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- 34 J.S. de Bono has served as a consultant/advisory board member for Terumo (unpaid)
- 35 and Menarini (paid). No other potential conflicts of interest were disclosed by the other
- 36 authors.

37

38 Abstract

39 Purpose: Circulating tumor cells (CTCs) have clinical relevance, but their study has 40 been limited by their low frequency. Experimental Design: We evaluated liquid 41 biopsies by apheresis to increase CTC yield from patients suffering from metastatic 42 prostate cancer, allow precise gene copy number calls, and study disease 43 heterogeneity. Results: Apheresis was well-tolerated and allowed the separation of 44 large numbers of CTCs; the average CTC yield from 7.5mls of peripheral blood was 45 167 CTCs, whereas the average CTC yield per apheresis (mean volume: 59.5mls) was 46 12546 CTCs. Purified single CTCs could be isolated from apheresis product by FACS 47 sorting; copy number aberration (CNA) profiles of 185 single CTCs from 14 patients 48 revealed the genomic landscape of lethal prostate cancer and identified complex intra-49 patient, inter-cell, genomic heterogeneity missed on bulk biopsy analyses. 50 Conclusions: Apheresis facilitated the capture of large numbers of CTCs non-51 invasively with minimal morbidity and allowed the deconvolution of intra-patient 52 heterogeneity and clonal evolution.

54 Statement of Significance:

Apheresis is well-tolerated and is a non-invasive alternative to tumor tissue biopsies, substantially increasing circulating tumor cell yields and allowing the study of tumor evolution and intra-patient heterogeneity during treatment. Serial, repeated, apheresis can interrogate disease evolution, drive key therapeutic decisions and transform prostate cancer drug development.

62 Introduction:

63 Prostate cancer (PC) remains a major cause of male cancer-related deaths [1]. Studies 64 elucidating disease biology are restricted by poor preclinical models and difficulty 65 acquiring metastatic castration resistant prostate cancer (mCRPC) biopsies [2]. The genomic landscape of both localized and advanced PC has been recently described 66 67 but bulk tumor biopsy genomics only provide a snapshot of the disease landscape [3]. 68 Moreover, concerns have been raised regarding the ability of bulk biopsy sequencing 69 to document intra-tumor heterogeneity and clonal evolution. Serial biopsies are 70 necessary to evaluate changes imposed by therapeutic selective pressures over time, 71 but their acquisition is challenging, invasive and often not feasible. Less invasive 72 alternatives ("liquid biopsies") could be hugely impactful, allowing serial evaluation, and 73 detecting disease evolution that can influence treatment choices.

74

75 Two main forms of liquid biopsy have emerged: Circulating plasma cell-free DNA 76 (cfDNA) and circulating tumor cell (CTC) analyses. Whilst measuring cfDNA 77 concentrations has utility [4], limitations in gualitative analyses deconvoluting intra-78 patient heterogeneity and accurate calling of copy number aberrations (CNAs), 79 especially deletions, have been acknowledged [5]. CTCs, shed from solid tumors [6] 80 and found in the peripheral blood (PB) of patients with both non-metastatic (5-24%) 81 and metastatic (26-49%) disease [7, 8], can allow the early detection of disease 82 dissemination, prognostication and benefit from therapy [9, 10]. Indeed, CTC 83 evaluation may be superior to radiological assessment in determining response to treatment and outcome. [11-13] 84

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86 CTC studies can allow non-invasive, serial, tumor genomic characterization during 87 treatment, but a major challenge to this has been their detection in significant numbers 88 to enable genomic, transcriptomic and protein analyses. To overcome these limitations, 89 apheresis has been suggested to increase CTC yield [14]. Apheresis allows processing 90 of the whole blood volume by centrifugation, separating blood components (e.g. red 91 cells, platelets and leukocytes) based on density. Apheresis has a therapeutic role in 92 the management of hematological disorders and is well tolerated with few safety 93 concerns [15]. Previous studies have suggested that CTCs can be collected from 94 apheresis product from patients with and without metastases [14, 16, 17]. CTCs can 95 have a similar density to mononuclear cells and apheresis can increase CTC 96 separation from a larger volume of processed blood. We hypothesized that apheresis, 97 followed by CTC enrichment methods, could allow the safe acquisition of large 98 numbers of viable and intact purified CTC populations from patients with advanced PC,

