one series or more than two series of control cell lines amount of antibody can be scaled and subsequently diluted accordingly.
12. If titrating some antibodies while holding the concentration of others 'constant' in order to identify control cell populations, prepare a separate, low volume (ideally < 10 μl per sample) mixture of the 'constant' antibodies that will be added separately to each sample following the addition of the titrated antibodies.
13. Perform a six-step, two-fold serial dilution.
14. Add 40 μl of the first diluted antibody solution to the 60 μl in FACS 'tube 1' for each of the cellular controls (final concentration: 8 $\mu\text{g}/\text{ml}$ antibody).
15. Add 100 μl of the remaining diluted antibody solution to 100 μl of FACS buffer (final concentration: 10 $\mu\text{g}/\text{ml}$ antibody with cells).

16. Add 40 μ l of the new diluted antibody solution to the 60 μ L in FACS 'tube 2' for each of the cellular controls (final concentration: 4 μ g/ml antibody with cells).
17. Repeat steps 15 & 16 four more times to create a six-step serial dilution with final staining concentrations of 2 μ g/ml in 'tube 3', 1 μ g/ml in 'tube 4', 0.5 μ g/ml in 'tube 5', and 0.25 μ g/ml antibody in 'tubes 6'.
18. Incubate for 30 min at RT.
19. Add 3 ml of FACS buffer to each tube.
20. Centrifuge at 500 *g* for 5 min at 4 °C. Aspirate supernatant using a Pasteur pipette equipped with a fresh pipette tip.
21. Vortex to resuspend cells. If the cell pellet is not resuspended the cells will clump upon addition of methanol for cell permeabilization. Add 1 ml of 4 °C methanol to each disrupted cell pellet. Vortex to mix and incubate on ice for 10 min.
22. Add 2 ml of FACS buffer to each tube.
23. Centrifuge at 500 *g* for 5 min at 4 °C. Aspirate supernatant using a Pasteur pipette equipped with a fresh pipette tip. Vortex to resuspend cells.
24. Add 3 ml of FACS buffer to each tube. Centrifuge at 500 *g* for 5 min at 4 °C.
25. Aspirate supernatant, leaving cells in 60 μ l residual volume.
26. If staining and/or titrating intracellular antibodies, prepare an intracellular antibody staining cocktail and stain the cell samples according to steps 11–20.
27. Add 1 ml of Ir DNA intercalator solution to each FACS tube and mix thoroughly (see Note 11).
28. Incubate for at least 20 min at RT. Cells can be stored in DNA intercalator solution for up to 3 days at 4°C before acquisition on mass cytometer.
29. Add 2 ml of FACS buffer to each tube.
30. Centrifuge at 500 *g* for 5 min at 4 °C. Aspirate supernatant using a Pasteur pipette equipped with a fresh pipette tip. Vortex to resuspend the cells.
31. Add 3 ml of ddH₂O to each tube.
32. Centrifuge at 500 *g* for 5 min at 4 °C. Aspirate supernatant using a Pasteur pipette equipped with a fresh pipette tip. Vortex to resuspend the cells.
33. Repeat steps 31–32.
34. Place cell pellets on ice. Just prior to analysis, resuspend cells in ddH₂O at a concentration of 1–2 \times 10⁶ cells per ml.
35. Filter with a cell strainer and analyze each tube on the mass cytometer. At this stage, 1x EQ beads can be added to the sample to enable later data normalization. Collect cell events at a rate no faster than 500–1000 cells/s. If the cells are too concentrated the instrument can clog and the data quality may suffer due to overlapping cell boundaries. Adjust cell dilution with ddH₂O accordingly.

3.4. Gating strategy and data analysis

1. Figure 3 provides an example of anticipated results and analysis of titration data.
2. In .FCS file browsing software, gate on single cells (parameters: cell_length, Ir-191 or Ir-193) for all samples (Figure 3A). This gate may have to be tailored for each sample as the intensity of the Ir DNA intercalator staining can vary depending on a number of conditions such as cell type and number of cell in the staining reaction.
3. View different cell populations or control samples as stacked histograms or dot plots to visually validate epitope specificity of the antibody (Figure 3B).
4. Select the ideal antibody concentration based on the greatest overall signal in the positive control and signal-to-noise when compared to the negative control. This can be accomplished by comparing the channel medians (50th percentile) (Figure 3C) or, if focusing on an outlier population, the 95th percentile of the positive and negative samples at the different concentrations. Alternative approaches such as maximum separation index (SI) could also be employed [24].

