

SYSTEMS AND METHODS FOR IDENTIFYING AND CLASSIFYING RARE CELLS**CROSS REFERENCE TO RELATED APPLICATION**

[0001] This application claims the priority benefit of U.S. Provisional Patent Application No. 63/185,586, filed on May 7, 2021, the disclosure of which is incorporated by reference in its entirety.

INCORPORATION BY REFERENCE

[0002] All publications and patent applications mentioned in this specification are herein incorporated by reference in their entirety, as if each individual publication or patent application was specifically and individually indicated to be incorporated by reference in its entirety.

TECHNICAL FIELD

[0003] This disclosure relates generally to the fields of machine learning and imaging. Described herein are devices, systems, and methods for computer-implemented machine learning systems for identifying and classifying rare cells.

BACKGROUND

[0004] Circulating tumor cells (CTCs) are cancerous cells that are shed from the primary tumor and have entered circulation in the vasculature or lymphatics. Some CTCs become embedded in a microenvironment of the body that is conducive to cancer growth, resulting in metastatic cancer. Such metastatic cancer is responsible for 90% of cancer-related deaths (Fidler, IJ. (2003) "The pathogenesis of cancer metastasis: the 'seed and soil' hypothesis revisited. Nat Rev Cancer 3, 453-458).

[0005] Because of the key role of CTCs in the pathogenesis of metastatic disease, CTCs have become an intense and active area of investigation. Conventionally, CTCs have been identified using physical properties, such as density and cell size, cell-surface related markers, and/or immune properties of the CTC. Unfortunately, such physical properties, cell-surface related markers, and immune properties may also identify healthy cells that do not contribute to disease or fail to detect relevant, pathogenic CTCs. For example, CellSearch™ by Veridex identifies CTC

in breast, colorectal, and prostate cancer using positive staining for both epithelial cell adhesion molecule (EpCAM) and cytokeratin. However, when 50 breast cancer cells lines were examined for EpCAM expression, 20% of the cell lines had low levels of EpCAM, suggesting that this 20% would have been missed using the CellSearch™ method (Punnoose et al., (2010) “Molecular biomarker analyses using circulating tumor cells.” PLoS One 5, el2517.).

[0006] Other methods or techniques for identification and analysis of CTCs have several limitations, for example limited throughput, high frequency of false positives, requires cell permeabilization (rendering the cell useless for most subsequent analysis), dependent on EpCAM (see above), dependent on highly variable markers or properties (e.g., size, density), or the cells are no longer viable at the end of the method.

[0007] Further, methods of preparing cells for analysis typically damage the cell and/or tissue and result in the appearance of artifacts, autofluorescent debris or cellular matter, and/or disrupted cellular membranes which can obscure rare cell populations. Such methods use fixatives including cross-linking fixatives (e.g., formaldehyde, paraformaldehyde, etc.) or precipitating fixatives (e.g., ethanol, methanol, etc.). These fixatives also fail to preserve the ribonucleic acid (RNA) of the cells, making subsequent genetic and transcriptome analysis difficult if not impossible.

[0008] Additionally, it is often difficult to stain for multiple cellular biomarkers and to clearly distinguish the stained features or biological characteristics from the unstained cellular features. Blocking buffers are commonly used to improve staining specificity, decrease background staining, and improve signal-to-noise ratio. Agents ranging from milk to normal serum to highly purified proteins have been used in blocking buffers to bind free sites on cells and to reduce non-specific binding of antibodies in a stain. However, commonly used blocking buffers are inadequate for rare cells, multi-antibody stains, and stains requiring greater than four fluorophores.

[0009] Thus, increasing the time and ability to identify, analyze, classify and characterize CTCs at a molecular level will enhance cancer screening and therapy, thereby reducing the need for invasive procedures, such as biopsies.

SUMMARY

[0010] One aspect of the present disclosure is directed to a computer-implemented machine learning system including machine learning layers for identifying and classifying cells, cell types, and cell subtypes in an image.

[0011] One aspect of the present disclosure is directed to a reagent system for fixing cells. In some embodiments, the reagent system includes: a first fixing buffer comprising: at least 3% w/v of a first hydrophilic polymer diluted in an alcohol; and a second fixing buffer comprising: at least 5% v/v of a second hydrophilic polymer, at least 0.01% v/v of a detergent, and at least 0.005% w/v of a chrome alum. In some embodiments, the second hydrophilic polymer, detergent, and chrome alum are diluted in saline. In some embodiments, the first fixing buffer is applied to the cells at a temperature colder than -5°C.

[0012] Another aspect of the present disclosure is directed to a reagent system for fixing cells. In some embodiments, the reagent system includes: a first fixing buffer comprising: 3% to 20% w/v of a first hydrophilic polymer diluted in an alcohol; and a second fixing buffer comprising: 5% to 30% v/v of a second hydrophilic polymer, 0.01% to 1% v/v of a detergent, and 0.005% to 1% w/v of a chrome alum. In some embodiments, the second hydrophilic polymer, detergent, and chrome alum are diluted in saline. In some embodiments, the first fixing buffer is applied to the cells at a temperature between -90°C and -5°C.

[0013] Another aspect of the present disclosure is directed to a reagent system for fixing cells. In some embodiments, the reagent system includes: a first fixing buffer comprising: 5% w/v of a first hydrophilic polymer diluted in an alcohol; and a second fixing buffer comprising: 15 % v/v of a second hydrophilic polymer, 0.4% v/v of a detergent, and 0.01% w/v of a chrome alum. In some embodiments, the second hydrophilic polymer, detergent, and chrome alum are diluted in saline. In some embodiments, the first fixing buffer is applied to the cells at a temperature colder than -15°C.

[0014] In some embodiments, the first hydrophilic polymer is one of polyvinylpyrrolidone and glycerol.

[0015] In some embodiments, the second hydrophilic polymer is one of glycerol and polyvinylpyrrolidone.

[0016] In some embodiments, the alcohol is methanol.

[0017] In some embodiments, the detergent is a polysorbate surfactant. In some embodiments, the detergent is polysorbate 20.

[0018] In some embodiments, the first and second hydrophilic polymer are the same. In some embodiments, the first and second hydrophilic polymer are different.

[0019] Another aspect of the present disclosure is directed to a reagent for fixing a cell. In some embodiments, the reagent includes: at least 3% w/v of a hydrophilic polymer diluted in an alcohol. In some embodiments, the reagent is applied to the cell at a temperature colder than -5°C.

[0020] In some embodiments, the cell is a circulating tumor cell. In some embodiments, the cell is embedded in a tissue section.

[0021] In some embodiments, each feature representing a region of cells is one of: a nuclear region or marker, a cytoplasmic region or marker, a membrane region or marker, a cellular region or marker, a fluorescence intensity, a region shape or area, or a combination thereof.

[0022] In some embodiments, a cell type is one of: a polymorphonuclear cell, an atypical polymorphonuclear cell, an atypical cell, a mononuclear cell, an atypical mononuclear cell, a megakaryocyte cell, or a combination thereof.

[0023] In some embodiments, a cell subtype is one of: an isomorphic tumor cell, a polymorphic non-white blood cell, a polymorphic tumor cell, an atypical white blood cell, a megakaryocyte, a megakaryoblast, an activated mononuclear cell, a neutrophil, an eosinophil, a basophil, a T cell, a B cell, a granular lymphocyte, a lymphocyte, a plasma cell, a monocyte, an hematopoietic stem cell, a circulating tumor cell, a cancer cell, or a combination thereof.

[0024] Another aspect of the present disclosure is directed to a reagent for blocking non-specific binding sites on or in a cell before staining to decrease non-specific staining. In some embodiments, the reagent includes: a hydrophilic polymer; a detergent; and hydrolyzed collagen. In some embodiments, the hydrophilic polymer, detergent, and hydrolyzed collagen are diluted in saline.

[0025] Another aspect of the present disclosure is directed to a reagent for blocking non-specific binding sites on or in a cell before staining to decrease non-specific staining. In some embodiments, the reagent includes: at least 1% v/v hydrophilic polymer; at least 0.01% v/v of a detergent; and at least 0.1% w/v hydrolyzed collagen. In some embodiments, the hydrophilic polymer, detergent, and hydrolyzed collagen are diluted in saline.

[0026] In some embodiments, the reagent further includes: at least 0.01M Glycine.

[0027] Another aspect of the present disclosure is directed to a reagent for blocking non-specific binding sites on or in a cell before staining to decrease non-specific staining. In some

embodiments, the reagent includes: 1% to 50% v/v hydrophilic polymer; 0.01% to 2% v/v of a detergent; and 0.1% to 10% w/v hydrolyzed collagen. In some embodiments, the hydrophilic polymer, detergent, and hydrolyzed collagen are diluted in saline.

[0028] In some embodiments, the reagent further includes: 0.01M to 1M Glycine.

[0029] Another aspect of the present disclosure includes a reagent for blocking non-specific binding sites on or in a cell before staining to decrease non-specific staining. In some embodiments, the reagent includes: 15% v/v hydrophilic polymer; 0.4% v/v of a detergent; and 2% w/v hydrolyzed collagen. In some embodiments, the hydrophilic polymer, detergent, and hydrolyzed collagen are diluted in saline.

[0030] In some embodiments, the reagent further includes: 0.3M Glycine.

[0031] In some embodiments, the hydrolyzed collagen is pig-derived.

[0032] Another aspect of the present disclosure is directed to a method of identifying a cell as a circulating tumor cell. In some embodiments, the method includes: imaging a cell sample to identify a cell of interest; determining a first pixel intensity of a stained nuclear area; determining a second pixel intensity of a background area; calculating a ploidy status of the cell of interest by subtracting the second pixel intensity from the first pixel intensity; and determining whether the cell of interest is a circulating tumor cell based on the ploidy status.

[0033] In some embodiments, identifying the cell of interest includes identifying a CD45 negative and Vimentin positive cell.

[0034] In some embodiments, the cell sample includes one or more cells.

[0035] In some embodiments, the method further includes staining the cell sample with a nuclear stain to identify the stained nuclear area of the cell of interest.

[0036] In some embodiments, the background area does not include the cell of interest.

[0037] In some embodiments, the cell of interest is determined to be the circulating tumor cell if the ploidy status is less than one. In some embodiments, the cell of interest is determined to be the circulating tumor cell if the ploidy status is greater than two. In some embodiments, the cell of interest is negative for a proliferation marker and is determined to be the circulating tumor cell if the ploidy status is between one and two.

[0038] In some embodiments, the method further includes: staining the one or more cells with a vimentin stain and a CD45 stain.

[0039] In some embodiments, the nuclear stain is selected from the group consisting of: DRAQ5; 4',6-diamidino-2-phenylindole; propidium iodide; hematoxylin; Kernechtrot dye; Hoechst; and methyl green.

[0040] In some embodiments, the method further includes excluding one or more apoptotic cells.

[0041] In some embodiments, the method further includes identifying the one or more apoptotic cells by positive staining for Caspase 3.

[0042] In some embodiments, the method further includes excluding one or more mitotic cells.

[0043] In some embodiments, the method further includes identifying the one or more mitotic cells by positive staining for phosphorylated-histone H3 or Ki-67.

[0044] Another aspect of the present disclosure is directed to a computer-implemented method of identifying a cell as a circulating tumor cell. In some embodiments, the method includes: acquiring an image of a cell of interest; identifying a feature associated with the cell of interest, such that the feature includes a nuclear region or marker, a cytoplasmic region or marker, a membrane region or marker, a cellular region or marker, or a combination thereof; processing the feature to extract a parameter of interest, such that the parameter of interest includes a fluorescence intensity, a cell size, a cell shape, a cellular area, a cytoplasmic area, a nuclear area, or a combination thereof; analyzing the parameter of interest; and when the parameter of interest is greater than or less than a pre-determined threshold, classifying the cell of interest as a circulating tumor cell.

[0045] In some embodiments, the feature is the nuclear region and the parameter of interest is the fluorescence intensity of the nuclear region.

[0046] In some embodiments, the cell of interest is classified as the circulating tumor cell when the parameter of interest is greater than two. In some embodiments, the cell of interest is classified as the circulating tumor cell when the parameter of interest is less than one. In some embodiments, the cell of interest is negative for a proliferation marker and is classified as the circulating tumor cell when the parameter of interest is between one and two.

[0047] In some embodiments, the method further includes processing the image to improve a signal-to-noise quality of the image.

[0048] In some embodiments, the method further includes staining the cell of interest with a vimentin stain, a CD45 stain, and the nuclear stain.

[0049] In some embodiments, the cell of interest is CD45 negative and vimentin positive.

[0050] In some embodiments, the nuclear stain is selected from the group consisting of: DRAQ5; 4',6-diamidino-2-phenylindole; propidium iodide; hematoxylin; Kernechtrot dye; Hoechst; and methyl green.

[0051] In some embodiments, the method further includes excluding the cell of interest as an apoptotic cell. In some such embodiments, the method may further include identifying the apoptotic cell as Caspase 3 positive.

[0052] In some embodiments, the method further includes excluding the cell of interest as a mitotic cell. In some such embodiments, the method may further include identifying the mitotic cell as phosphorylated histone H3 or Ki-67.

[0053] In some embodiments, analyzing and classifying are performed using machine-learning. In some such embodiments, the machine learning technique comprises: a supervised, unsupervised, reinforcement, semi-supervised, self-supervised, multi-instance, inductive, deductive inference, transductive, multi-task, active, online, transfer, ensemble, neural networks, convolutional neural networks, recurrent neural networks, modular neural networks, long short-term memory, Classification Trees, Discriminant Analysis, k-Nearest Neighbors, Naive Bayes, Support Vector Machines, deep learning, or convolutional neural network.

[0054] In some embodiments, the method further includes calculating a confidence score for the classification of the cell of interest.

[0055] Another aspect of the present disclosure includes a method for fixing a cell. In some embodiments, the method includes: applying a first fixing buffer to the cell at a temperature colder than -5°C, the first fixing buffer comprising: 3% to 20% w/v of a first hydrophilic polymer diluted in an alcohol; and applying a second fixing buffer to the cell, the second fixing buffer comprising: 5% to 30% v/v of a second hydrophilic polymer, 0.01% to 1% v/v of a detergent, and 0.005% to 1% w/v of a chrome alum. In some embodiments, the second hydrophilic polymer, detergent, and chrome alum are diluted in saline.