- 99 permitting a true liquid biopsy and tumor molecular characterization.
- 100

101 Materials and Methods:

102 Patient selection and clinical assessment

103 Eligible patients had histologically confirmed mCRPC. Additional eligibility criteria 104 included: Detectable peripheral blood CTCs (CellSearch[™]), good bilateral antecubital 105 fossa venous access and no coagulopathy. Clinical assessments included medical 106 history and physical examination, full blood count, biochemical tests and coagulation. 107 Safety assessments were done during apheresis and after 30-days. All patients 108 provided written informed consent. The study was conducted in accordance with the 109 Declaration of Helsinki, with the ethics committee of the Royal Marsden and The 110 Institute of Cancer Research approving the study.

111

112 Apheresis (method and CTC detection)

Apheresis was performed using a Spectra Optia[™] Apheresis System (Terumo, BCT, 113 114 Lakewood, CO). Patients were connected to this via two peripheral venous catheters in 115 each cubital vein. Whole blood was anticoagulated before entering the rotating 116 centrifuge. Heavier blood elements including erythrocytes migrated to the outside of 117 the channel, plasma to the centre, and the buffy coat (including mononuclear cells and 118 CTCs) to the middle. The mononuclear cell layer was removed and the remaining 119 blood cells and plasma were constantly returned to the patient to the contralateral arm. 120 Granulocyte-colony stimulating factor was not used. Blood was anticoagulated with 121 citrate dextrose solution A (2-4 500mL infusion bags were required for each 122 procedure).

123

124 CTC Enumeration using CellSearch® platform

125 CTC counts were determined in 7.5mL of PB drawn immediately before, and after, the 126 apheresis; an aliquot of apheresis product containing 200x10⁶ WBC was transferred to 127 a CellSave preservative tube (Menarini, Silicon Biosystems) and mixed with 128 CellSearch[™] dilution buffer to a final volume of 8mL. All samples were processed 129 within 96-hours and CTC counts determined by CellSearch® (Menarini, Silicon 130 Biosystems). Briefly, cells were subjected to immunomagnetic capture using anti-131 EpCAM antibodies and stained with antibodies specific for cytokeratin 8, 18 and 19 132 (CK-PE), CD45 (CD45-APC) and nucleic acid dye (DAPI). Cells were defined as CTCs 133 when positive for cytokeratin and DAPI and negative for CD45. Images were captured

using the CellTracks Analyzer II[®] (Menarini, Silicon Biosystems) and manually
examined to determine the presence of CTC. CellSearch Cartridges were stored in the
dark at 4°C before further analyses.

137 Single cell isolation and amplification

138 CellSearch cartridge contents were transferred into fresh Eppendorf tubes, washed 139 twice with 150µl of phosphate buffered saline, and FACS sorted (FACS Aria III; 140 Becton, Dickinson and Company) to single CTCs (DAPI+, CK+, CD45-) or WBC 141 (DAPI+, CD45+, CK-). Sorted single CTC or WBC were whole genome amplified (WGA) using Ampli1[™] (Menarini, Silicon Biosystems) according to the manufacturer 142 143 instructions with minor modifications. Cells were lysed, digested for 30-minutes, 144 adaptor ligated for 3-hours and PCR-amplified. The WGA DNA was purified (MinElute[™] PCR Purification Kit (Qiagen), guantified using Qubit[™] (Invitrogen), and 145 146 stored at -20□C.

147

148 **DNA from biopsies**

DNA from formalin fixed paraffin embedded (FFPE) biopsies was extracted using the QIAampTM DNA FFPE Tissue kit (Qiagen), quantified using QubitTM (Invitrogen), and evaluated by Illumina FFPE QC kitTM. Whole genome amplification was carried out on 10ng of tumor DNA using WGA2TM (Sigma Aldrich). WGA DNA was purified (MinElute PCR Purification Kit; Qiagen), quantified (Qubit; Invitrogen), and stored at -20 \Box C.