3.5. Troubleshooting

1. Troubleshooting advice regarding antibody conjugation and titration can be found in Table 3. All potential problems will be observed during antibody recovery or during data analysis.

3.6. Anticipated Results

1. To demonstrate the utility of the protocol described herein and provide representative data for a mass cytometry antibody titration, antibodies against human CD95, CD21, and CD14 were conjugated to ¹⁶⁴Dy, ¹⁵²Sm, and ¹⁴⁸Nd, respectively (Figure 3). When choosing negative and positive control cell populations for an antibody titration, we prefer to utilize cells from a similar source as those to be interrogated experimentally, which, in this case, were human peripheral blood mononuclear cells (PBMC). The expectation was that CD21, complement component receptor 2, would be uniformly expressed on peripheral B cells, and CD14, the LPS co-receptor, would be expressed on the majority of monocytes. Similarly, we expected that CD95, the FAS receptor, would be expressed by most monocytes, at lower levels on some T cells and NK cells, but not by resting B cells, which constitute the majority of those present in unstimulated healthy human PBMC [25, 26]. The staining protocol with sample fixation and methanol permeabilization was used to stain human PBMC, which was expected to contain both positive and negative cell types for these antibody targets. A mixture of CD95, CD21, and CD14 were titrated according to the above described method. A separate mixture with CD45-¹⁵⁴Sm, CD3-¹⁷⁰Er, CD20-¹⁴⁷Sm, CD33-¹⁵⁸Gd, and CD16-¹⁶⁵Ho was prepared and added to each sample after the completion of step 17 in section 3.3 in order to identify control cell populations while simultaneously titrating CD95, CD21, and CD14. Six different antibody concentrations were evaluated using six samples, as the lack of

crosstalk between reporter signals allowed counterstaining all significant cell populations while titrating all three antibodies at the same time. Approximately, 10^5 cell events were acquired per sample on the CyTOF mass cytometer, and all data was uploaded to and analyzed at cytobank.org. Single cells were first identified by visualizing a biaxial plot of the iridium DNA intercalator signal versus cell length, a metric of the number of individual mass scans integrated to form the cell event as previously described [3]. Based on the expression of the counterstaining antibodies, the following cell populations were subsequently identified and gated: 1) CD33-positive myeloid cells, 2) CD20-positive B cells, 3) CD3-positive T cells, and 4) CD16-positive NK cells (Figure 3A). To assess the titration of CD95, CD21, and CD14 for each control cell populations, histogram overlays were created for each control population (Figure 3B). To more quantitatively visualize the differences between positive and negative control cell populations, selected based on known biology, dot plots summarizing the median counts for each antibody concentration from 0.25–8 $\mu\text{g/ml}$ were made (Figure 3C). Depending on the antibody, linear (CD95) or log (CD21 and CD14) scaled plots best revealed differences across different concentrations. In Figure 3B and C, the red asterisks indicate the optimal antibody concentrations selected for these particular preparations. These concentrations were selected based on signal-to-noise ratio (the ratio of positive control to negative control signal) and on the lowest antibody concentration where the positive signal was beginning to saturate (plateau at higher concentrations). Alternative mechanisms of titration analysis could include using the 5th or 95th percentile, as opposed to the median, to compare situations where outlier cell events in each population are a primary concern when assessing resolution of positive and negative controls. Separation index is a good example of this and is described by Bigos et al. [24].

2. Although not completely necessary, it is helpful to have the antibody at close to saturating concentration in order to buffer the effects of staining volume differences as well as differences in cell staining numbers. For example, for CD95 (Figure 3C) at the lower concentrations of antibody there was a linear relationship between the measured counts per cell and the concentration of the antibody. If the antibody were applied at one of these lower concentrations, changes in cell staining volumes, a common source of experimental variation, would have inversely proportional effects on the resulting stain intensity. Variations in cell numbers have a similar effect. Both of these situations are particularly problematic when attempting to perform comparative single-cell measurements in a relatively quantitative fashion. Also of note in Figure 3C is that all three antibodies had selected titration concentrations that were below the maximum possible positive signal. In the cases shown here, the signal-to-noise ratio was not significantly higher at the selected concentration than at higher concentrations and the positive signal had begun to saturate, evidenced by the titration curve plateau. For these reasons, and to conserve custom-labeled antibody, the lower titration point in each case was selected.