[0056] In some embodiments, the method further includes applying a blocking buffer to the cell, the blocking buffer comprising: 1% to 50% v/v hydrophilic polymer; 0.01% to 2% v/v of

a detergent; and 0.1% to 10% w/v hydrolyzed collagen. In some embodiments, the third hydrophilic polymer, detergent, and hydrolyzed collagen are diluted in saline.

[0057] In some embodiments, the first, second, and third hydrophilic polymers are the same. In some embodiments, the first, second, and third hydrophilic polymers are different. In some embodiments, the first, second, and third hydrophilic polymers are one of glycerol and polyvinylpyrrolidone.

[0058] In some embodiments, the method further includes cytocentrifuging the cell onto a slide. In some such embodiments, the cell is coated in a buffer comprising: 3% to 30% v/v of the first hydrophilic polymer, and 0.005% to 1% w/v of chrome alum. In some embodiments, the first hydrophilic polymer and chrome alum are diluted in saline.

[0059] In some embodiments, the slide is coated with gelatin. In some embodiments, the slide is further coated with chrome alum.

[0060] In some embodiments, the cell is a circulating tumor cell. In some embodiments, the cell is embedded in a tissue section.

[0061] In some embodiments, the method further includes staining the cell with a fluorophore-tagged antibody.

BRIEF DESCRIPTION OF THE DRAWINGS

[0062] The foregoing is a summary, and thus, necessarily limited in detail. The above-mentioned aspects, as well as other aspects, features, and advantages of the present technology described below in connection with various embodiments, with reference made to the accompanying drawings.

[0063] FIG. 1 is a flow chart of one embodiment of a method for fixing a cell.

[0064] FIG. 2 is a flow chart of one embodiment of a method of identifying a cell as a circulating tumor cell.

[0065] FIG. 3 is a flow chart of one embodiment of a computer-implemented method of identifying a cell as a circulating tumor cell.

[0066] FIG. 4 is a schematic of a computing device configured to perform the methods of FIGS. 1-3.

[0067] FIGS. 5A-8B show experimental results in which A549 cells were stained with anti-cytokeratin phycoerythrin (PE), shown in green.

[0068] FIG. 5A shows one example of an experimental result in which cells were cytocentrifuged in a buffer including 0% w/v PVP and 0.01% w/v Chromium Potassium Sulfate diluted in phosphate buffered saline (PBS).

[0069] FIG. 5B shows one example of an experimental result in which cells were cytocentrifuged in a buffer including 1% w/v PVP and 0.01% w/v Chromium Potassium Sulfate diluted in PBS.

[0070] FIG. 5C shows one example of an experimental result in which cells were cytocentrifuged in a buffer including 10% w/v PVP and 0.01% w/v Chromium Potassium Sulfate diluted in PBS.

[0071] FIG. 5D shows one example of an experimental result in which cells were cytocentrifuged in a buffer including 20% w/v PVP and 0.01% w/v Chromium Potassium Sulfate diluted in PBS.

[0072] FIG. 6A shows one example of an experimental result in which cells were fixed at -10°C with an extracellular fixative comprising 100% methanol.

[0073] FIG. 6B shows one example of an experimental result in which cells were fixed on dry ice with an extracellular fixative comprising 100% methanol.

[0074] FIG. 6C shows one example of an experimental result in which cells were fixed at -10°C with an extracellular fixative comprising 1% w/v PVP diluted in methanol.

[0075] FIG. 6D shows one example of an experimental result in which cells were fixed on dry ice with an extracellular fixative comprising 1% w/v PVP diluted in methanol.

[0076] FIG. 6E shows one example of an experimental result in which cells were fixed at -10°C with an extracellular fixative comprising 5% w/v PVP diluted in methanol.

[0077] FIG. 6F shows one example of an experimental result in which cells were fixed on dry ice with an extracellular fixative comprising 5% w/v PVP diluted in methanol.

[0078] FIG. 6G shows one example of an experimental result in which cells were fixed at -10°C with an extracellular fixative comprising 10% w/v PVP diluted in methanol.

[0079] FIG. 6H shows one example of an experimental result in which cells were fixed on dry ice with an extracellular fixative comprising 10% w/v PVP diluted in methanol.

[0080] FIGS. 7A-7F show experimental results in which A549 cells were stained with anti-cytokeratin (shown in green) and anti-CD45 (shown in yellow).

[0081] FIG. 7A shows one example of an experimental result in which cells were fixed at room temperature with an intracellular fixative comprising 15% v/v Glycerol and 0.01% w/v Chromium potassium sulfate diluted in PBS.

[0082] FIG. 7B shows one example of an experimental result in which cells were fixed on salt ice (e.g., about -2°C) with an intracellular fixative comprising 15% v/v Glycerol and 0.01% w/v Chromium potassium sulfate diluted in PBS.

[0083] FIG. 7C shows one example of an experimental result in which cells were fixed on salt ice (e.g., about -2°C) with an intracellular fixative comprising 8% v/v Glycerol and 0.01% w/v Chromium potassium sulfate diluted in PBS.

[0084] FIG. 7D shows one example of an experimental result in which cells were fixed on salt ice (e.g., about -2°C) with an intracellular fixative comprising 25% v/v Glycerol and 0.01% w/v Chromium potassium sulfate diluted in PBS.

[0085] FIG. 7E shows one example of an experimental result in which cells were fixed on salt ice (e.g., about -2°C) with an intracellular fixative comprising 15% v/v Glycerol and 0% w/v Chromium potassium sulfate diluted in PBS.

[0086] FIG. 7F shows one example of an experimental result in which cells were fixed on salt ice (e.g., about -2°C) with an intracellular fixative comprising 15% v/v Glycerol and 0.01% w/v Chromium potassium sulfate diluted in PBS.

[0087] FIG. 8A shows one example of an experimental result in which cells were blocked with a blocking buffer prior to staining. The blocking buffer included 2% w/v bovine serum albumin (BSA).

[0088] FIG. 8B shows one example of an experimental result in which cells were blocked with a blocking buffer prior to staining. The blocking buffer included 2% w/v hydrolyzed collagen.

[0089] FIG. 9A shows white blood cells spiked with A549 cells fixed with 10% w/v PVP and 0.01% w/v chromium potassium sulfate according to the methods described in FIG. 1 and stained with DRAQ5 (Panel A), AlexaFluor488-Vimentin (Panel B), AlexaFluor594-pan-Cytokeratin (Panel C), PE-EpCam (Panel D), Pacific Orange-CD45 (Panel E), and BV421-CD14 (Panel F).

[0090] FIG. 9B shows white blood cells spiked with A549 cells fixed with 4% paraformaldehyde and stained with DRAQ5 (Panel A), AlexaFluor488-Vimentin (Panel B),

AlexaFluor594-pan-Cytokeratin (Panel C), PE-EpCam (Panel D), Pacific Orange-CD45 (Panel E), and BV421-CD14 (Panel F).

[0091] FIG. 10 shows a histogram depicting total RNA content in nanograms of 500,000 fresh cells or cells fixed using paraformaldehyde, methanol, or according to the method described in FIG. 1.

[0092] FIG. 11A shows a microscopy image of a BV421-CD45 stain of a prostate cancer cell sample.

[0093] FIG. 11B shows a microscopy image of a DyLight594-Vimentin stain of a prostate cancer cell sample.

[0094] FIG. 11C shows a microscopy image of identification of a background area and a nuclear area of cells in a prostate cancer cell sample. The nuclear area is stained with DRAQ5.

[0095] FIG. 11D shows a histogram depicting a ploidy status of a cell of interest.

[0096] FIG. 12A shows a microscopy image of a BV421-CD45 stain of a prostate cancer cell sample.

[0097] FIG. 12B shows a microscopy image of a DyLight594-Vimentin stain of a prostate cancer cell sample.

[0098] FIG. 12C shows an analysis of a microscopy image including identification of a background area and a nuclear area of cells in a prostate cancer cell sample. The nuclear area is stained with DRAQ5.

[0099] FIG. 12D shows a histogram depicting a ploidy status of a cell of interest.

[00100] FIG. 13A shows a microscopy image of a BV421-CD14 stain of a prostate cancer cell sample.

[00101] FIG. 13B shows a microscopy image of a Pacific Orange-CD45 stain of a prostate cancer cell sample.

[00102] FIG. 13C shows a microscopy image of a AlexaFluor488-Vimentin stain of a prostate cancer cell sample.

[00103] FIG. 13D shows an analysis of a microscopy image including identification of a background area and a nuclear area of cells in a prostate cancer cell sample. The nuclear area is stained with DRAQ5.

[00104] FIG. 13E shows a histogram depicting a ploidy status of a cell of interest.

[00105] FIG. 14A shows a microscopy image of a BV421-CD14 stain of a prostate cancer cell sample.

[00106] FIG. 14B shows a microscopy image of a Pacific Orange-CD45 stain of a prostate cancer cell sample.

[00107] FIG. 14C shows a microscopy image of a AlexaFluor488-Vimentin stain of a prostate cancer cell sample.

[00108] FIG. 14D shows an analysis of a microscopy image including identification of a background area and a nuclear area of cells in a prostate cancer cell sample. The nuclear area is stained with stained with DRAQ5.

[00109] FIG. 14E shows a histogram depicting a ploidy status of a cell of interest.

[00110] FIG. 15A shows a microscopy image of a AlexaFluor488-CD45 stain of a prostate cancer cell sample.

[00111] FIG. 15B shows a microscopy image of a PE-phosphorylated serine 10 Histone H3 stain of a prostate cancer cell sample.

[00112] FIG. 15C shows a microscopy image of a AlexaFluor488-Vimentin stain of a prostate cancer cell sample.

[00113] FIG. 15D shows an analysis of a microscopy image including identification of a background area and a nuclear area of cells in a prostate cancer cell sample. The nuclear area is stained with DRAQ5.

[00114] FIG. 15E shows a histogram depicting a ploidy status of a cell of interest.

[00115] FIG. 16A shows a microscopy image of a BV421-CD34 stain of a prostate cancer cell sample.

[00116] FIG. 16B shows a microscopy image of a Pacific Orange-CD45 stain of a prostate cancer cell sample.

[00117] FIG. 16C shows a microscopy image of an AlexaFluor488-Vimentin stain of a prostate cancer cell sample.

[00118] FIG. 16D shows an analysis of a microscopy image including identification of a background area and a nuclear area of cells in a prostate cancer cell sample. The nuclear area is stained with stained with DRAQ5.

[00119] FIG. 16E shows a histogram depicting a ploidy status of a cell of interest.

[00120] FIG. 17A shows a microscopy image of a BV421-CD14 stain of a prostate cancer cell sample.

[00121] FIG. 17B shows a microscopy image of a Pacific Orange-CD45 stain of a prostate cancer cell sample.

[00122] FIG. 17C shows a microscopy image of an AlexaFluor488-Vimentin stain of a prostate cancer cell sample.

[00123] FIG. 17D shows an analysis of a microscopy image including identification of a background area and a nuclear area of cells in a prostate cancer cell sample. The nuclear area is stained with DRAQ5.

[00124] FIG. 17E shows a histogram depicting a ploidy status of a cell of interest.

[00125] FIG. 18 illustrates a block diagram of a computer-implemented machine learning system for identifying and classifying a rare cell.

[00126] FIG. 19 illustrates an example training image of a biological sample including cells and non-cells on a background.

[00127] FIG. 20 illustrates an example of the training image of a biological sample including annotated cell types for the region of cells.

[00128] FIG. 21 illustrates an example of the training image of a biological sample including annotated cell subtypes for the cell types.

[00129] FIG. 22 illustrates a flowchart depicting a method for training a computer-implemented machine learning system for identifying and classifying a rare cell.

[00130] FIG. 23 illustrates an image of an unknown biological sample.

[00131] FIG. 24 illustrates a table of cell types and cell subtypes that the exemplary embodiment of the machine learning system identifies and classifies.

[00132] The illustrated embodiments are merely examples and are not intended to limit the disclosure. The schematics are drawn to illustrate features and concepts and are not necessarily drawn to scale.

DETAILED DESCRIPTION

[00133] The foregoing is a summary, and thus, necessarily limited in detail. The above mentioned aspects, as well as other aspects, features, and advantages of the present technology will now be described in connection with various embodiments. The inclusion of the following

embodiments is not intended to limit the disclosure to these embodiments, but rather to enable any person skilled in the art to make and use the contemplated invention(s). Other embodiments may be utilized and modifications may be made without departing from the spirit or scope of the subject matter presented herein. Aspects of the disclosure, as described and illustrated herein, can be arranged, combined, modified, and designed in a variety of different formulations, all of which are explicitly contemplated and form part of this disclosure.

[00134] As used in the description and claims, the singular form “a”, “an” and “the” include both singular and plural references unless the context clearly dictates otherwise. For example, the term “cell” may include, and is contemplated to include, a plurality of cells. At times, the claims and disclosure may include terms such as “a plurality,” “one or more,” or “at least one,” however, the absence of such terms is not intended to mean, and should not be interpreted to mean, that a plurality is not conceived.

[00135] The term “about” or “approximately,” when used before a numerical designation or range (e.g., to define a length or pressure), indicates approximations which may vary by (+) or (-) 5%, 1% or 0.1%. All numerical ranges provided herein are inclusive of the stated start and end numbers. The term “substantially” indicates mostly (i.e., greater than 50%) or essentially all of a substance, composition, or method.

[00136] As used herein, the term “comprising” or “comprises” is intended to mean that the compositions and methods include the recited elements, and may additionally include any other elements. “Consisting essentially of” shall mean that the compositions and methods include the recited elements and exclude other elements of essential significance to the combination for the stated purpose. Thus, a composition or method consisting essentially of the elements as defined herein would not exclude other materials, features, or steps that do not materially affect the basic and novel characteristic(s) of the claimed disclosure. “Consisting of” shall mean that the compositions and methods include the recited elements and exclude anything more than a trivial or inconsequential element or step. Embodiments defined by each of these transitional terms are within the scope of this disclosure.

[00137] In some embodiments, the compositions, methods, and systems described herein are used to fix and/or stain a cell. For example, a cell may include a nucleated cell. In some embodiments, a nucleated cell includes a white blood cell, a precursor of a mature cell, a stem cell,

a bone marrow cell, a circulating tumor cell, a cancer cell, a somatic cell, a germline cell, a cell in suspension, a cell adhered to a surface, a cell in a tissue or tissue section, or any other type of cell.