154

155 Array Comparative Genomic Hybridization (aCGH)

156 500ng of amplified single CTC DNA was fluorescently labeled with Cy5, and WBC 157 reference DNA labeled with Cy3 (SureTag Complete DNA Labeling Kit; Agilent 158 Technologies CA, USA). Labeled DNA was purified and hybridized utilizing the Agilent 159 SurePrint G3 Human array CGH Microarray Kit, 4x180K. Slides were scanned and 160 ratios of CTC/WBC determined using CytoGenomics Software v 4.0.3.12 (Agilent 161 Technologies CA, USA). Log₂ ratios of aCGH segments were matched with gene 162 coordinates to assign per-gene values. Copy states of genes were classified by the 163 assigned log_2 ratio values. Log_2 ratio values < -0.25 were categorized as losses; those 164 > 0.25 as gains; and those in between as unchanged. Amplifications were defined as 165 smoothed \log_2 ratio values ≥ 1.2 and homozygous deletions as the segment \log_2 ratio 166 values \leq -1.2.

167

Per-sample CNA burden was calculated as the proportion of the human genome (3000Mega-base pairs) impacted. Unsupervised hierarchical clustering was performed using

170 R (v3.4) with Ward's method and the Euclidean distances of unique copy number 171 changes. When clustering samples from multiple tissue types, X chromosome genes 172 were excluded (aside from the *AR* gene and ten genes on either side) due to different 173 reference X-chromosome ploidies (as a female reference was used). Per-patient 174 functional diversity was derived from cluster dendrograms of CTC samples by 175 calculating the sum of connecting branches in a dendrogram (from the R package 176 vegan v2.4.4) and divided by the number of samples.

177

178 **FISH analysis**

179 FISH was performed by FFPE hybridization as previously described [22]. Briefly 3-4µM 180 FFPE sections were deparaffinized, heat pre-treated, pepsin digested and hybridized 181 with FISH probe hybridization mix overnight at 37°C. FISH probes used were: 182 BRCA2/CEN13q (Abnova); RB1 (Abbott Laboratories); PTEN (10q23)/SE 10; MYC 183 (8q24)/SE 8 (Leica Microsystems) and a custom-made AR/CEPX probe (Menarini, 184 Silicon Biosystems). Stringency washes were performed on all slides; for AR, where 185 the probe was indirectly labelled, a secondary incubation with anti-Digoxigenin-186 Fluorescein antibody (Roche Diagnostics, USA) was done. Slides were digitally imaged 187 (Bioview Ltd., Rehovot, Israel) and a pathologist (DNR) evaluated a minimum of 100 188 tumor cells; the ratios between probes of interest and reference probes were recorded. 189 Amplification was reported if the ratio was >2; heterozygous loss and homozygous 190 deletion if at least 1/3 of the cells showed loss of one copy, or loss of all copies, of the 191 tested probe respectively.

192

193 Organoid culture

194 For CTC enrichment, 1ml of single cell suspension was immunomagnetically separated 195 with EasySep™ Epcam positive selection (Stem Cell Technologies) and the selected 196 fraction used for organoid culture (negative fraction cultured as a control). Isolated cells 197 were seeded in 3D using growth factor reduced Matrigel[™] (Corning) in spheroid-198 ultra-low attachment surface-coated formina suspension in microplates 199 (Nunclon Sphera[™], ThermoFisher Scientific) utilizing previously described growth 200 media conditions [23]. Organoids were passaged after 4-6 weeks and cells collected 201 manually for molecular studies by dissociation with TrypLE (Sigma-Aldrich) for 5 min at 202 37°C.

203

204 Next generation sequencing

205 Whole exome sequencing (WES) was performed using Kapa Hyper Plus library prep 206 kits and the Agilent SureSelectXT V6 target enrichment system. Paired-end sequencing was performed using the NextSeg[™] 500 (2x150 cycles; Illumina). FASTQ 207 files were generated from the sequencer's output using Illumina bcl2fastq2 software 208 209 (v.2.17.1.14, Illumina) with the default chastity filter to select sequence reads for 210 subsequent analysis. All sequencing reads were aligned to the human genome 211 reference sequence (GRCh37) using the BWA (v. 0.7.12) MEM algorithm, with indels 212 being realigned using the Stampy (v.1.0.28) package. Picard-tools (v.2.1.0) were used 213 to remove PCR duplicates and to calculate sequencing metrics for QC check. The 214 Genome Analysis Toolkit (GATK, v. 3.5-0) was then applied to realign local indels, 215 recalibrate base scores, and identify point mutations and small insertions and 216 deletions. Somatic point mutations and indels were called using MuTect2 by comparing 217 tumor DNA to germline control and copy number estimation was obtained through 218 modified ASCAT2 package.