4. Notes

1. Immunoglobulin should be free of a cysteine-containing carrier protein in solution (e.g., BSA). Notably, the cysteine content of gelatin is variable, from 10 to 100-fold lower than that of BSA by mass to completely absent. We have conjugated antibodies in the presence of Porcine gelatin though it is not recommended as it makes the Ig recovery difficult to quantify. If a carrier is present, a purification procedure should be performed before attempting the conjugation. Small molecule preservatives (e.g., trehalose, glycerol and sodium azide) or standard buffer salts are compatible additives.
2. For the conjugation of > 100 µg of the same immunoglobulin to a given heavy metal isotope use 1 tube of MaxPar polymer per 100 µg of antibody. You will need to add 5 µl of metal stock per tube of polymer. Resuspend the first polymer in a volume 'X' of L-buffer such that 'X' = 100 µl - ((Amount of antibody in µg / 100 µg) * 5 µl). E.g. for the conjugation of 500 µg, the first polymer tube is to be resuspended in 75 µl of L buffer. Subsequently, resuspend the next 4 tubes of polymer with the L-buffer from the first. Complete the pre-loading step by adding 25 µl of metal stock.
3. If antibodies are to be conjugated with ²⁰⁹Bi, replace L buffer with 1% HNO₃ in this step. Note that the Bi stock will also be in 1–10% HNO₃ to maintain solubility.
4. For the conjugation of > 100 µg of immunoglobulin, add 5 µl of stock metal solution per 100 µg of protein.
5. To confirm the integrity of the filter column, add 400 µl of ddH₂O and centrifuge at 12,000 *g* for 30 sec. The volume of the flow-through should be around 150 µl. Spin for 5 min to get rid of excess ddH₂O and discard flow-through. During the conjugation procedure, make sure to never touch the column membrane with the pipet tip to avoid scratches which can lead to lower antibody recovery.
6. Optional: To ensure that the volume of antibody solution corresponds to the intended quantity (within a tolerance of +/- 10%), confirm the protein concentration of the antibody stock solution by measuring the absorbance at 280 nm as described in section 3.2.
7. MWCO micro-filter devices are designed to hold up to 500 µl. If the desired amount of antibody requires addition of more than 200 µl of solution, pre-concentrate the antibody first in the same 50-kDa MWCO micro-filter device by spinning at 12,000 *g* for 8 min at RT until all of the antibody solution has been added to the column and the final volume is 200 µl. If these additional steps are required to pre-concentrate the antibody, this step should begin earlier (see Figure 2).
8. If antibodies are to be conjugated with ²⁰⁹Bi, replace C-buffer with modified C-buffer in this step.

9. Bismuth-ion chelator complexes interfere with the measured absorbance at 280 nm and thus cannot easily be quantified using this method. Alternatively, bicinchoninic acid assays (BCA) can be used to determine the protein content.
10. In case the recognized epitope is stimulation dependent, proceed as follows: add 1 ml of cell culture media at 37 °C to two FACS tubes, labeled stimulated and unstimulated. Add stimulation cocktail of choice to one tube. Selecting the appropriate stimulation condition is essential for validating and titrating the conjugated antibody. The stimulation should result in selective induction of the activated form of the signaling molecule of interest. Please refer to these for additional information on antibody targets, appropriate stimulation, and timing – reviewed in [27]. For secreted molecules such as cytokines, add 1X brefeldin A and monensin to the cell culture media prior to addition of cells to medium. More details on cytokine production and measurement by mass cytometry can be found in Newell *et al.* [8]. Add 10×10^6 cells to each FACS tube. Incubate cells at 37 °C for the appropriate time for monitoring of the selected cellular target. Because distinct signaling pathways are activated at different times following stimulation, the incubation time should be adjusted accordingly. Some cellular signaling events are very time sensitive. Be ready to proceed to fixation immediately.
11. The reagent should be made fresh for each use. The amount of Ir intercalating reagent can also be reduced (to 0.15–0.2 µl per ml) for more sensitive instruments and larger cells, or increased (to 0.5 µl per ml) for staining cells that were not permeabilized (not described herein).