[00138] In some embodiments, the cell is fixed with one or more fixatives or fixing buffers. A fixing buffer may include a cross-linking fixative, a precipitating fixative, an oxidizing agent, mercurials, and/or picrates. In some embodiments, the fixative is one or more of methanol, ethanol, propanol, any other alcohol, or two or more alcohols mixed together. For example, two alcohols may be mixed in a ratio ranging from 5%:95% first alcohol: second alcohol to 95%:5% first alcohol: second alcohol. In some embodiments, the fixative is acetone alone or in combination with an alcohol. For example, an alcohol and acetone may be mixed in a ratio ranging from 5%:95% acetone: alcohol to 95%:5% acetone: alcohol.

[00139] In some embodiments, the fixative may include a biocompatible moisture preserving agent, hydrophilic polymer, or hygroscopic polymer. For example, the fixative may include glycerol, polyvinylpyrrolidone (PVP), polyethyleneglycol (PEG), dextran, methyl cellulose, polyoxyethylene (POE), gelatin, or any other hygroscopic or hydrophilic polymer.

[00140] In some embodiments, one or more reagents, fixatives, or alcohols are diluted in a diluent, phosphate buffered saline (PBS), saline, water, buffered saline, or any other type of biological buffer. In some embodiments, the pH of the diluent is neutral. In some embodiments, the pH is between 6.5 and 8. In one embodiment, the pH is substantially or about 7. In one embodiment, the pH is substantially or about 7.4.

[00141] In some embodiments, one or more reagents, fixatives, or alcohols are measured by percent weight/volume (w/v), percent volume/volume (v/v), molarity, percent of total volume or weight, ounces, milliliters, milligrams or grams, or any other unit of measure appropriate for the application.

[00142] In some embodiments, a cell may be fixed and/or stained in or on a receptacle. For example, a receptacle may include a test tube, a microtiter plate, a capillary plate, on a slide with or without a coverplate for capillary gap staining, or in any other apparatus or device.

[00143] In some embodiments, the receptacle is uncoated, such that the cell is coupled to the surface of the receptacle. In some embodiments, the receptacle is coated, such that coupling of the cell to the receptacle is facilitated by the coating. For example, the coating may include gelatin, poly-L-lysine, collagen, laminin, entactin, heparin sulfate, and/or proteoglycan. In one such

embodiment, the receptacle is coated with gelatin. The gelatin may include a fixative, for example chrome alum or chromium (III) salt.

[00144] In some embodiments, one or more buffers, fixatives, receptacles, or other components of the invention described herein are sold, commercialized, marketed, advertised, or otherwise packaged individually or bundled together as a reagent system or in a kit. A reagent system or kit may include one or more buffers, fixatives, receptacles for receiving one or more cells, one or more stains, one or more antibodies, and/or any other component for completing all or a portion of the methods described herein.

[00145] Disclosed herein are methods for identifying a rare cell in a cell sample. In some embodiments, the rare cell is a circulating tumor cell (CTC) or a cancer cell. A CTC may include a circulating tumor derived endothelial cell, a tumor-associated macrophage, or other tumor derived or associated cell. The CTC may be identified in a cell sample, for example, but not limited to, a blood sample, a lymph sample, a tissue sample or section, a biopsy sample, or other bodily fluid or tissue sample. The cell sample may include live cells, permeabilized cells, fixed cells, stained cells, or other processed cells types.

COMPOSITIONS

[00146] As described herein, a reagent system or kit for fixing cells includes one or more reagents, buffers, and/or fixatives. A reagent system functions to preserve a cell and/or prepare a cell for staining and/or analysis. In some embodiments, a reagent system includes a first fixing buffer or extracellular fixative. In some embodiments, a reagent system includes a second fixing buffer or an intracellular fixative. In one embodiment, the extracellular fixative and the intracellular fixative are combined into one buffer or reagent. In one embodiment, the extracellular fixative and the intracellular fixative are used separately in succession or substantially simultaneously.

[00147] In some embodiments, a reagent system or kit includes an extracellular fixative. The extracellular fixative functions to fix or preserve an exterior surface or extracellular membrane of a cell. The extracellular fixative includes an alcohol or acetone and a hydrophilic or hygroscopic polymer. Examples of alcohols include: methanol, ethanol, propanol, isopropanol, butanol, and pentanol. Examples of hydrophilic or hygroscopic polymers include: glycerol, PVP, PEG, dextran, methyl cellulose, POE, collagen, and gelatin. In some embodiments, the alcohol in the extracellular

fixative comprises a mixture of two or more alcohols. In some embodiments, the hydrophilic or hygroscopic polymer comprises a mixture of two or more hydrophilic or hygroscopic polymers.

[00148] In some embodiments, the extracellular fixative includes a hydrophilic polymer diluted in alcohol. The hydrophilic polymer functions to preserve moisture in the cell during the fixation process and to improve the integrity of the cell during and after the fixation process. In some embodiments, the extracellular fixative includes at least 3% weight per volume (w/v) of a hydrophilic polymer. In some embodiments, the extracellular fixative includes at least 5% w/v of a hydrophilic polymer. In some embodiments, the extracellular fixative includes 3% to 20% w/v of a hydrophilic polymer. In some embodiments, the extracellular fixative includes 5% to 20% w/v of a hydrophilic polymer. In one embodiment, the extracellular fixative includes 5% w/v of a hydrophilic polymer diluted in an alcohol. In some embodiments, the extracellular fixative includes 1%, 3%, 5%, 10%, 15%, or 20% w/v of a hydrophilic polymer. For example, the hydrophilic polymer may include PVP, glycerol, PEG, or a combination of two or more and the alcohol may include methanol, ethanol, or a combination of both. In some embodiments, the alcohol is replaced with or used in combination with acetone.

[00149] In some embodiments, the extracellular fixative is applied to a cell at a temperature colder than or less than -5°C. In some embodiments, the extracellular fixative is applied to a cell at a temperature less than -10°C. In some embodiments, the extracellular fixative is applied to a cell at a temperature less than or equal to -20°C. In some embodiments, the extracellular fixative is applied to a cell at a temperature of -10°C, -60°C, or any temperature therebetween. In some embodiments, the extracellular fixative is applied to a cell at a temperature including or between -15°C and -30°C. For example, in some embodiments, the extracellular fixative is applied to a cell at a temperature equal to, substantially equal to, or approximately equal to -15°C, -20°C, -25°C, -30°C, -40°C, -50°C, -60°C, -70°C, -80°C, -90°C, -100°C, or -110°C. In one embodiment, the extracellular fixative is applied to a cell at a temperature less than or colder than -15°C. In one embodiment, the extracellular fixative is applied to a cell at a temperature less than or colder than -60°C. In some embodiments, the target temperature or temperature range is achieved by placing the cell or the receptacle comprising the cell on dry ice, in liquid nitrogen, in a freezer tuned to the target temperature, or in a freezing apparatus tuned to the target temperature.

[00150] In some embodiments, a reagent system or kit includes an intracellular fixative. The intracellular fixative functions to fix or preserve an intracellular compartment or an intracellular

region of a cell and to provide a means, path, or hole through which a stain or antibody can reach an intracellular compartment or region of the cell. The intracellular fixative includes: a hydrophilic or hygroscopic polymer; a detergent, emulsifier, or surfactant; and a fixative. Examples of hydrophilic or hygroscopic polymers include: glycerol, PVP, PEG, dextran, methyl cellulose, POE, collagen, and gelatin. In some embodiments, the hydrophilic or hygroscopic polymer comprises a mixture of two or more hydrophilic or hygroscopic polymers. In some embodiments, the detergent is nonionic, ionic (i.e., cationic or anionic), or zwitterionic. Examples of detergents include: saponin, Triton X-100, Triton X-114, Tween-20 (i.e., polysorbate 20), Tween-40, Tween-80, CHAPS, CHAPSO, and sodium dodecyl sulfate (SDS). Examples of fixatives include: ammonium bichromate, chromium potassium sulfate (i.e., chrome alum), chromic acid, chromyl chloride, potassium chromate, potassium bichromate, carbodiimide (i.e., methanediimine), 1-Ethyl-3-(3-dimethylaminopropyl)carbodiimide (EDC), and carboxymethyl cellulose (CMC).

[00151] In some embodiments, the intracellular fixative includes a hydrophilic polymer. In some embodiments, the intracellular fixative includes at least 5% w/v of a hydrophilic polymer diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the intracellular fixative includes at least 10% w/v of a hydrophilic polymer. In some embodiments, the intracellular fixative includes at least 15% w/v of a hydrophilic polymer. In some embodiments, the intracellular fixative includes 5% to 30% w/v of a hydrophilic polymer. In some embodiments, the intracellular fixative includes 10% to 30% w/v of a hydrophilic polymer. In some embodiments, the intracellular fixative includes 15% to 30% w/v of a hydrophilic polymer. In some embodiments, the intracellular fixative includes 8%, 15%, 20%, 25%, or 30% w/v of a hydrophilic polymer. In one embodiment, the intracellular fixative includes 15% w/v of a hydrophilic polymer diluted in saline. For example, the hydrophilic polymer may include PVP, glycerol, PEG, or a combination of two or more.

[00152] In some embodiments, the intracellular fixative includes a detergent. The detergent functions to puncture holes in the extracellular membrane of the cell to provide a path, means, or route for a buffer, an antibody, or a stain to reach an intracellular compartment or region of the cell. The intracellular fixative includes at least 0.01% volume per volume (v/v) of a detergent diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the intracellular fixative includes at least 0.2% v/v of a detergent. In some embodiments, the intracellular fixative includes at least 0.4% v/v of a detergent. In some embodiments, the

intracellular fixative includes 0.01% to 1% v/v of a detergent. In some embodiments, the intracellular fixative includes 0.2% to 0.6% v/v of a detergent. In some embodiments, the intracellular fixative includes 0.4% to 1% v/v of a detergent. In one embodiment, the intracellular fixative includes 0.4% v/v of a detergent diluted in saline. In some embodiments, the intracellular fixative includes 0.1%, 0.2%, 0.4%, 0.5%, 0.6%, 0.7%, 0.8%, 0.9%, or 1% v/v of a detergent. For example, the detergent may include Tween-20, Tween-80, Triton X-100, digitonin, saponin, n-dodecyl- β -D-maltoside, any other detergent, or a combination of two or more detergents.

[00153] In some embodiments, the intracellular fixative further includes a fixative. The fixative functions to fix or preserve an interior or intracellular region or compartment of the cell. The intracellular fixative includes at least 0.005% w/v of a fixative diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the intracellular fixative includes at least 0.008% w/v of a fixative. In some embodiments, the intracellular fixative includes at least 0.01% w/v of a fixative. In some embodiments, the intracellular fixative includes 0.008% to 0.5% w/v of a fixative. In some embodiments, the intracellular fixative includes 0.01% to 0.1% w/v of a fixative. In one embodiment, the intracellular fixative includes 0.01% w/v of a fixative diluted in saline. In some embodiments, the intracellular fixative includes 0.005%, 0.006%, 0.007%, 0.008%, 0.009%, 0.01%, 0.2%, 0.3%, 0.4%, or 0.5% w/v of a fixative. For example, the fixative may include: ammonium bichromate, chromium potassium sulfate (i.e., chrome alum), chromyl chloride, potassium chromate, potassium bichromate, carbodiimide (i.e., methanediimine), EDC, CMC, or a combination of two or more fixatives.

[00154] In some embodiments, the intracellular fixative is applied to a cell at a temperature less than freezing temperature (e.g., less than 0°C). In some embodiments, the intracellular fixative is applied to a cell at a temperature colder than or less than 1°C. In some embodiments, the intracellular fixative is applied to a cell at a temperature including or between 0°C and -10°C. In some embodiments, the intracellular fixative is applied to a cell at a temperature including or between 1°C and -5°C. In one embodiment, the intracellular fixative is applied to a cell at a temperature substantially equal to or about 0°C. In some embodiments, the intracellular fixative is applied to a cell at -5°C, -4°C, -3°C, -2°C, -1°C, 0°C, or 1°C. In some embodiments, the target temperature or temperature range is achieved by placing the cell or the receptacle comprising the cell on ice, on salt ice, in a freezer tuned to the target temperature, or in a chilling apparatus tuned to the target temperature.

[00155] In some embodiments, the hydrophilic polymer used in the extracellular fixative is the same as the hydrophilic polymer used in the intracellular fixative. In some embodiments, the hydrophilic polymer used in the extracellular fixative is different than the hydrophilic polymer used in the intracellular fixative.

[00156] In some embodiments, a reagent system or kit includes a blocking buffer. The blocking buffer functions to block or bind non-specific antibody or stain binding sites on the surface of or in the cell. The blocking buffer includes a hydrophilic polymer, a detergent, and hydrolyzed collagen diluted in saline, water, phosphate buffered saline, or any buffer solution.

[00157] In some embodiments, the blocking buffer includes at least 1% w/v of a hydrophilic polymer diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the blocking buffer includes at least 10% w/v of a hydrophilic polymer. In some embodiments, the blocking buffer includes at least 20% w/v of a hydrophilic polymer. In some embodiments, the blocking buffer includes at least 30% w/v of a hydrophilic polymer. In some embodiments, the blocking buffer includes 1% to 50% w/v of a hydrophilic polymer. In some embodiments, the blocking buffer includes 10% to 45% w/v of a hydrophilic. In some embodiments, the blocking buffer includes 20% to 40% w/v of a hydrophilic polymer. In one embodiment, the blocking buffer includes 30% w/v of a hydrophilic polymer diluted in saline. In some embodiments, the blocking buffer includes 5%, 10%, 15%, 20%, 25%, 30%, 35%, 40%, 45%, or 50% w/v of a hydrophilic polymer. For example, the hydrophilic polymer may include PVP, glycerol, PEG, or a combination of two or more.

[00158] In some embodiments, the blocking buffer includes a detergent. In some embodiments, the blocking buffer includes at least 0.01% v/v of a detergent diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the blocking buffer includes at least 0.2% v/v of a detergent. In some embodiments, the blocking buffer includes at least 0.4% v/v of a detergent. In some embodiments, the blocking buffer includes 0.01% to 1% v/v of a detergent. In some embodiments, the blocking buffer includes 0.2% to 0.6% v/v of a detergent. In some embodiments, the blocking buffer includes 0.4% to 1% v/v of a detergent. In one embodiment, the blocking buffer includes 0.4% v/v of a detergent diluted in saline. In some embodiments, the blocking buffer includes 0.01%, 0.1%, 0.2%, 0.3%, 0.4%, 0.5%, 0.6%, 0.7%, 0.8%, 0.9%, or 1% v/v of a detergent. For example, the detergent may include Tween-20, Tween-

80, Triton X-100, digitonin, saponin, n-dodecyl- β -D-maltoside, any other detergent, or a combination of two or more detergents.