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- 220

221 **Results**

222 Patient Characteristics

223 From November 2015 to July 2017, 14 eligible mCRPC patients with detectable CTCs 224 by CellSearch[™] were enrolled (median age 70.4 years; range 60-77); time from PC 225 diagnosis to procedure ranged from 2-11.6 years (mean: 6.2 years; median: 3.9 years). 226 Median PSA level at apheresis was 506ng/mL (range: 41-6089 ng/mL); all 14 (100%) 227 had metastatic bone disease. Prior to apheresis, patients had received 1-5 lines of 228 systemic therapy for CRPC (Supplementary Table 1, Supplementary Figure 1a). At 229 apheresis, none of the subjects were receiving active treatment other than androgen 230 deprivation.

231

The apheresis workflow is depicted in **Figure 1a**. Each apheresis procedure lasted between 90-160 minutes; apheresis product volume ranged from 40-100 mL (**Supplementary Table 2**). Apheresis was well tolerated with no related adverse events recorded during the procedure or in the 30-day follow-up. Neutrophil and lymphocyte counts did not change significantly following apheresis (**Supplementary Figure 1b**).

238

239 CTC counts

The mean CTC count taken before and after apheresis was 167 and 193, per 7.5mLs of peripheral blood (PB), respectively. Surprisingly, the CTC count did not decrease significantly following apheresis (p=0.48). The average inferred CTC harvest from an
apheresis (mean volume = 59.5mL) was 12546, with apheresis yielding a 90-fold
average increased yield. (p<0.001) (Figure 1b and Supplementary Table 2).

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247 Single CTC genomic profiling

248 To validate the serial WGA and array CGH that we performed on single CTCs, we first 249 used normal male and female DNA (aCGH verified by Agilent), as well as single white 250 blood cell (WBC) amplified DNA, and showed that there was no bias amplifications or 251 deletions. (Supplementary Figure 2a and 2b). Extracted single CTC DNA from a 252 patient with known tumor biopsy CNAs was then evaluated, confirming robust CNA 253 calling. WGA of 1µL of serially diluted samples (starting DNA templates: 10ng/µL, 254 $1ng/\mu L$, $0.1ng/\mu L$ and $0.03ng/\mu L$) showed no amplification bias with consistent calling 255 of gains and losses at all dilutions (Supplementary Figure 2c).

256

257 We then analyzed 205 single CTC aCGH genomic profiles for CNAs from the 258 apheresis products of 14 patients with 185 CTC (90%) showing complex genomic copy 259 change profiles and 20 (10%) cells having relatively flat genomic copy number profiles. 260 Surprisingly, only 2 of the evaluated 14 patients had cell populations with both flat and 261 cancer-like aCGH profiles suggesting that these sorted cells could be associated with 262 specific tumor sub-types or induced by some treatments. We then aggregated the 263 aCGH copy number profiles of all the individual CTCs and showed that the overall 264 profile matched that previously reported for advanced PC whole biopsy exomes [18] 265 (Figure 1c). Details for individual CTCs per patient are shown in Supplementary Table 266 3.

267

268 Tumor biopsies (treatment-naïve diagnostic biopsies and/or metastatic biopsies) were 269 available for 12 of these 14 patients; these samples were also evaluated. Copy number 270 traces of single CTCs and matching, same patient, biopsies showed broadly similar 271 genomic profiles (Figure 1c, Supplementary Figure 3), and again matched that of 272 publically available data [18]. Differences were frequently observed between treatment-273 naïve biopsies and castration resistant CTCs including AR gain (X chromosome), MYC 274 gain (8g) and RB1 loss (chromosome 13) likely reflecting tumor evolution under 275 treatment selective pressures (Supplementary Figure 4). High concordance between 276 single CTC genomic profiles and contemporaneous, same patient, metastatic biopsies 277 was seen, although intra-patient genomic heterogeneity was discernable from the 278 single CTC analyses but not the bulk biopsy analyses.