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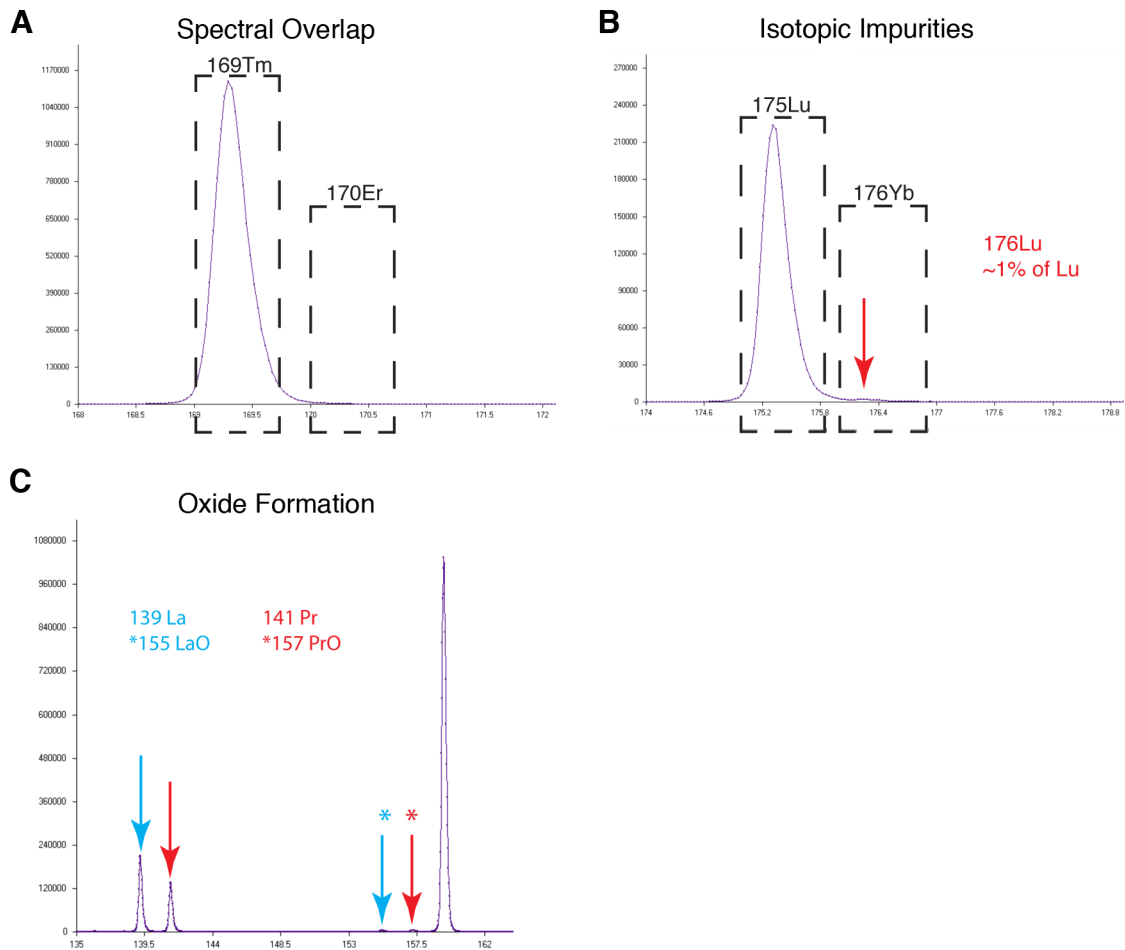