[00159] In some embodiments, the blocking buffer includes hydrolyzed collagen. The hydrolyzed collagen functions as a protein with affinity for or capable of binding non-specific antibody or stain binding sites on an extracellular surface of a cell or intracellularly. In some embodiments, the blocking buffer includes at least 0.1% w/v hydrolyzed collagen. In some embodiments, the blocking buffer includes at least 0.5% w/v hydrolyzed collagen. In some embodiments, the blocking buffer includes at least 1% w/v hydrolyzed collagen. In some embodiments, the blocking buffer includes at least 2% w/v hydrolyzed collagen. In some embodiments, the blocking buffer includes 0.1% to 10% w/v hydrolyzed collagen. In some embodiments, the blocking buffer includes 0.5% to 5% w/v hydrolyzed collagen. In some embodiments, the blocking buffer includes 1% to 3% w/v hydrolyzed collagen. In one embodiment, the blocking buffer includes 2% w/v hydrolyzed collagen diluted in saline. In some embodiments, the blocking buffer includes 0.1%, 0.2%, 0.3%, 0.4%, 0.5%, 0.6%, 0.7%, 0.8%, 0.9%, 1%, 1.25%, 1.5%, 1.75%, 2%, 2.25%, 2.5%, 2.75%, or 3% w/v of hydrolyzed collagen. In some embodiments, the hydrolyzed collagen is derived from an animal source. In one embodiment, the hydrolyzed collagen is pig or porcine-derived. In one embodiment, the hydrolyzed collagen is cow or bovine-derived. In one embodiment, the hydrolyzed collagen is fish-derived.

[00160] In some embodiments, the blocking buffer includes glycine. Glycine functions to bind free aldehyde groups in proteins that would otherwise bind antibodies or stain resulting in increased background or artifacts. In some embodiments, the blocking buffer includes at least 0.01M glycine. In some embodiments, the blocking buffer includes at least 0.1M glycine. In some embodiments, the blocking buffer includes at least 0.3M glycine. In some embodiments, the blocking buffer includes 0.01M to 1M glycine. In some embodiments, the blocking buffer includes 0.1M to 0.5M glycine. In one embodiment, the blocking buffer includes 0.3M glycine. In some embodiments, the blocking buffer includes 0.01M, 0.05M, 0.1M, 0.15M, 0.2M, 0.25M, 0.3M, 0.35M, 0.4M, 0.45M, or 0.5M glycine.

[00161] In some embodiments, a reagent system or kit includes a cytocentrifugation buffer. The cytocentrifugation buffer functions to protect the cell and/or provide a vehicle through which the cell is applied to a receptacle, for example using a cytocentrifuge. The cytocentrifugation buffer

includes a hydrophilic polymer and a fixative diluted in saline, water, phosphate buffered saline, or any buffer solution.

[00162] In some embodiments, the cytoentrifugation buffer includes at least 3% w/v of a hydrophilic polymer. In some embodiments, the cytoentrifugation buffer includes at least 5% w/v of a hydrophilic polymer. In some embodiments, the cytoentrifugation buffer includes at least 10% w/v of a hydrophilic polymer. In some embodiments, the cytoentrifugation buffer includes 1% to 20% w/v of a hydrophilic polymer. In some embodiments, the cytoentrifugation buffer includes 5% to 15% w/v of a hydrophilic polymer. In one embodiment, the cytoentrifugation buffer includes 10% w/v of a hydrophilic polymer diluted in saline. In some embodiments, the cytoentrifugation buffer includes 1%, 3%, 5%, 7%, 9%, 10%, 12%, 15%, 17%, or 20% w/v of a hydrophilic polymer.

[00163] In some embodiments, the cytoentrifugation buffer includes at least 0.005% w/v of a fixative diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the cytoentrifugation buffer includes at least 0.008% w/v of a fixative. In some embodiments, the cytoentrifugation buffer includes at least 0.01% w/v of a fixative. In some embodiments, cytoentrifugation buffer includes 0.008% to 0.5% w/v of a fixative. In some embodiments, the cytoentrifugation buffer includes 0.01% to 0.1% w/v of a fixative. In one embodiment, the cytoentrifugation buffer includes 0.01% w/v of a fixative diluted in saline. In some embodiments, the cytoentrifugation buffer includes 0.0005%, 0.008%, 0.01%, 0.05%, 0.2%, 0.25%, 0.3%, 0.35%, 0.4%, 0.45%, or 0.5% w/v of a fixative. For example, the fixative may include: ammonium bichromate, chromium potassium sulfate (i.e., chrome alum), chromyl chloride, potassium chromate, potassium bichromate, carbodiimide (i.e., methanediimine), EDC, and CMC.

[00164] In some embodiments, a reagent system or kit includes an antibody binding buffer. The antibody binding buffer functions to improve or promote antibody or stain binding to an extracellular or intracellular surface of a cell. The antibody binding buffer includes a hydrophilic polymer and a detergent.

[00165] In some embodiments, the antibody binding buffer includes at least 5% w/v of a hydrophilic polymer diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the antibody binding buffer includes at least 10% w/v of a hydrophilic polymer. In some embodiments, the antibody binding buffer includes at least 15% w/v of a

hydrophilic polymer. In some embodiments, the antibody binding buffer includes 5% to 30% w/v of a hydrophilic polymer. In some embodiments, the antibody binding buffer includes 10% to 30% w/v of a hydrophilic polymer. In some embodiments, the antibody binding buffer includes 15% to 30% w/v of a hydrophilic polymer. In one embodiment, the antibody binding buffer includes 15% w/v of a hydrophilic polymer diluted in saline. In some embodiments, the antibody binding buffer includes 5%, 10%, 15%, 20%, 25%, 30%, 35%, or 40% w/v of a hydrophilic polymer. For example, the hydrophilic polymer may include PVP, glycerol, PEG, or a combination of two or more.

[00166] In some embodiments, the antibody binding buffer includes a detergent. In some embodiments, the antibody binding buffer includes at least 0.01% v/v of a detergent diluted in saline, water, phosphate buffered saline, or any buffer solution. In some embodiments, the antibody binding buffer includes at least 0.2% v/v of a detergent. In some embodiments, the antibody binding buffer includes at least 0.4% v/v of a detergent. In some embodiments, the antibody binding buffer includes 0.01% to 1% v/v of a detergent. In some embodiments, the antibody binding buffer includes 0.2% to 0.6% v/v of a detergent. In some embodiments, the antibody binding buffer includes 0.4% to 1% v/v of a detergent. In one embodiment, the antibody binding buffer includes 0.4% v/v of a detergent diluted in saline. In some embodiments, the antibody binding buffer includes, 0.01%, 0.1%, 0.2%, 0.3%, 0.4%, 0.5%, 0.6%, 0.7%, 0.8%, 0.9%, or 1% v/v of a detergent. For example, the detergent may include Tween-20, Tween-80, Triton X-100, digitonin, saponin, n-dodecyl- β -D-maltoside, any other detergent, or a combination of two or more detergents.

[00167] In some embodiments, a reagent system or kit includes one or more receptacles, for example a slide, for fixing, staining, viewing, and/or analyzing a cell. The one or more receptacles may be coated with gelatin, collagen, or another cell-binding reagent to improve or promote adherence of the cell to a surface of the receptacle. Examples of gelatin include: Type A (i.e., derived from acid-cured tissue) and Type B (i.e., derived from lime-cured tissue). In some embodiments, the gelatin includes a cationic reagent. Examples of cationic reagents include: chromium potassium sulfate dodecahydrate, ammonium bichromate, chromium potassium sulfate (i.e., chrome alum), chromyl chloride, potassium chromate, potassium bichromate, carbodiimide (i.e., methanediimine), EDC, and CMC. The cationic reagent functions to positively charge the

receptacle to improve attraction and adherence of negatively charged cells and/or tissue sections to the receptacle.

[00168] In some embodiments, a reagent system or kit includes a receptacle cleaning buffer. The receptacle cleaning buffer functions to remove debris and/or autofluorescent particles from one or more surfaces of the receptacle. In some embodiments, the receptacle cleaning buffer includes a ratio of alcohol to acid. Examples of alcohols include: methanol, ethanol, propanol, isopropanol, butanol, and pentanol. Examples of acids include: hydrochloric acid, acetic acid, hydrofluoric acid, hydrobromic acid, and hydroiodic acid. In some embodiments, the ratio of alcohol to acid is 5%:95%; 10%:90%; 15%:85%; 20%:80%; 25%:75%; 30%:70%; 35%:65%; 40%:60%; 45%:55%; 50%:50%; 55%:45%; 60%:40%; 65%:35%; 70%:30%; 75%:25%; 80%:20%; 85%:15%; 90%:10%; or 95%:5%. In one embodiment, the ratio of alcohol to acid is 50%:50%. In one embodiment, the ratio of alcohol to acid is 40%:60%. In one embodiment, the ratio of alcohol to acid is 60%:40%.

METHODS

[00169] As shown in FIG. 1, a method 100 for fixing a cell includes: applying a first fixing buffer to the cell, the first fixing buffer including a hydrophilic polymer diluted in alcohol S110; and applying a second fixing buffer to the cell, the second fixing buffer including a hydrophilic polymer, detergent, and hydrolyzed collagen S120. The method functions to fix or preserve a cell for staining, viewing, and/or analysis.

[00170] In some embodiments, applying a first fixing buffer to the cell, as recited at S120, involves applying the first fixing buffer or extracellular fixative to the cell at a temperature colder than or less than -5°C. In some embodiments, the first fixing buffer or extracellular fixative is applied to the cell at a temperature less than -10°C. In some embodiments, the extracellular fixative is applied to the cell at a temperature less than -15°C. In some embodiments, the extracellular fixative is applied to the cell at a temperature less than -20°C. In some embodiments, the extracellular fixative is applied to the cell at a temperature less than -30°C. In some embodiments, the extracellular fixative is applied to the cell at a temperature less than -40°C. In some embodiments, the extracellular fixative is applied to the cell at a temperature less than -50°C. In some embodiments, the extracellular fixative is applied to the cell at a temperature less than -60°C. The sub-freezing temperature in combination with the hydrophilic polymer functions to preserve the integrity of the cell and reduce artifacts or autofluorescent features associated with the cell. In

some embodiments, block S120 includes incubating the cell with the extracellular fixative. In some embodiments, the incubation period is at least five minutes. In some embodiments, the incubation period is at least ten minutes. In some embodiments, the incubation period is at least fifteen minutes. In one embodiment, the incubation period is fifteen minutes. In some embodiments, the incubation period is between five minutes and thirty minutes.

[00171] At block S130, applying a second fixing buffer to the cell may include applying the second fixing buffer or intracellular fixative to the cell at a temperature colder than or less than 4°C. In some embodiments, the intracellular fixative is applied to the cell at a temperature less than 1°C. In some embodiments, the intracellular fixative is applied to the cell at a temperature less than 0°C. In some embodiments, the intracellular fixative is applied to the cell at a temperature less than -2°C. The freezing temperature in combination with the hydrophilic polymer functions to preserve the integrity of the cell and reduce artifacts or autofluorescent features associated with the cell. In some embodiments, block S130 includes incubating the cell in the intracellular fixative. In some embodiments, the incubation period is at least twenty minutes. In some embodiments, the incubation period is at least thirty minutes. In some embodiments, the incubation period is at least sixty minutes. In some embodiments, the incubation period is at least 120 minutes. In some embodiments, the incubation period is at least 180 minutes. In some embodiments, the incubation period is at least 240 minutes. In one embodiment, the incubation period is thirty minutes. In some embodiments, the incubation period is between fifteen minutes and 300 minutes.

[00172] In some embodiments, the method 100 optionally includes block S110, which recites cytocentrifuging a cell onto a slide. Block S110 functions to couple or adhere the cell to a receptacle for further processing and/or analysis. The slide or receptacle may be coated with a substance or reagent, for example a cationic substance, collagen, or gelatin. In some embodiments, block S110 includes cleaning the receptacle or slide prior to cytocentrifuging the cell onto the slide or receptacle. The slide or receptacle may be cleaned with a receptacle cleaning buffer, as described elsewhere herein. In some embodiments, block S110 includes suspending the cell in a cytocentrifugation buffer, as described elsewhere herein, before cytocentrifugation. In some embodiments, block S110 includes allowing the receptacle or slide to dry after cytocentrifugation to remove excess cytocentrifugation buffer from the surface of the receptacle or slide.

[00173] In some embodiments, the method 100 optionally includes block S140, which recites applying a blocking buffer to the cell, the blocking buffer, as described elsewhere herein,

including a hydrophilic polymer, detergent, and hydrolyzed collagen. Block S140 functions to reduce non-specific antibody or stain binding by saturating non-specific binding sites with an irrelevant protein (e.g., hydrolyzed collagen). In some embodiments, block S140 includes incubating the cell with the blocking buffer for a defined time period at a defined temperature. In some embodiments, the time period is at least thirty minutes. In some embodiments, the time period is at least forty-five minutes. In some embodiments, the time period is at least sixty minutes. In some embodiments, the time period is thirty to ninety minutes. In some embodiments, the time period is forty-five to seventy-five minutes. In one embodiment, the time period is sixty minutes. In some embodiments, the defined temperature is colder than 5°C. In some embodiments, the defined temperature is colder than 4°C. In some embodiments, the defined temperature is colder than 2°C. In some embodiments, the defined temperature is colder than 0°C. In some embodiments, the defined temperature range is -5°C to 5°C. In some embodiments, the defined temperature range is 0°C to 4°C. In one embodiment, the defined temperature is about or substantially -2°C.