279 280

281 **CTC diversity**

282 Overall, the genomic analyses of 185 single CTCs from 14 patients (Figure 2a) 283 revealed that some patients had highly homogenous CTC CNA traces (Figure 2a, left) 284 while others had highly diverse single CTC CNA traces (Figure 2a, right) with many 285 lethal PCs displaying inter-cell heterogeneity. This may be related to disease 286 phenotypes or acquired treatment resistance mechanisms (AR and MYC gain at 287 chromosomes X and 8q respectively; BRCA2/RB1 locus loss at chromosome 13). 288 There was no significant correlation between median percentage genome alteration 289 and intra-patient, inter-cell, diversity (Figure 2b) suggesting that this was due to true 290 clonal diversity rather than aberration accumulation. Despite this, the unsupervised 291 hierarchical clustering of all the CNA data from individual CTCs and same patient 292 biopsies indicated that most samples from one patient clustered together 293 (Supplementary Figure 3).

294

295 Intra-patient heterogeneity and tumor evolution

296 As depicted in **Figure 2a** (far left patients), the minority of patients had highly 297 homogeneous CTC, including P09 (Figure 3a); his contemporaneous mCRPC biopsy 298 had a virtually identical CNA profile to these CTCs. Most evaluated patients had 299 heterogeneous CTC CNA profiles that gross biopsy genomic analyses could fail to 300 identify. To further interrogate this intra-patient heterogeneity, we studied additional 301 cells in patient P13 who had heterogeneous CTCs, with CNA data suggesting distinct 302 groups of cells (Figure 3b). Some CTCs clustered with his diagnostic prostatectomy 303 sample, while others clustered with the mCRPC bone biopsy, with a breakpoint in the 304 *PIK3R1* locus including most of chromosome 5q (Figure 3c). A third group of cells was 305 also apparent, displaying more complex genomic aberrations.

306

FISH (fluorescence in-situ hybridization) analyses of the 5q21.1 locus was then performed on both the HSPC sample and the metastasis and revealed the presence of distinct copy number aberrant cells, with 5q21.1 being either gained, normal or lost in a mixed cell population. Overall, these analyses indicated that these three copy-states were equally common in the prostatectomy. Over time and following treatment, the proportion of tumor cells with 5q copy gain increased as shown in the mCRPC biopsy and apheresis CTCs and as confirmed by tissue FISH analyses (**Figures 3c and 3d**).

315 We then studied patient P03 since his CTC CNA profiles were also highly 316 heterogeneous and multiple tumor samples taken at different time points were 317 available, including a transurethral resection of the prostate (TURP) with four 318 geographically and morphologically distinct regions (A, B, C, D) which were micro-319 dissected (Figure 4a). aCGH genomic profiles of these regions identified intra-patient heterogeneity (Figure 4b). Homozygous deletion of BRCA2 and 8q gain was present 320 321 in all four regions; however, loss of chromosome 18 was only present in Areas C and D 322 while gain of 7q was only present in Areas A and C. The CNA profile of a lymph node 323 (LN) biopsy acquired from this patient 6 years later, following treatment with docetaxel, 324 enzalutamide and cabazitaxel, identified the BRCA2 homozygous deletion and 8g gain, 325 as well as previously undetected AR amplification and 17q gain (Figure 4b).