Figure 1 – Sources of signal interference in mass cytometry assays as demonstrated by analyzing a mixture of metal standard (^{139}La , ^{141}Pr , ^{159}Tb , ^{169}Tm , and ^{175}Lu) on a CyTOF mass cytometer. (A) Spectral overlap from the ^{169}Tm standard into the ^{170}Er measurement channel. ^{169}Tm is naturally mono-isotopic with no expectation of a constituent with mass 170. (B) Natural Lu, used to make the standard in this experiment, contains ~99% ^{175}Lu and 1% ^{176}Lu . A distinct peak corresponding to the ^{176}Lu isotopic ‘contaminant’ can be seen in the measurement window that would be used for ^{176}Yb labeled reagents (red arrow). The dashed black boxes in (A) and (B) represent the measurement window where all signals within that range would be attributed to the indicated elemental isotope. (C) La and Pr oxide formation indicated with the blue and red arrows, respectively. Here the resulting ‘+16Da’ oxide interference peak is indicated with a ‘*’ of a matching color.

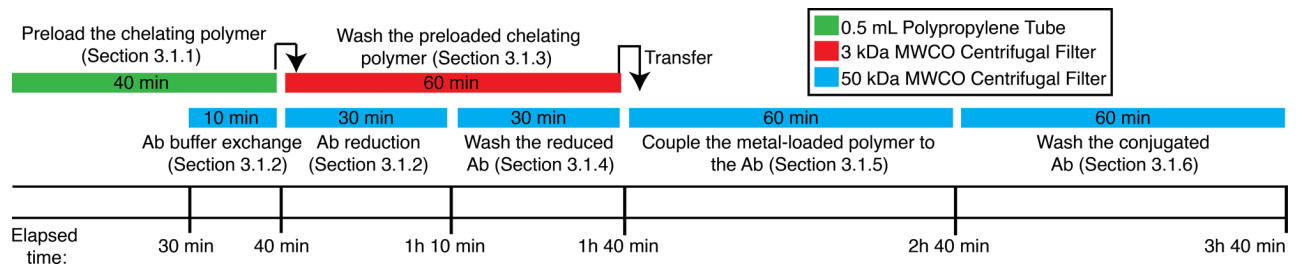


Figure 2 –.

A workflow summarizing the timing and coordination of steps for the conjugation of a purified immunoglobulin with a sulfhydryl reactive polymer pre-loaded with metal isotope reporters.