[00174] In some embodiments, the method 100 optionally includes block S150, which recites staining the cell. Block S150 functions to highlight or contrast different features or regions of the cell. In some embodiments, staining includes: immunofluorescence staining, immunohistochemistry, in situ hybridization, or any other staining technique. In some embodiments, staining includes tagging a cell with an unlabeled or protein-conjugated (e.g., biotin) primary antibody that recognizes a protein or nucleic acid of interest and labeling the primary antibody with a labeled (e.g., fluorophore) or enzymatically-active (e.g., streptavidin) secondary antibody that recognizes the primary antibody. In some embodiments, staining includes labeling the cell with a labeled primary antibody that recognizes a protein or nucleic acid of interest. The label may include: a fluorophore, an enzyme (e.g., streptavidin, horseradish peroxidase, etc.), a bioluminescent molecule, or any other type of label that can be visualized microscopically. In some embodiments, staining the cell occurs at a temperature of less than 0°C. In some embodiments, staining the cell occurs at a temperature of less than -1°C. In some embodiments, staining the cell occurs at a temperature of less than -2°C. In some embodiments, staining the cell occurs at a temperature of less than -3°C. In some embodiments, staining the cell occurs at substantially -2°C, -3°C, or a temperature there between.

[00175] As shown in FIG. 2, a method 200 of identifying a cell as a circulating tumor cell of one embodiment includes imaging a cell sample to identify a cell of interest in block S210;

determining a first pixel intensity of a stained nuclear area in block S220; determining a second pixel intensity of a background area in block S230; calculating a ploidy status of the cell of interest by subtracting the second pixel intensity from the first pixel intensity in block S240; and determining whether the cell of interest is a circulating tumor cell based on the ploidy status in block S250. The method functions to determine a pixel intensity or fluorescence intensity of a stained area in order to determine if the cell is euploidic, aneuploidic, hyperploidic, hypoploidic, or otherwise has an abnormal DNA content. In some embodiments, the method functions to identify a circulating tumor cell in a cell sample. The method is used in the cancer biology field but can additionally or alternatively be used in microscopy, cellular analysis, cell cycle studies or for any other suitable applications, for example investigational or teaching applications.

[00176] As shown in FIG. 2, one embodiment of a method 200 of identifying a cell as a circulating tumor cell includes block S210, which recites imaging a cell sample to identify a cell of interest. Block S210 functions to microscopically view one or more cells in a cell sample in order to process the image to identify a cell of interest. In some embodiments, the method includes staining the cell sample with one or more stains, antibodies, DNA-incorporating dyes, either directly or indirectly (e.g., using secondary antibodies), and either or both intracellularly or extracellularly. Staining the cell sample may include highlighting one or more markers of interest on a cell of interest or highlighting one or more cells for exclusion from the analysis. In one such embodiment, the method includes staining the cell sample with a nuclear stain to identify a stained nuclear area of the cell of interest. Non-limiting examples of nuclear stains include: DRAQ5, propidium iodide (PI), 4',6-diamidino-2-phenylindole (DAPI); hematoxylin; Kernechtrot dye; Hoechst; methyl green, other nuclear dye exhibiting stoichiometric DNA binding, or any combination thereof. Further in some embodiments, identifying a cell of interest includes identifying a CD45 negative cell, a Vimentin positive cell, an EpCAM positive cell, an EpCAM negative cell, a phosphorylated serine 10 Histone H3 negative cell, a nuclear proliferation marker negative cell, a Ki-67 negative cell, a Caspase 3 negative cell, an apoptosis marker negative cell, a CD14 negative cell, a CD34 positive cell, a CD34 negative cell, or any combination thereof. In some embodiments, the method includes excluding one or more apoptotic, necrotic, mitotic, or other cells, for example undergoing a normal or healthy process of cellular death or DNA multiplication or one or more cells not exhibiting other markers indicative of cancer or cancerous transformation.

[00177] As shown in FIG. 2, one embodiment of a method 200 of identifying a cell as a circulating tumor cell includes block S220, which recites determining a first pixel intensity of a stained nuclear area. Block S220 functions to manually or automatically identify a stained nuclear area and determine a pixel intensity of said stained nuclear area. In some embodiments, the method includes identifying a first perimeter of a stained nuclear area (i.e., a nuclear perimeter), such that the first pixel intensity is derived by measuring a pixel intensity of an area contained by the perimeter. In some such embodiments, the method includes multiplying the area defined by the nuclear perimeter by the first pixel intensity. In some embodiments, the method includes identifying a second perimeter, said second perimeter identifying a cell membrane of a cell (i.e., membrane perimeter), for example to determine a cell size. In one such embodiment, the method includes comparing the first perimeter to the second perimeter to determine a nuclear area, cytoplasmic area, a total cell area, or ratio therebetween.

[00178] As shown in FIG. 2, one embodiment of a method 200 of identifying a cell as a circulating tumor cell includes block S230, which recites determining a second pixel intensity of a background area. Block S230 functions to manually or automatically identify a background area and determine a pixel intensity of said background area. In some embodiments, the background area comprises a plurality of background areas. In some embodiments, the method includes defining a background area, said background area being devoid of cells or other cellular matter, but may include non-specific staining or background staining. Further, the method may include defining a perimeter around the background area, said perimeter being called a background perimeter. As such, the method may include multiplying an area defined by the background perimeter by the second pixel intensity of the background area.

[00179] As shown in FIG. 2, one embodiment of a method 200 of identifying a cell as a circulating tumor cell includes block S240, which recites calculating a ploidy status of the cell of interest by subtracting the second pixel intensity from the first pixel intensity. Block S240 functions to remove non-specific or background staining pixel intensity from the first pixel intensity by subtracting the second pixel intensity derived from the background from the first pixel intensity. In some embodiments, the ploidy status is one or substantially one, indicating normal or a healthy amount of DNA. In some embodiments, the ploidy status is less than one, indicating an apoptotic or necrotic cell or a cancerous cell that includes an abnormally low amount of DNA. In some embodiments, the ploidy status is greater than two, indicating a cancerous cell that includes

an abnormally high amount of DNA. In some embodiments, the ploidy status is between one and two or is exactly two. In some such embodiments, if the cell is negative for a proliferation or mitosis marker, the cell is likely a cancerous cell that includes an abnormally high amount of DNA. Alternatively, in some such embodiments, if the cell is positive for a proliferation or mitosis marker, the cell is likely a cell progressing through mitosis. In some embodiments, the method includes reducing a likelihood that the cell is apoptotic or necrotic by counterstaining the cell with an apoptosis marker, for example Caspase 3. In some embodiments, the method includes reducing a likelihood that the cell is mitotic by counterstaining the cell with a proliferation or mitosis marker, for example Ki-67 or phosphorylated serine 10 Histone H3.

[00180] As shown in FIG. 2, one embodiment of a method 200 of identifying a cell as a circulating tumor cell includes block S250, which recites determining whether the cell of interest is a circulating tumor cell based on the ploidy status. In some embodiments, the method includes identifying the cell of interest as a circulating tumor cell if the ploidy status is less than one. In some embodiments, the method includes identifying the cell of interest as a circulating tumor cell if the ploidy status is greater than two. In some embodiments, the method includes identifying the cell of interest as a circulating tumor cell if the cell is negative for a proliferation or mitosis marker and if the cell has a ploidy status between one and two.

[00181] In some embodiments, the method includes fixing the cell sample or the cell of interest using the compositions and methods described elsewhere herein.

[00182] In some embodiments, the method includes processing or lysing the cell of interest to extract DNA, RNA, or protein. In some embodiments, the method includes processing or analyzing the cell to identify a tissue, cancer, tumor, location, environment, or lineage of origin.

[00183] In some embodiments, the method includes diagnosing a patient with a condition based on an identity of the cell of interest.

[00184] As shown in FIG. 3, a computer-implemented method 300 of identifying a cell as a circulating tumor cell of one embodiment includes acquiring an image of a cell of interest in block S310; identifying a feature associated with the cell of interest, such that the feature comprises a nuclear region or marker, a cytoplasmic region or marker, a membrane region or marker, a cellular region or marker, or a combination thereof in block S320; processing the feature to extract a parameter of interest, such that the parameter of interest comprises a fluorescence intensity, a cell size, a cell shape, a cellular area, a cytoplasmic area, a nuclear area, or a combination thereof

in block S330; analyzing the parameter of interest in block S340; and when the parameter of interest is greater than or less than a pre-determined threshold, classifying the cell of interest as a circulating tumor cell in block S350. The method functions to automatically identify a cell of interest in a cell sample as being euploidic, aneuploidic, hyperploidic, hypoploidic, or otherwise having an abnormal DNA content. In some embodiments, the method functions to identify a circulating tumor cell in a cell sample. The method is used in the cancer biology field but can additionally or alternatively be used in microscopy, cellular analysis, cell cycle studies or for any other suitable applications, for example investigational or teaching applications.

[00185] As shown in FIG. 3, one embodiment of a computer-implemented method 300 of identifying a cell as a circulating tumor cell includes block S310, which recites acquiring an image of a cell of interest. Non-limiting examples of types of images include: microscopy images, confocal images, fluorescence images, flow cytometry images, or another type of image.

[00186] As shown in FIG. 3, one embodiment of a computer-implemented method 300 of identifying a cell as a circulating tumor cell includes block S320, which recites identifying a feature associated with the cell of interest, such that the feature comprises a nuclear region or marker, a cytoplasmic region or marker, a membrane region or marker, a cellular region or marker, or a combination thereof. In some embodiments, the feature is identified based on the absence of or negative staining of a cellular region or marker or other cellular characteristic; in other embodiments, the feature is identified based on the presence of or positive staining of a cellular marker or other cellular characteristic. In some embodiments, identifying a feature includes measuring a pixel intensity; determining a location of staining; identifying a nuclear region, for example based on staining or location; identifying a cytoplasmic region, for example based on staining or location; processing the image to reduce noise or enhance contrast; or other method or process. In some embodiments, identifying a feature includes using image recognition.

[00187] As shown in FIG. 3, one embodiment of a computer-implemented method 300 of identifying a cell as a circulating tumor cell includes block S330, which recites processing the feature to extract a parameter of interest, such that the parameter of interest comprises a fluorescence intensity, a cell size, a cell shape, a cellular area, a cytoplasmic area, a nuclear area, or a combination thereof. In some embodiments, the feature is the nuclear region and the parameter of interest is the fluorescence intensity of the nuclear region. In some such embodiments, processing includes subtracting a background fluorescence or pixel intensity from the nuclear

fluorescence or pixel intensity. Further, in some embodiments, processing includes calculating an area of the nuclear region, for example, to multiply the area by the pixel intensity to calculate an integrated fluorescence density of the nuclear region. In some embodiments, processing includes comparing the first pixel intensity of a first nuclear region in a first cell to a second pixel intensity of a second nuclear region of a second cell, for example to normalize staining intensity across cells or to identify one or more outliers indicative of a rare cell, for example a circulating tumor cell. In some embodiments, the method includes processing the image to improve a signal-to-noise quality of the image. Non-limiting examples of processing include: adjusting a gain; adjusting an offset; averaging a plurality of scans of each pixel to determine an intensity of the pixel; or any other method.

[00188] As shown in FIG. 3, one embodiment of a computer-implemented method 300 of identifying a cell as a circulating tumor cell includes block S340, which recites analyzing the parameter of interest. In some embodiments, analyzing is performed using a machine-learning technique. In some such embodiments, the machine learning technique comprises: Classification Trees, Discriminant Analysis, k-Nearest Neighbors, Naive Bayes, Support Vector Machines, deep learning, or convolutional neural network. In one embodiment, the machine learning technique comprises deep learning. In another embodiment, the machine learning technique comprises convolutional neural network. In some embodiments, the result of the analysis is fed back into the system, for example using a feedback loop, so that the system improves its ability to identify features and/or to process said features to extract parameters of interest. In some embodiments, the analysis is supervised by a user, so that the user can, for example identify false positives or negatives to increase an accuracy of the analysis of the features and parameters of interest.

[00189] As shown in FIG. 3, one embodiment of a computer-implemented method 300 of identifying a cell as a circulating tumor cell includes block S350, which recites when the parameter of interest is greater than or less than a pre-determined threshold, classifying the cell of interest as a circulating tumor cell. In some embodiments, the cell of interest is classified as the circulating tumor cell when the parameter of interest is greater than two, indicating an abnormally high DNA content. In some embodiments, the cell of interest is classified as the circulating tumor cell when the parameter of interest is less than one, indicating an abnormally low DNA content. In some embodiments, when the cell of interest is negative for a proliferation marker and the parameter of interest is between one and two, the cell of interest is classified as the circulating tumor cell. In

some embodiments, the method includes excluding mitotic cells by excluding cells in the sample that are positive for proliferation and/or mitosis markers. In some embodiments, the method includes excluding apoptotic or necrotic cells, for example by excluding cells in the sample that are positive for apoptosis and/or necrosis makers.

[00190] In some embodiments, the method includes calculating a confidence score for the classification of the cell of interest or a probability that the cell of interest is a circulating tumor cell.

DEVICES

[00191] In some embodiments, the methods described herein can be embodied and/or implemented at least in part as a machine configured to receive a computer-readable medium storing computer-readable instructions. The instructions may be executed by computer-executable components integrated with the system and one or more portions of the processor on a computing device configured with an application comprising computer readable instructions for execution by a processor. The computer-readable medium can be stored on any suitable computer-readable media such as RAMs, ROMs, flash memory, EEPROMs, optical devices (e.g., CD or DVD), hard drives, floppy drives, or any suitable device. The computer-executable component may be a general or application-specific processor, digital signal processor, or other programmable logic device, but any suitable dedicated hardware or hardware/firmware combination can alternatively or additionally execute the instructions.

[00192] In some embodiments, the methods described herein may be performed manually; in some embodiments, the methods described herein may be performed partially or wholly automatically, for example by a computing device 2000. A computing device 2000 may be a stationary or mobile computing device. Non-limiting examples of stationary computing devices include: a workstation, desktop, or any other non-portable computing device. Non-limiting examples of mobile computing devices include: a laptop, a netbook, a notebook, a mobile phone, a wearable device, or any other suitable mobile computing device. In some embodiments, as shown in FIG. 4, a computing device 2000 for identifying a cell as a circulating tumor cell includes a processor 2010, memory 2020, and optionally one or more applications 2030 stored in memory 2020. The processor 2010 is connected to the memory 2020 via one or more data buses. The processor 2010 functions to read information from and write information to memory 2020. The memory 2020 may be any type of computer-readable medium that stores computer-readable

instructions for execution by the processor. Non-limiting examples of computer-readable medium include: RAM, ROM, flash memory, EEPROM, a hard disk drive, a solid state drive, or any other suitable device. In some embodiments, the computer-readable instructions include software stored in a non-transitory format. In some embodiments, the computer-readable instructions may be programmed into the memory 2020 or downloaded as an application 2030 onto the memory 2020. The processor 2010 may execute one or more sets of instructions to effect the functioning of the computer, for example to run an operating system, to run one or more applications, or to perform a method of identifying a cell as a circulating tumor cell. Some such methods are described in more detail elsewhere herein.