326

327 In patient P03, we performed whole exome sequencing (WES) of the microdissected 328 TURP regions. This identified truncal pathogenic mutations of SPOP (p.Trp131Cys) 329 and FOXA1 (p.His168del), with intra-patient heterogeneity of other mutations indicating 330 that regions A and C had similar mutation profiles when compared to regions B and D 331 of the TURP, with the later LN biopsy WES identifying a mixture of these cell 332 populations (Figure 4c). Single CTC analyses acquired at a later time point by 333 apheresis also detected this heterogeneity, delineating this cancer's evolution as 334 depicted by unsupervised hierarchal clustering of 13 CTCs, 4 micro-dissected TURP 335 areas, the gross biopsy, and the LN biopsy (Figure 4d and 4e). Figure 4d highlights 336 key genomic differences in commonly altered pathways in these samples, with 337 heterogeneous PTEN and BRCA2 loss in different sub-clones. FISH analysis of TURP 338 tissue using MYC and BRCA2 probes revealed that some TURP tumor cells had 339 concurrent MYC amplification and BRCA2 homozygous deletion (Figure 4f), while 340 others had MYC amplification but no BRCA2 loss indicating that the latter was probably 341 sub-clonal and occurred later, as indicated by the single CTC analyses (Figure 4e).

342

The apheresis from patient P05 also revealed heterogeneous CTCs; we successfully generated organoid cultures from these (**Supplementary Figure 5a and 5b**) utilizing previously described methods [19]. The CNA profile of these organoids clustered with this patient's CTCs with two genomically divergent sub-clones in culture (**Supplementary Figure 5c**) with both sub-clones detectable in the CTC analyses (**Supplementary Figure 5c, 5d**) indicating that CTC-derived organoid culture can recapitulate this diversity.

350

351 Conclusions/Discussion

352 Liquid biopsy by apheresis is non-invasive and well-tolerated, increasing CTC yield a 353 hundred-fold from mCRPC patients. Apheresis did not significantly impact blood CTC 354 counts suggesting constant replenishment or inefficient capture. Apheresis facilitated 355 the interrogation of tumor genomics, inter-patient genomic heterogeneity, and the 356 dissection of PC evolution. We show for the first time that the genomic landscape of 357 PC CTCs captured by apheresis mirrors that of mCRPC biopsy exomes validating 358 these CTC capture methods [18]. Copy number traces of individual CTCs frequently 359 closely resembled same patient biopsies, with evidence for CTC CNAs evolving over 360 time due to therapeutic pressures (including gains in MYC and AR). Critically, sub-361 clonal CNAs not easily discernable from bulk biopsy analyses were easily detected by 362 single CTC analyses dissecting disease clonal evolution.

363

364 Yields of evaluable single cells decrease significantly through our experimental 365 procedures; stringent settings in FACS sorting to allow isolation of only pure single 366 cells results in a 60-80% retention rate of CTCs from CellSearch[™] cartridges. DNA 367 from approximately another 20% of these cells fail quality control after whole genome 368 amplification. Therefore, in order to end up with sufficient CTCs for genomic analyses, 369 a high number of cells are required, making the concentrated apheresis product a 370 much more efficient source than peripheral blood.

371

372 Surprisingly, we identified by unsupervised clustering varying degrees of intra-patient 373 heterogeneity with some patients having highly homogeneous single CTCs but most 374 having intra-patient CTC genomic diversity. Some CTCs resembled diagnostic biopsies 375 with others genomically mirroring metastases. We envision that the dynamic analyses 376 of these clones by serial, repeated, apheresis before, during, and after treatment will 377 not only dissect disease evolution but also help guide therapeutic switch decisions. 378 Such heterogeneity remains difficult to identify from circulating free DNA, with the 379 analyses of CTCs captured by apheresis allowing a more precise evaluation of 380 emerging clones/sub-clones. Early identification of resistant clones can be utilized to 381 reverse treatment failure, guiding drug combination administration or the serial 382 utilization of drugs not tolerated when administered together. We propose that serial, 383 multiple, apheresis procedures should now be embedded in drug trials to analyze 384 tumor clones/sub-clone eradication/evolution during therapy to further evaluate this 385 strategy while also generating estimates of CTC counts for monitoring response to 386 therapy [20].

Further work is also now needed to explore the clinical implications of this diversity in intra-patient heterogeneity, evaluating whether distinct genomic subtypes of advanced PC display different levels of single CTC diversity. Moreover, further optimization of methodology generating successful organoid growth from apheresis products, along with subsequent molecular and functional analyses to confirm that these CTC-derived organoids can model mCRPC *ex vivo*, may also support the future study of drug testing in CTC organoid cultures.