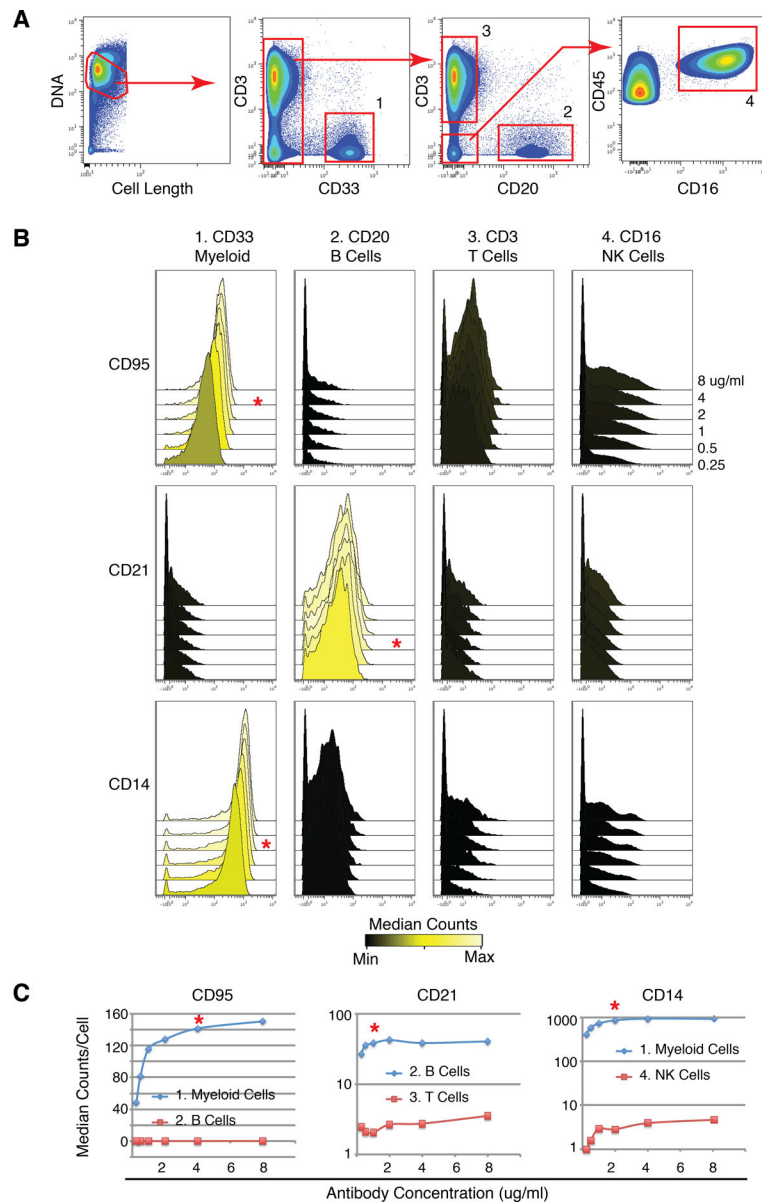


Figure 3 –. Anticipated results for the titration of metal reporter conjugated antibodies by CyTOF mass cytometry. Using the protocol described herein, antibodies against human CD95, CD21, and CD14 were labeled with ^{164}Dy , ^{152}Sm , and ^{148}Nd , respectively. Using the surface staining protocol and a methanol permeabilization, these antibodies were simultaneously titrated from 0.25–8 $\mu\text{g/ml}$ on human peripheral blood mononuclear cells that were counterstained with CD45- ^{154}Sm , CD33- ^{170}Er , CD20- ^{147}Sm , CD33- ^{158}Gd , and CD16- ^{165}Ho in order to identify positive and negative cell populations. (A) From data analysis at cytobank.org, the following populations were identified: 1) CD33-positive myeloid cells, 2) CD20-positive B cells, 3) CD3-positive T cells, and 4) CD16-positive NK cells. (B) Histogram overlays of CD95, CD21, and CD14 expression levels in the gated populations from (A) were created at cytobank.org. Histogram color scale indicates minimum (black) and maximum (yellow) (C) Median Counts/Cell vs Antibody Concentration ($\mu\text{g/ml}$) for CD95, CD21, and CD14. Legend: 1. Myeloid Cells (blue circles), 2. B Cells (red squares), 3. T Cells (green triangles), 4. NK Cells (black diamonds). Red asterisks indicate significant differences.

median counts for each given antibody. (C) Dot plots summarizing the median counts of representative positive (blue) and negative (red) cell controls for each of the titrated antibodies across the range of 0.25–8 µg/ml. In (B) and (C) the red asterisk indicates the ideal antibody concentration with maximum signal-to-noise (the ratio of positive control to negative control signal) and lowest antibody concentration where the positive signal begins to saturate.

Table 1 –

A summary of compatible trivalent stable elemental isotopic reporters, commercial sources, and relative sensitivities and performance notes and common interferences in mass cytometry assays.