[00193] In some embodiments, as shown in FIG. 4, the computing device 2000 includes a graphical user interface (GUI) 2040. In some such embodiments, the GUI 2040 may display one or more cells or a population of cells that are analyzed by the processor 2010 to identify any one or more of the cells as a circulating tumor cell. Alternatively or additionally, the GUI 2040 may include one or more controls to alter one or more parameters, the functioning of the software, or a GUI appearance. In some embodiments, the GUI 2040 includes touch responsive capabilities such that it comprises, for example, a Thin Film Transistor liquid crystal display (LCD), an in-place switching LCD, a resistive touchscreen LCD, a capacitive touchscreen LCD, an organic light emitting diode (LED), an Active-Matrix organic LED (AMOLED), a Super AMOLED, a Retina display, a Haptic/Tactile touchscreen, Gorilla Glass, or Quantum Dot Display.

[00194] In some embodiments, as shown in FIG. 4, the computing device 2000 includes a power source 2050. The power source 2050 may power the computing device 2000 via alternating current from an outlet. Alternatively, the power source 2050 may include a battery, for example a rechargeable battery (e.g., lithium ion).

[00195] In some embodiments, the computing device 2000 includes an integrated circuit 2060. In some such embodiments, the integrated circuit may include an operational amplifier, a low-pass, high-pass, or band-pass filter, an analog-to-digital (AD) converter, and/or other signal processing circuit components configured to filter, amplify, digitize, or otherwise process an image of a cell to extract one or more pixel intensities or one or more parameters of interest, as described elsewhere herein.

FIXING AND STAINING - EXAMPLES

[00196] The following are examples of use of the methods described elsewhere herein for fixing and staining cells and identifying a circulating tumor cell in a cell sample. The samples were prepared according to the methods and compositions described elsewhere herein. Although specific examples are used, it will be appreciated by one of skill in the art that the methods described herein may be used in examples beyond what is presented herein.

[00197] *Experiment setup.* Peripheral venous blood was drawn from healthy volunteers. Red blood cells were lysed using ammonium chloride lysing buffer. White blood cells were washed twice in PBS. The cancer cell line A549 was grown in RPMI with 10% FBS at 5% CO₂ in T75 cell culture flasks. Cells were harvested with trypsin/EDTA.

[00198] For each experiment unless otherwise indicated, 20,000 cancer cells were spiked into 200,000 white blood cells. Cells were then resuspended in variations of cytocentrifugation buffer as indicated. Gelatin-coated glass slides were mounted into Cytofuge II chambers and spun for ten minutes at 600rpm in a Mediate CytofugeII (Germany). Chambers were then removed from the Cytofuge, and slides unmounted. Care was taken not to let slides with deposited cells dry up entirely. Slides were then incubated in variations of the extracellular fixing buffer as indicated. After thirty minutes, slides were removed, excess liquid briefly blotted onto filter paper while holding slides upright, and immersed in variations of the intracellular fixing buffer as indicated. After another sixty minutes, slides were removed from the intracellular fixing buffer, mounted onto Coverplates (ThermoFisher) and blocked and stained as indicated.

FIXING AND STAINING - EXAMPLE 1

[00199] *Cytocentrifugation Buffer.* The amount of hydrophilic polymer (e.g., PVP) in the cytocentrifugation buffer was varied while the fixing and staining methods remained constant. As shown in FIGS. 5A, 5B, and 5D, the cytocentrifugation buffer includes 0%, 1%, or 20% PVP, respectively. All conditions included a fixed amount of fixative in the cytocentrifugation buffer: 0.01% w/v chromium potassium sulfate. As shown in FIGS. 5A, 5B, and 5D, the cells appear irregular with disrupted extracellular membranes, extracellular membrane blebbing (i.e., bulge, or protrusion of the plasma membrane of a cell), and staining artifacts appearing intracellularly. In contrast, as shown in FIG. 5C, when the cytocentrifugation buffer includes 10% PVP, the cells appear spherical and intact with minimal extracellular membrane disruption or blebbing.

FIXING AND STAINING - EXAMPLE 2

[00200] *Extracellular Fixative.* The amount of hydrophilic polymer in the extracellular fixative and the temperature at which the cells were fixed with the extracellular fixative were varied while the intracellular fixative, cytocentrifugation buffer, and staining methods remained constant. As shown in FIGS. 6A, 6C, 6E, and 6G, a temperature of -10°C was used during fixation of the cells with the extracellular fixative. As shown in FIGS. 6B, 6D, 6F, and 6H, the cells were fixed with the extracellular fixative while on dry ice (e.g., substantially or about -60°C to -110°C). As shown in FIG. 6F, cells fixed on dry ice in 5% w/v hydrophilic polymer (e.g., PVP) diluted in methanol have improved integrity, reduced artifacts, and enhanced staining, as compared to cells fixed with an extracellular fixative comprising less (FIGS. 6A-6D) or more (FIG. 6G-6H) hydrophilic polymer or cells fixed at -10°C (FIGS. 6A, 6C, 6E, and 6G) instead of on dry ice (FIGS. 6B, 6D, 6F, and 6H).

FIXING AND STAINING - EXAMPLE 3

[00201] *Intracellular Fixative.* The amount of hydrophilic polymer (e.g., glycerol) in the intracellular fixative and the temperature at which the cells were fixed with the intracellular fixative were varied while the extracellular fixative, cytocentrifugation buffer, and staining methods remained constant. As shown in FIGS. 7A-7D, there was a fixed amount of detergent and chromium potassium sulfate in the intracellular fixative: 0.4% v/v Tween20 and 0.01% w/v chromium potassium sulfate. As shown in FIG. 7A, when cells are fixed at room temperature, most of the cells are lost and the few remaining cells have reduced integrity, increased degradation, and increased artifacts. As shown in FIG. 7B, when the cells are fixed at substantially or about -2°C, the cells have an intact extracellular membrane, reduced artifacts, and improved staining. As shown in FIGS. 7A and 7B, a freezing (e.g., about 0°C) or slightly sub-freezing temperature (e.g., -1°C to -4°C) is advantageous during fixation with the intracellular fixative to prevent cell loss (e.g., to apoptosis, cell death, etc.) and to improve and/or maintain cell integrity. As shown in FIG. 7C and 7D, higher concentrations of glycerol improve cellular morphology. As shown in FIGS. 7E and 7F, the amount of fixative (e.g., chromium potassium sulfate) was varied and the amount of hydrophilic polymer and detergent were fixed: 15% v/v glycerol and 0.4% v/v Tween20. As shown in FIG. 7E, omitting chromium potassium results in cell loss and worse preservation of cellular morphology. As shown in FIG. 7F, 15% v/v glycerol with 0.01% w/v chromium potassium sulfate results in optimal resolution of cellular detail and substantially no cell loss.

FIXING AND STAINING - EXAMPLE 4

[00202] *Blocking Buffer.* The type of irrelevant protein was altered between FIGS. 8A and 8B, while the amount of irrelevant protein, hydrophilic polymer, detergent, and amino acid remained constant: 2% w/v irrelevant protein, 15% v/v hydrophilic polymer (e.g., glycerol), 0.4% v/v detergent (e.g., Tween20), and 0.3M glycine. As shown in FIG. 8A, when bovine serum albumin is used in the blocking buffer, the stain is dull and the specific staining has the intensity of background staining making identification of the specifically stained features difficult. As shown in FIG. 8B, when hydrolyzed collagen is used, the stain is bright and specific areas of high staining are easily identifiable as compared to background staining.

FIXING AND STAINING - EXAMPLE 5

[00203] *Immunofluorescence staining.* As shown in FIG. 9A, cells were cytocentrifuged onto standard laboratory slides and processed by the methods described in FIG. 1 and elsewhere herein. The cells were stained with DRAQ5 (nucleus) as shown in Panel A in FIG. 9A, AlexaFluor488-Vimentin as shown in Panel B in FIG. 9A, AlexaFluor594-pan-Cytokeratin as shown in Panel C in FIG. 9A, PE-EpCam as shown in Panel D in FIG. 9A, Pacific Orange-CD45 as shown in Panel E in FIG. 9A, and BV421-CD14 as shown in Panel F in FIG. 9A. As shown in FIG. 9A, nuclear and cellular structures are preserved. Vimentin (FIG. 9A, Panel B), cytokeratin (FIG. 9A, Panel C), and EpCam (FIG. 9A, Panel D) exhibit markedly different cellular distribution and structure. Further, WBC and CD14 (FIG. 9A, Panel F) positive cells can be easily distinguished from cancer cells.

[00204] As shown in FIG. 9B, cells from the same donor and the same cell culture batch as FIG. 9A, on the same day, were fixed with paraformaldehyde 4%, perforated with 0.5% saponin, blocked and stained with DRAQ5 (nucleus) as shown in Panel A in FIG. 9B, AlexaFluor488-Vimentin as shown in Panel B in FIG. 9B, AlexaFluor594-pan-Cytokeratin as shown in Panel C in FIG. 9B, PE-EpCam as shown in Panel D in FIG. 9B, Pacific Orange-CD45 as shown in Panel E in FIG. 9B, and BV421-CD14 as shown in Panel F in FIG. 9B. As shown in FIG. 9B, the nuclei (FIG. 9B, Panel A) of the WBC appear diffuse, the morphology and distribution of Cytokeratin (FIG. 9B, Panel C) and EpCam (FIG. 9B, Panel D) appears highly similar, and the morphology of WBC and CD14 (FIG. 9B, Panel F) positive cells is distorted. Further, as shown in Panel B in FIG. 9B, vimentin does not stain. Also, high autofluorescence of WBC is observed in the PE channel as shown in Panel D in FIG. 9B.

FIXING AND STAINING - EXAMPLE 6

[00205] *RNA Recovery.* 500,000 cells from the lung cancer cell line, A549, were spun onto slides using a Cytofuge 2 (StatSpin, USA) and RNA recovery was compared after fixing with 10% w/v PVP and 0.01% w/v chromium potassium sulfate and staining according to the methods described in FIG. 1 versus the two most frequently used methods, paraformaldehyde (PFA) and methanol fixation.

[00206] For PFA fixation, slides were dried for five minutes at room temperature, immersed in 4% PFA for ten minutes, washed with PBS, incubated in PBS/Saponin 0.5% for ten minutes, and washed in PBS again. Then, slides were blocked in PBS/BSA 1%/Tween 20 0.1%/Glycine 0.3M for thirty minutes, mock-stained in PBS/BSA 1% for sixty minutes, and washed with PBS before being mounted with coverslips.

[00207] For methanol fixation, slides were dried for five minutes at room temperature and immersed in -20°C chilled 100% methanol for ten minutes. Slides were then blocked in PBS/BSA 1%/Tween 20 0.1%/Glycine 0.3M for thirty minutes, mock-stained in PBS/BSA 1% for sixty minutes, and washed with PBS before being mounted with coverslips.

[00208] All slides were maintained at 4°C for forty-eight hours until removal of coverslips for analysis of RNA content.

[00209] For RNA extraction, commercial RNA extraction kits were used (Jena bioscience, Germany). The coverslip was removed and hydrophobic ink circles were drawn around the cells on the slides. Five hundred microliters of lysis buffer was applied and incubated for five minutes at room temperature. Samples were aspirated and mixed with 300 microliters isopropanol. Mini-spin columns were prepared with activation buffer according to the instructions of the manufacturer and samples added to the column. After centrifugation at 10,000 g for thirty seconds, the flow through was discarded and columns were washed two times with washing buffers supplied by the manufacturer. Then, the spin column was placed into a new microcentrifuge tube. Forty microliters of elution buffer was added to each column and incubated for one minute at room temperature. Then columns were centrifuged at 10,000 g for one minute and RNA obtained in the flow through was measured in a Qbit Fluorometer 3.0 (Thermo Fisher). RNA quantity was compared to total RNA obtained from fresh cells obtained from the same culture on the same day as the fixation of the other samples and then stored at 4°C in RPMI 1640 media with 10% FBS during the forty-eight hours. Fresh cells were washed in PBS and re-counted before RNA extraction.

[00210] As shown in FIG. 10, the methods described in FIG. 1 and elsewhere herein preserve up to 70% of RNA as compared to fresh cells, while methanol and PFA fixation results in substantial loss of RNA. Therefore, the methods and compositions described herein offer a unique advantage to facilitate downstream molecular biology methods, for example, genetic analysis, transcriptome analysis, and next-generation RNA sequencing.

IDENTIFYING CTC - EXAMPLES

[00211] The following are examples of use of the methods described elsewhere herein for identifying a circulating tumor cell in a cell sample. The samples were prepared according to the methods and compositions described elsewhere herein. Although specific examples are used, it will be appreciated by one of skill in the art that the methods described herein may be used in examples beyond what is presented herein.

[00212] Integrated fluorescence density or pixel intensity of a nuclear area of a cell of interest is a valuable marker for identifying circulating cancer cells. DNA content of cells can serve as an important indicator to confirm or exclude malignancy if combined with immunostaining of membrane (CD45, CD34, CD14, white blood cell markers), cytosolic (vimentin), and/or nuclear antigens (e.g., H3 Ser10, a mitosis marker; caspase-3, an apoptosis marker).

[00213] As shown and described elsewhere herein, a two-fold increase in nuclear DNA content can be found in healthy white blood cells (WBC) undergoing mitosis. However, WBC undergoing mitosis is a very rare occurrence in healthy individuals (for example, less than one cell per 500,000 WBC). Healthy, mitotic WBC are characterized by expression of WBC markers CD45 and/or CD14 and/or others, as well as by phosphorylation at Serine 10, Histone 3, which is widely reported in the literature and sometimes used in routine diagnostics for detection of mitotic cells.

[00214] However, any two-fold increase of nuclear DNA content not accompanied by phosphorylation of Serine 10, Histone 3 (no binding of anti-H3Ser10 antibody), or any increase other than two-fold, especially any increase larger than two-fold, is a strong indicator for malignancy of cells found in the circulation. Any decrease in nuclear DNA content must be evaluated together with hematopoietic stem cell markers, such as CD34, with apoptosis markers such as caspase-3, and in clinical context, for example, excluding the presence of Thalassemia or other diseases leading to elevated frequencies of apoptotic cells in the circulation. Note that prolonged storage of whole blood can also lead to increase frequencies of apoptotic cells.

IDENTIFYING CTC - EXAMPLE 1

[00215] FIG. 11A shows a microscopy image of a BV421-CD45 stain of a prostate cancer cell sample and FIG. 11B shows a microscopy image of a DyLight594-Vimentin stain of the same prostate cancer cell sample. In comparing FIGS. 11A-11B, there is a cell of interest 400 that is staining positive for Vimentin (FIG. 11B) but negative for CD45 (FIG. 11A). Nuclear staining of the cell of interest 400 with DRAQ5 as shown in FIG. 11C reveals that the cell of interest 400 has a reduced DNA content (0.79X), as shown in the histogram in FIG. 11D, as compared to other cells 410 in the cell sample when the cell of interest 400 and the other cells 410 are normalized to the background 420, as described in FIGS. 2-3 and elsewhere herein. These data are consistent with the cell of interest either being a circulating tumor cell or apoptotic. Further analysis with one or more apoptosis markers would be required to distinguish between these two possibilities.

IDENTIFYING CTC - EXAMPLE 2

[00216] FIG. 12A shows a microscopy image of a BV421-CD45 stain of a prostate cancer cell sample and FIG. 12B shows a microscopy image of a DyLight594-Vimentin stain of the same prostate cancer cell sample. In comparing FIGS. 12A-12B, there is a cell of interest 500 that is staining positive for Vimentin (FIG. 12B) but negative for CD45 (FIG. 12A). Nuclear staining of the cell of interest 500 with DRAQ5 as shown in FIG. 12C reveals that the cell of interest 500 has an increased DNA content (1.45X), as shown in the histogram in FIG. 12D, as compared to other cells 510 in the cell sample when the cell of interest 500 and the other cells 510 are normalized to the background 520, as described in FIGS. 2-3 and elsewhere herein. These data are consistent with the cell of interest either being aneuploidic or a circulating tumor cell. To confirm that the cell is not undergoing healthy mitosis, staining with a proliferation marker or mitosis marker would be required.

IDENTIFYING CTC - EXAMPLE 3

[00217] FIG. 13A shows a microscopy image of a BV421-CD14 stain of a prostate cancer cell sample; FIG. 13B shows a microscopy image of a Pacific Orange-CD45 stain of the same prostate cancer cell sample; and FIG. 13C shows a microscopy image of a AlexaFluor488-Vimentin stain of the same prostate cancer cell sample. In comparing FIGS. 13A-13C, there is a cell of interest 600 that is staining positive for Vimentin (FIG. 13C) but negative for CD45 (FIG. 13B) and CD14 (FIG. 13A). Nuclear staining of the cell of interest 600 with DRAQ5 as shown in FIG. 13D reveals that the cell of interest 600 has an increased DNA content (1.44X), as shown in the histogram in FIG. 13E, as compared to other cells 610 in the cell sample when the cell of

interest 600 and the other cells 610 are normalized to the background 620, as described in FIGS. 2-3 and elsewhere herein. These data are consistent with the cell of interest either being aneuploidic or a circulating tumor cell. To confirm that the cell is not undergoing healthy mitosis, staining with a proliferation marker or mitosis marker would be required.

IDENTIFYING CTC - EXAMPLE 4

[00218] FIG. 14A shows a microscopy image of a BV421-CD14 stain of a prostate cancer cell sample; FIG. 14B shows a microscopy image of a Pacific Orange-CD45 stain of the same prostate cancer cell sample; and FIG. 14C shows a microscopy image of a AlexaFluor488-Vimentin stain of the same prostate cancer cell sample. In comparing FIGS. 14A-14C, there are two cells of interest 700A, 700B that are staining positive for Vimentin (FIG. 14C) but negative for CD45 (FIG. 14B) and CD14 (FIG. 14A). Nuclear staining of the cells of interest 700A, 700B with DRAQ5 in FIG. 14D reveals that the cells of interest 700A, 700B have an increased DNA content (1.77X and 1.76X, respectively), as shown in the histogram in FIG. 14E, as compared to other cells 710 in the cell sample when the cells of interest 700A, 700B and the other cells 710 are normalized to the background 720, as described in FIGS. 2-3 and elsewhere herein. These data are consistent with the cell of interest either being aneuploidic or a circulating tumor cell. To confirm that the cell is not undergoing healthy mitosis, staining with a proliferation marker or mitosis marker would be required.

IDENTIFYING CTC - EXAMPLE 5

[00219] FIG. 15A shows a microscopy image of a Pacific Orange-CD45 stain of a prostate cancer cell sample; FIG. 15B shows a microscopy image of a PE-phosphorylated serine 10 Histone H3 stain (i.e., a proliferation marker) of the same prostate cancer cell sample; and FIG. 15C shows a microscopy image of a AlexaFluor488-Vimentin stain of the same prostate cancer cell sample. In comparing FIGS. 15A-15C, there is a cell of interest 800 that is staining positive for Vimentin (FIG. 15C), phosphorylated serine 10 Histone H3 (FIG. 15B), and CD45 (FIG. 15A), suggesting that the cell is benign and undergoing mitosis. Nuclear staining of the cell of interest 800 with DRAQ5 as shown in FIG. 15D reveals that the cell of interest 800 has an increased DNA content (2.02X), as shown in the histogram in FIG. 15E, as compared to other cells 810 in the cell sample when the cell of interest 800 and the other cells 810 are normalized to the background 820, as described in FIGS. 2-3 and elsewhere herein. These data are consistent with the cell of interest being benign and in the process of mitosis.

IDENTIFYING CTC - EXAMPLE 6

[00220] FIG. 16A shows a microscopy image of a BV421-CD34 stain of a prostate cancer cell sample; FIG. 16B shows a microscopy image of a Pacific Orange-CD45 stain of the same prostate cancer cell sample; and FIG. 16C shows a microscopy image of a AlexaFluor488-Vimentin stain of the same prostate cancer cell sample. In comparing FIGS. 16A-16C, there is a cell of interest 900 that is staining positive for Vimentin (FIG. 16C), weakly positive for CD34 (FIG. 16A), but negative for CD45 (FIG. 16B). Nuclear staining of the cell of interest 900 with DRAQ5 as shown in FIG. 16D reveals that the cell of interest 900 has a reduced DNA content (0.83X), as shown in the histogram in FIG. 16E, as compared to other cells 910 in the cell sample when the cell of interest 900 and the other cells 910 are normalized to the background 920, as described in FIGS. 2-3 and elsewhere herein. These data are consistent with the cell of interest being aneuploidic and malignant.

IDENTIFYING CTC - EXAMPLE 7

[00221] FIG. 17A shows a microscopy image of a BV421-CD14 stain of a prostate cancer cell sample; FIG. 17B shows a microscopy image of a Pacific Orange-CD45 stain of the same prostate cancer cell sample; and FIG. 17C shows a microscopy image of a AlexaFluor488-Vimentin stain of the same prostate cancer cell sample. In comparing FIGS. 17A-17C, there is a cell of interest 1000 that is staining positive for Vimentin (FIG. 17C), weakly positive for CD45 (FIG. 17B), but negative for CD14 (FIG. 17A). Nuclear staining of the cell of interest 1000 with DRAQ5 as shown in FIG. 17D reveals that the cell of interest 1000 has a reduced DNA content (0.74X), as shown in the histogram in FIG. 17E, as compared to other cells 1010 in the cell sample when the cell of interest 1000 and the other cells 1010 are normalized to the background 1020, as described in FIGS. 2-3 and elsewhere herein. These data are consistent with the cell of interest being aneuploidic and malignant.

MACHINE LEARNING SYSTEM

[00222] FIG. 18 illustrates a block diagram of a computer-implemented machine learning system for identifying and classifying a rare cell. In one embodiment, the machine learning system 1800 utilizes a computer 2000 having a processor 2010 and memory 2020, such as that described in FIG. 4, and also includes two or more machine learning layers 1810, 1820, 1830. It will be appreciated by one skilled in art that an alternative embodiment of the machine learning system 1800 can utilize three discrete computers 2000, each having a processor 2010 and memory 2020,

where each discrete computer includes a single machine learning layer. In some embodiments, no substantial information is passed between ML1 and ML2, and ML2 and ML3; instead, ML1 and ML2 may mask one or more regions of the image that are relevant/irrelevant to subsequent layers, for example ML2 and ML3, respectively. In other embodiments, specific information, for example locations, regions of cells, regions of cell types, regions of cell subtypes, etc. are passed between layers.

[00223] In one embodiment, the machine learning system 1800 comprises three machine learning layers 1810, 1820, 1830. Machine learning layer (ML1) 1810 includes an input that receives a plurality of annotated training images of biological samples. It will be appreciated that the number of training images can range from 10 images to 1000s of images. The ML1 1810 is trained with the training images, which each include annotated locations of regions of cells and non-cells to develop a region of cells algorithm that identifies locations and certain features of regions of cells as distinguished from regions of non-cells and of a background of the image. The features of the regions of cells may comprise one or more of: a nuclear region or marker, a cytoplasmic region or marker, a membrane region or marker, a cellular region or marker, a fluorescence intensity, a region shape or area, or a combination thereof. The region of cells algorithm is then stored in a memory, such as memory 2020 of FIG. 4, associated with ML1 1810 for later identifying locations of regions of cells in an image of an unknown biological sample.

[00224] In some embodiments, machine learning layer (ML2) 1820 is independently trained by receiving the plurality of annotated training images of biological samples. Each region of cells includes an annotation denoting a cell type corresponding to the cells in that region. ML2 1820 analyzes each region of cells and the corresponding annotated cell type to develop a cell type algorithm. The cell type algorithm is then stored in a memory, such as memory 2020 of FIG. 4, associated with ML2 1820 for later classifying a cell type for identified regions of cells in an image of an unknown biological sample.

[00225] Further, as illustrated in FIG. 18, machine learning layer (ML3) 1830 is trained by receiving a plurality of annotated training images of biological samples. ML3 1830 analyzes each region of cells, the cell type and the annotated cell subtype to develop a cell subtype algorithm. In some embodiments, a detected region may include multiple individual cells. In such embodiments, ML3 may determine a number of the individual cells (e.g., count the cells) and classify the cell type with a cell subtype. The cell subtype algorithm is stored in a memory, such as memory 2020

of FIG. 4, associated with ML3 1830 for later classifying a cell subtype for cell types in an image of an unknown biological sample.

[00226] FIG. 19 illustrates an example training image of a biological sample including cells and non-cells on a background. As shown in FIG. 19, training image 1900 is of a known biological sample that is divided into a plurality of locations 1910. The training image 1900 includes regions of cells 1930, regions of non-cells 1940, and a background 1920 of the image 1900. In this example, all of the regions of cells 1930 and non-cells 1940 are annotated as cells 1950 and non-cells 1960 on the training image 1900. The training image 1900 is provided to ML1 1810 for training and developing the region of cells algorithm. In other embodiments, all regions of cells 1930 are annotated as cells 1950 on the training image 1900, to distinguish regions with cells from regions with non-cells or background.

[00227] FIG. 20 illustrates an example of the training image of a biological sample including annotated cell types for the region of cells. The training image 1900 further includes annotated cell types 2060 associated with each of the regions of cells 1950 and is provided to ML2 1820 for training and developing the cell type algorithm. Further, ML2 1820 is only trained on the cell type for regions of cells, thereby increasing the speed of classifying biological cells on images of an unknown sample.

[00228] FIG. 21 illustrates an example of the training image of a biological sample including annotated cell subtypes for the cell types. The training image 1900 further includes annotated cell subtypes 2110 for each of the cell types 2060. ML3 1830 analyzes only the cell type 2060 and the cell subtype 2110 for training and developing the cell subtype algorithm.

[00229] FIG. 22 illustrates a flowchart depicting a method for training a computer-implemented machine learning system for identifying and classifying a rare cell. At step 2210, a plurality of images of biological samples, such as the training image 1900 of FIGs. 19, 20, and 21, are annotated, or equivalently labeled or marked, with locations of regions of cells, cell types and cell subtypes. The training images are subsequently provided to the machine learning system 1800 for training and development of algorithms in each learning layer 1810, 1820, 1830. It will be appreciated that the independent training of each layer provides for rapid identifying and classifying in images of unknown biological samples. Further, the independent training allows for the ability to debug each layer separately without affecting the entire system 1800 or to replace independent layers without affecting the other layers.

[00230] At step 2220, ML1 1810 acquires the plurality of training images, where each image includes annotations showing the locations of each of the regions of cells 1950, its cell type 2060, and its cell subtype 2110. ML1 1810 identifies and distinguishes the regions of cells 1930 from the regions of non-cells 1940 and the background 1920 of the training image and develops the region of cells algorithm. It will be appreciated that any number of training images, such as the example training image 1900, can be used to refine and improve the algorithm.

[00231] At step 2230, ML2 1820 receives the plurality of training images, either prior, subsequent or concurrent to ML1 1810 receiving the training image. In another embodiment, ML2 1820 receives the training image independent to ML1 1810 and ML3 1830 receiving the training image. ML2 1820 analyzes only the locations having a region of cells 1930; all other locations in the image 1900 are ignored, thereby saving processing time. ML2 1820 analyzes the annotated cell type 2060 for each of the regions of cells 1950 on the training image and develops the cell type algorithm based on the analysis.

[00232] At step 2240, ML3 1830 receives the plurality of training images, either prior, subsequent, or concurrent to ML1 1810 and ML2 1820. In another embodiment, ML3 1830 receives the training image independent to ML1 1810 and ML2 1820 receiving the training image. ML3 1830 analyzes only the locations having the region of cells 1950 and the annotated cell type 2060 along with the annotated cell subtype 2110. ML3 1830 then develops the cell subtype algorithm based on the analysis.

[00233] FIG. 23 illustrates an image of an unknown biological sample. The image may be a highly multiplexed fluorescence immunostained image of the unknown biological sample. After training the machine learning system 1800 of FIG. 18, the system 1800 rapidly identifies and classifies a cell type and subtype, such as circulating tumor or cancer cells and embedded tumor or cancer cells. Processor, such as processor 2010 or other image processors, of ML1 1810 receives and divides image 2300 into a number of locations 2310. Running the stored region of cells algorithm, ML1 1810 determines the locations based on the features of the regions of cells 2330, distinguishing them from the regions of non-cells 2340 and a background 2320. ML1 1810 then provides the locations for each of the region of cells 2330 to ML2 1820 for classifying. ML2 1820 runs the stored cell type algorithm on the region of cells 2330 at the locations provided to classify a cell type for each region. The image 2300 is then provided to ML3 1830 that runs the stored cell subtype algorithm for each cell type to classify a cell subtype for each region.