Isotopic Mass	Element (Symbol) ^A	Commercial Availability ^B	Relative Sensitivity ^C	Most Common Interference ^D *Ba Oxide or Hydroxide (Contaminant)
113	Indium (In)	P	0.1	¹¹³ In impurity from another In
115	Indium (In)	P	0.1	¹¹⁵ In impurity from another In
139	Lanthanum (La)	N	0.3	¹³⁸ Ba (contamination) +1 signal bleed
140	Cerium (Ce)	P	0.3	
141	Praseodymium (Pr)	M, N	0.3	
142	Neodymium (Nd)	M, P	0.4	¹⁴² Nd impurity from another Nd
143	Neodymium (Nd)	M, P	0.4	¹⁴³ Nd impurity from another Nd
144	Neodymium (Nd)	M, P	0.5	¹⁴⁴ Nd impurity from another Nd
145	Neodymium (Nd)	M, P	0.5	¹⁴⁵ Nd impurity from another Nd
146	Neodymium (Nd)	M, P	0.5	¹⁴⁶ Nd impurity from another Nd
147	Samarium (Sm)	M, P	0.6	¹⁴⁷ Sm impurity from another Sm
148	Neodymium (Nd)	M, P	0.6	¹⁴⁸ Sm impurity from an Sm reporter
149	Samarium (Sm)	M, P	0.6	¹⁴⁹ Sm impurity from another Sm
150	Neodymium (Nd)	M, P	0.7	¹⁵⁰ Sm impurity from an Sm reporter
151	Europium (Eu)	M, P	0.7	*
152	Samarium (Sm)	M, P	0.7	*, ¹⁵² Gd impurity from a Gd reporter
153	Europium (Eu)	M, P	0.8	*
154	Samarium (Sm)	M, P	0.8	*
155	Gadolinium (Gd)	M, P	0.8	*, ¹³⁹ La Oxide; ¹⁵⁵ Gd impurity from another Gd
156	Gadolinium (Gd)	M, P	0.9	¹⁴⁰ Ce Oxide; ¹⁵⁶ Gd impurity from another Gd
157	Gadolinium (Gd)	P	0.9	¹⁴¹ Pr Oxide; ¹⁵⁷ Gd impurity from another Gd
158	Gadolinium (Gd)	M, P	0.9	¹⁴² Nd Oxide; ¹⁵⁸ Gd impurity from another Gd
159	Terbium (Tb)	M, N	1	¹⁴³ Nd Oxide
160	Gadolinium (Gd)	M, P	1	¹⁴⁴ Nd Oxide; ¹⁶⁰ Dy impurity from a Dy reporter
161	Dysprosium (Dy)	M, P	1	¹⁴⁵ Nd Oxide; ¹⁶¹ Dy impurity from another Dy
162	Dysprosium (Dy)	M, P	1	¹⁴⁶ Nd Oxide; ¹⁶² Dy impurity from another Dy
163	Dysprosium (Dy)	M, P	1	¹⁴⁷ Sm Oxide; ¹⁶³ Dy impurity from another Dy
164	Dysprosium (Dy)	M, P	1	¹⁴⁸ Nd Oxide; ¹⁶⁴ Dy impurity from another Dy
165	Holmium (Ho)	M, N	1	¹⁴⁹ Sm Oxide
166	Erbium (Er)	M, P	1	¹⁵⁰ Nd Oxide; ¹⁶⁶ Er impurity from another Er
167	Erbium (Er)	M, P	1	¹⁶⁷ Er impurity from another Er
168	Erbium (Er)	M, P	1	¹⁵² Sm Oxide; ¹⁶⁸ Er impurity from another Er
169	Thulium (Tm)	M, N	1	
170	Erbium (Er)	M, P	0.9	¹⁵⁴ Sm Oxide; ¹⁷⁰ Yb impurity from a Yb reporter
171	Ytterbium (Yb)	M, P	0.9	¹⁵⁵ Gd Oxide; ¹⁷¹ Yb impurity from another Yb
172	Ytterbium (Yb)	M, P	0.9	¹⁵⁶ Gd Oxide; ¹⁷² Yb impurity from another Yb

Isotopic Mass	Element (Symbol) ^A	Commercial Availability ^B	Relative Sensitivity ^C	Most Common Interference ^D *Ba Oxide or Hydroxide (Contaminant)
173	Ytterbium (Yb)	M, P	0.8	¹⁵⁷ Gd Oxide; ¹⁷³ Yb impurity from another Yb
174	Ytterbium (Yb)	M, P	0.8	¹⁵⁸ Gd Oxide; ¹⁷⁴ Yb impurity from another Yb
175	Lutetium (Lu)	M, P	0.8	¹⁵⁹ Tb Oxide
176	Ytterbium (Yb)	M, P	0.8	¹⁶⁰ Gd-oxide; ¹⁷⁶ Lu impurity from a Lu reporter
197	Gold (Au)	N	0.3	High non-specific binding
203	Thallium (Tl)	P	0.5	²⁰³ Tl impurity from another Tl
205	Thallium (Tl)	P	0.5	²⁰⁵ Tl impurity from another Tl
209	Bismuth (Bi)	N	0.5	¹⁹³ Ir Oxide (DNA intercalator)

^A Most abundant elemental isotope with that mass. Other stable elemental isotopes with the same mass may exist.

^B M: MaxPAR labeling kit; P: source (III) purified chloride or nitrate isotope from supplier (e.g. Trace Sciences International); N: Natural (III) chloride or nitrate element is >99.9% monoisotopic.