[00234] In an alternative embodiment, the machine learning system 1800 comprises two machine learning layers 1820, 1830. Training images that include a known location of a region of cells may optionally be provided directly to machine learning layer (ML2) 1820 for training.

[00235] FIG. 24 illustrates a table of cell types and cell subtypes that the exemplary embodiment of the machine learning system identifies and classifies. Cell types can be one or more of: an atypical polymorphonuclear cell, an atypical cell, a mononuclear (MNC) cell, a megakaryocyte cell, a polymorphonuclear cell, and an atypical MNC cell. Cell subtypes associated with an atypical cell can be one of: an isomorphic tumor cell, a polymorphic non-white blood cell, a polymorphic tumor cell, or an atypical white blood cell. Cell subtypes associated with an MNC cell can be one of: a lymphocyte, a granular lymphocyte, a small lymphocyte, a plasma cell, a monocyte, or a hematopoietic stem cell. Cell subtypes associated with a megakaryocyte cell can be one of: a megakaryocyte cell or a megakaryoblast cell. Cell subtypes associated with a polymorphonuclear cell can be one of: a neutrophil, an eosinophil, or a basophil. Cell subtypes associated with an atypical MNC cell can be one of: a hematopoietic stem cell or an activated MNC cell. It will be appreciated, however, that other cell types and cell subtypes can be identified and classified using the machine learning system 1800 of the present invention.

[00236] For example, machine learning system 1800 may be adapted for any type of cellular identification and/or any type of cellular sample. For example, cellular identification may be dependent on tissue of origin, bodily location, type of cancer or condition, type of procedure, etc. Further for example, a sample for analysis may comprise a blood smear, a fixed sample, an embedded tissue section, a frozen tissue section, live cells, etc.

[00237] The examples and illustrations included herein show, by way of illustration and not of limitation, specific embodiments in which the subject matter may be practiced. Other embodiments may be utilized and derived therefrom, such that structural and logical substitutions and changes may be made without departing from the scope of this disclosure. Such embodiments of the inventive subject matter may be referred to herein individually or collectively by the term "invention" merely for convenience and without intending to voluntarily limit the scope of this application to any single invention or inventive concept, if more than one is in fact disclosed. Thus, although specific embodiments have been illustrated and described herein, any arrangement calculated to achieve the same purpose may be substituted for the specific embodiments shown. This disclosure is intended to cover any and all adaptations or variations of various embodiments.

Combinations of the above embodiments, and other embodiments not specifically described herein, will be apparent to those of skill in the art upon reviewing the above description.

WHAT IS CLAIMED IS:

1. A method for identifying and classifying cells of a biological sample in an image, the method comprising:
 - at a first processor:
 - receiving an image of a biological sample comprising a location of at least one region of cells in the image;
 - classifying, with a first trained algorithm, a cell type for each of the at least one region of cells; and
 - outputting the cell type for each of the at least one region of cells;
 - at a second processor:
 - receiving the cell type for each of the at least one region of cells;
 - classifying, with a second trained algorithm, a cell subtype for each cell type; and
 - outputting the cell subtype associated with the cell type for each of the at least one region of cells.
2. The method of claim 1, further comprising:
 - at an image processor:
 - receiving the image of the biological sample; and
 - dividing the image into a plurality of regions;
 - identifying, with an image trained algorithm, the location of each of the at least one region of cells located in one of the plurality of regions;
 - masking the regions comprising non-cells and a background of the image; and
 - outputting the location for each of the at least one regions comprising the cells to one of the first or second processor.
3. The method of claim 1, wherein the cell subtype is an object including a circulating tumor cell or a cancer cell.
4. The method of claim 1, wherein the cell type for each of the at least one region of cells comprises a polymorphonuclear cell, an atypical polymorphonuclear cell, an atypical cell, a

mononuclear cell, an atypical mononuclear cell, a megakaryocyte cell, or a combination thereof; and

wherein the cell subtype is an object comprising an isomorphic tumor cell, a polymorphic non-white blood cell, a polymorphic tumor cell, an atypical white blood cell, a megakaryocyte, a megakaryoblast, an activated mononuclear cell, a neutrophil, an eosinophil, a basophil, a T cell, a B cell, a granular lymphocyte, a lymphocyte, a plasma cell, a monocyte, a hematopoietic stem cell, a circulating tumor cell, a cancer cell, or a combination thereof.

5. The method of claim 1, wherein the image is a highly multiplexed fluorescence immunostained image of the biological sample.

6. A system for identifying and classifying cells in a biological sample, the system comprising:

a first machine learning layer comprising a first trained algorithm configured to:

receive an image of a biological sample,

divide the image into a plurality of regions, and

identify a location having one or more of: cells and non-cells in each of the plurality of regions, and

a second machine learning layer comprising a second trained algorithm configured to:

receive the image of the biological sample and the location of a subset of regions having cells, and

classify the subset of regions having cells based on a cell type; and

a third machine learning layer comprising a third trained algorithm configured to:

receive the image of the biological sample and the classified cell type in the subset of regions, and

further classify the cell type of the subset of regions based on a cell subtype.

7. The system of claim 6, wherein identifying the location performed by the first trained algorithm further comprises identifying one or more features in each of the plurality of regions.

8. The system of claim 7, wherein the second trained algorithm classifies regions cell type; and wherein the third trained algorithm classifies objects of cell subtypes.
9. The system of claim 7, wherein the one or more features comprise one or more of: a nuclear region or marker, a cytoplasmic region or marker, a membrane region or marker, a cellular region or marker, a fluorescence intensity, a region shape or area, or a combination thereof.
10. The system of claim 6, wherein each cell type is one of: a polymorphonuclear cell, an atypical polymorphonuclear cell, an atypical cell, a mononuclear cell, an atypical mononuclear cell, a megakaryocyte cell, or a combination thereof.
11. The system of claim 6, wherein each of the plurality of cell subtypes is an object comprising: an isomorphic tumor cell, a polymorphic non-white blood cell, a polymorphic tumor cell, an atypical white blood cell, a megakaryocyte, a megakaryoblast, an activated mononuclear cell, a neutrophil, an eosinophil, a basophil, a T cell, a B cell, a granular lymphocyte, a lymphocyte, a plasma cell, a monocyte, an hematopoietic stem cell, a circulating tumor cell, a cancer cell, or a combination thereof.
12. A method for identifying and classifying a cell in an unknown biological sample, the method comprising:
- receiving, at a machine learning system comprising a plurality of trained algorithms, an image of the unknown biological sample;
 - segmenting the image into regions;
 - identifying a location of a region of cells having one or more features in one or more of the regions according to a first trained algorithm;
 - classifying the region of cells at the identified location with a cell type according to a second trained algorithm; and
 - classifying the region of cells at the identified location having the cell type with a cell subtype according to a third trained algorithm.

13. The method of claim 12, wherein each of the one or more features comprise one or more of: a nuclear region or marker, a cytoplasmic region or marker, a membrane region or marker, a cellular region or marker, a fluorescence intensity, a region shape or area, or a combination thereof.

14. The method of claim 12, wherein the cell type is a region comprising: a polymorphonuclear cell, an atypical polymorphonuclear cell, an atypical cell, a mononuclear cell, an atypical mononuclear cell, a megakaryocyte cell, or a combination thereof.

15. The method of claim 12, wherein each cell subtype is an object comprising: an isomorphic tumor cell, a polymorphic non-white blood cell, a polymorphic tumor cell, an atypical white blood cell, a megakaryocyte, a megakaryoblast, an activated mononuclear cell, a neutrophil, an eosinophil, a basophil, a T cell, a B cell, a granular lymphocyte, a lymphocyte, a plasma cell, a monocyte, an hematopoietic stem cell, a circulating tumor cell, a cancer cell, or a combination thereof.

16. The method of claim 13, further comprising training the machine learning system, wherein training comprises:

acquiring a plurality of training images of known biological samples, wherein locations of the regions of cells, cell types, and cell subtypes of the biological sample are identified;

training a first machine learning layer with the plurality of training images and developing the first trained algorithm by using the identified location of the region of cells having the one or more of the features to distinguish between regions of cells, non-cells, and a background of the image;

training a second machine learning layer with the plurality of training images and developing the second trained algorithm by using the identified location of the region of cells and the cell types; and

training a third machine learning layer with the plurality of training images and developing the third trained algorithm by using the identified location of the region of cells, the cell types, and the cell subtypes.

17. The method of claim 16, wherein the plurality of training images is highly multiplexed fluorescence immunostained images of a plurality of known biological samples.
18. The method of claim 12, wherein the machine learning system is one of a supervised, unsupervised, reinforcement, semi-supervised, self-supervised, multi-instance, inductive, deductive inference, transductive, multi-task, active, online, transfer, ensemble, neural networks, convolutional neural networks, recurrent neural networks, modular neural networks, long short-term memory, Classification Trees, Discriminant Analysis, k-Nearest Neighbors, Naive Bayes, Support Vector Machines, deep learning, and combinations or equivalents thereof.
19. The method of claim 12, wherein the at least one of the cell subtypes is an object including a circulating tumor cell or a cancer cell.
20. A computer-implemented method of training and identifying a cell, the method comprising:
 - acquiring a plurality of training images of biological cells, wherein locations and features of regions of cells, cell types, and cell subtypes of the biological cells are identified;
 - training a first machine learning layer with the plurality of training images of biological cells and the locations and the features of regions of cells to distinguish between the biological cells and background, the first machine learning layer developing a first algorithm that distinguishes biological cells from the background;
 - training a second machine learning layer with the plurality of training images of biological cells and the locations of the biological cells and the cell types, the second machine learning layer developing a second algorithm that distinguishes the cell types from each other;
 - training a third machine learning layer with the plurality of training images of biological cells and the locations, the cell types, and the cell subtypes, the third machine learning layer developing a third algorithm that distinguishes cell subtypes from each other;

acquiring one or more images of unknown biological cells to be identified and classified;
and

applying the first, second, and third algorithms to the one or more images of unknown biological cells, the first, second, and third algorithms identifying a location of a region of cells, a cell type, and a cell subtype of the unknown biological cells.

21. The method of claim 20, wherein the cell types comprise: a polymorphonuclear cell, an atypical polymorphonuclear cell, an atypical cell, a mononuclear cell, an atypical mononuclear cell, a megakaryocyte cell, or a combination thereof.

22. The method of claim 21, wherein the cell subtypes of mononuclear cells comprise: granular lymphocytes, small lymphocytes, plasma cells, monocytes, hematopoietic stem cells, circulating tumor cells, and other mononuclear subtypes.

23. The method of claim 21, wherein the cell subtypes of atypical cells comprise: atypical white blood cells, polymorphic T cells, isomorphic T cells, and polymorphic non-white blood cells, and other atypical subtypes.

24. The method of claim 21, wherein the cell subtypes of peripheral blood mononuclear cells comprise: basophils, neutrophils, eosinophils, and other peripheral blood mononuclear cells.

25. The method of claim 20, wherein the plurality of images of training cells and the one or more images of unknown cells are obtained by multiplexed fluorescence immunostaining.

26. The method of claim 20, wherein the first, the second, and the third machine learning layers comprise machine learning methods comprising: supervised, unsupervised, reinforcement, semi-supervised, self-supervised, multi-instance, inductive, deductive inference, transductive, multi-task, active, online, transfer, ensemble, neural networks, convolutional neural networks, recurrent neural networks, modular neural networks, long short-term memory, Classification Trees, Discriminant Analysis, k-Nearest Neighbors, Naive Bayes, Support Vector Machines, deep learning, and combinations or equivalents thereof.

27. The method of claim 20, wherein the first features comprise one or more of: a nuclear region or marker, a membrane region or marker, a cellular region or marker, a fluorescence intensity, a cell size, a cell shape, a cellular area, a cytoplasmic area, a nuclear area, a proliferation marker, mitosis markers, apoptosis markers, necrosis markers, and combinations or equivalents thereof.

28. A computer-implemented method of identifying a cell, the method comprising:

processing one or more images of unknown biological cells by a trained machine learning system comprising a first machine learning layer having a first algorithm, a second machine learning layer having a second algorithm, and a third machine learning layer having a third algorithm;

identifying a location of the unknown biological cells as distinguished from a background with the first algorithm;

identifying cell types of the unknown biological cells with the second algorithm; and

identifying cell subtypes of the unknown biological cells with the third algorithm.

29. The method of claim 28, wherein the cell types comprise: a polymorphonuclear cell, an atypical polymorphonuclear cell, an atypical cell, a mononuclear cell, an atypical mononuclear cell, a megakaryocyte cell, or a combination thereof.

30. The method of claim 29, wherein the cell subtypes of mononuclear cells: comprise granular lymphocytes, small lymphocytes, plasma cells, monocytes, hematopoietic stem cells, circulating tumor cells, and other mononuclear subtypes.

31. The method of claim 29, wherein the cell subtypes of atypical cells comprise: atypical white blood cells, polymorphic T cells, isomorphic T cells, and polymorphic non-white blood cells, and other atypical subtypes.

32. The method of claim 29, wherein the cell subtypes of peripheral blood mononuclear cells comprise: basophils, neutrophils, eosinophils, and other peripheral blood mononuclear cells.

33. The method of claim 28, wherein developing the first algorithm comprises training the first machine learning layer with a plurality of training images having known locations and features of regions of biological cells that distinguishes regions of biological cells from a background of the training image,

wherein the features comprise one or more of: a nuclear region or marker, a membrane region or marker, a cellular region or marker, a fluorescence intensity, a cell size, a cell shape, a cellular area, a cytoplasmic area, a nuclear area, a proliferation marker, mitosis markers, apoptosis markers, necrosis markers, and combinations or equivalents thereof.

34. The method of claim 28, wherein developing the second algorithm comprises training the second machine learning layer with a plurality of training images having known locations of regions of biological cells and cell types, the second machine learning layer developing the second algorithm that distinguishes the cell types from each other.

35. The method of claim 28, wherein developing the third algorithm comprises training the third machine learning layer with a plurality of training images having known locations of regions of biological cells, cell types, and cell subtypes, the third machine learning layer developing the third algorithm that distinguishes cell subtypes from each other.