^C Based on the original mass cytometry specifications [2]. Transmission efficiency varies between instruments. This should serve only as a guide.

^D Most significant source(s) of signal interference, if any, in mass cytometry assays. Other isotopic contaminants and ion adducts (i.e. oxidation) may not be listed. For a more complete list see Ornatsky et al. [21] and Table 2.

Table 2 –

The expected relative occurrence of oxide (M+O) and hydroxide (M+OH) ion adducts during ICP-MS analysis of metals commonly present in mass cytometry assays. The frequency of occurrence has been normalized to ratio of LaO/La acquired under the same conditions.

Element (Symbol)	Relative to LaO Occurrence ^A	
	Oxide Level (M+ ¹⁶ O)	Hydroxide Level (M+ ¹⁶ O ¹ H)
Barium (Ba)	0.04	0.05
Lanthanum (La)	1.0	0.09
Cerium (Ce)	1.0	0.07
Praseodymium (Pr)	0.7	0.05
Neodymium (Nd)	0.58	0.03
Samarium (Sm)	0.11	0.01
Europium (Eu)	0.02	-
Gadolinium (Gd)	0.30	0.08
Terbium (Tb)	0.25	0.02
Dysprosium (Dy)	0.11	0.01
Holmium (Ho)	0.10	0.00
Erbium (Er)	0.09	0.00
Thulium (Tm)	0.03	0.00
Ytterbium (Yb)	0.01	0.00
Lutetium (Lu)	0.07	0.01

^ABased on the published ratios of oxide (M+O/M) or hydroxide (M+OH/M) measured by ICP-MS analysis [22], normalized to the expected ratio of LaO/La in the same experiment and accounting for the relative mass sensitivities as reported in Table 1. This frequency of LaO occurrence is a common metric in tuning oxidation levels in mass cytometry experiments. For example, if the level of LaO was found to be 2% of the total La signal then the expected GdO level would only be 0.6% of the total Gd signal. Note that the abundance of oxide ions also depends on local plasma temperature and thus may deviate slightly from these values.

Table 3 –

A troubleshooting guide for common issues observed following custom antibody conjugation.

Problem	Possible reason	Solution
Antibody recovery too low post-conjugation (<50%)	Precipitation	Likely induced by excess lanthanide metal exposure or antibody denaturation due to reduction. Ensure complete washes of the polymer and metal with post-centrifuge filter volumes of < 20µl to achieve desired dilution factor.
	Antibody starting concentration	Measure concentration of starting antibody stock by A280 to ensure concentration is as stated by manufacturer
	Defective 50kDa MWCO filter	Repeat labeling protocol with a new filter and fresh antibody preparation.
Antibody recovery too high post-conjugation (>95%)	Carrier protein	Check manufacturer specifications for carrier protein (BSA, gelatin, 'protein stabilizer'). Obtain carrier free stock or purify antibody away from carrier.
	Antibody starting concentration	Measure concentration of starting antibody stock by A280 to ensure concentration is as stated by manufacturer.
No antibody staining detected	Poor staining	Repeat staining steps with fresh cells
	Antibody integrity destroyed	After staining cells with conjugated antibody, perform secondary stain with fluorescently-labeled anti-IgG antibody and run on flow cytometer (e.g., LSR II from BD)
	Mass cytometer malfunction	Check mass cytometer performance using CyTOF Calibration Beads
Weak antibody staining detected	Poor staining	Repeat staining steps with fresh cells
	Improper titration range	Repeat staining steps using increased antibody concentration
No difference between positive and negative controls	Improper choice of controls	Check antigen expression using fluorescently-labeled antibodies on flow cytometer (e.g., LSR II from BD)
	Loss of antigen specificity	After staining cells with conjugated antibody, perform secondary stain with fluorescently-labeled anti-IgG antibody and run on flow cytometer (e.g., LSR II from BD)
No difference between titration steps	Improper titration range	Repeat staining steps using decreased antibody concentration
High background	Improper titration range	Repeat staining steps using decreased antibody concentration
	Loss of antigen specificity	After staining cells with conjugated antibody, perform secondary stain with fluorescently-labeled anti-IgG antibody and run on flow cytometer (e.g., LSR II from BD)