395

396 We acknowledge the limitations of the data presented, particularly with regards to the 397 limited cohort size and the fact that all the patients were treated at one tertiary cancer 398 center making it difficult to draw broader clinical conclusions. In order for apheresis to 399 have widespread utility it needs to be easily accessible, with high throughput CTC 400 isolation from patients with other cancer types and with lower burden disease [21]. 401 Moreover, improved methods to enhance CTC mobilization and yield through 402 chemokine axis manipulation are warranted with such procedures potentially having 403 therapeutic utility in patients with lower burden disease.

404

405 Moving forward, studies are needed to identify the optimal number of individual CTCs 406 from one patient to sufficiently interrogate heterogeneity yet minimize cost. Low 407 coverage whole genome next generation sequencing with barcoding of DNA from each 408 CTC may allow this, as well as exploration of single cell RNA sequencing to better 409 understand resistance mechanisms. Direct comparison of CTCs acquired by 410 apheresis with both CTCs and cfDNA from peripheral blood, as well as with single cells 411 dissociated from tissue should be pursued. Finally, studies to evaluate the large 412 numbers of immune cells in the apheresis product from these patients are also merited. 413

414 In conclusion, we have demonstrated that the analyses of single CTCs captured by 415 apheresis permits the identification of intra-patient tumor genomic heterogeneity 416 previously missed by bulk biopsy analyses, providing previously undescribed detail on 417 different mCRPC sub-clones. Although the study of biopsies remains a gold standard, 418 the challenges of acquiring serial biopsies and disaggregating these to single cell 419 suspensions to study disease evolution remain. We now posit that successfully and 420 safely improving CTC yield for genomic analyses by apheresis is highly advantageous 421 and has major potential implications for more precise cancer care.

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424 **Figure legends**:

425 Figure 1. Overview of methodology, CTC counts and the overall genomic 426 analyses: a) Methodology workflow of the study; b) CTC counts from 7.5mL of 427 peripheral blood taken pre-apheresis, post-apheresis and compared to inferred 428 harvested CTC counts in the total volume of apheresis product. c) The top plot 429 represents the frequency of the genomic aberrations found in 185 single CTCs 430 harvested by apheresis from 14 mCRPC patients; the middle plot represents the 431 frequency of genomic aberrations from 150 mCRPC exomes (SU2C/PCF cohort), and 432 the lower plot represents the frequency of genomic aberrations from available tissue 433 biopsies from 12/14 patients. Chromosomes are shown across the x-axis whereas the 434 y-axis represent the frequency of gains, losses, amplification and homozygous 435 deletions. Gains are depicted in light pink, losses are depicted in light blue, 436 amplification in dark red and homozygous/deep deletions are in dark blue. *aCGH of 437 tissue biopsies were performed using female reference DNA (Agilent).

438

439 Figure 2. Individual CTC CNA data depicting complex intra-patient and inter-440 patient genomic diversity: a) Unsupervised hierarchical clustering heatmap, based 441 on Euclidean distance, of each analyzed individual CTC from each apheresis patient 442 based on CTC CNA. Each patient is depicted with one color as shown on the phenobar 443 at the top of the heatmap. The heatmaps of each individual patient are organized by 444 their intra-patient diversity score from left to right. Chromosomal CNA are shown from 445 top to bottom for each individual CTC; copy number gains are depicted in light blue, 446 losses in pink, with amplifications and homozygous deletions in dark blue and dark red 447 respectively. b) Box plot showing the percentage genome altered (%GA) for each of 448 the patients. Each filled circle in the box plot represents the percentage genome 449 altered of a single CTC.

450

451 Figure 3. Intra-patient CTC genomic heterogeneity. a) Individual CTC genome plots 452 of patient P09 show very homogenous CTCs similar to a metastatic bone biopsy. b) 453 Heat map depicting CNA of 23 CTCs (grey bars) and 2 tumor biopsies (black bars) 454 from patient P13 showing two different sub-clones, readily visualized by focusing on 455 chromosome 5q, and an additional group of highly heterogeneous CTCs (far left). c) 456 FISH analysis of treatment naïve prostatectomy tissue and a bone mCRPC biopsy 457 from patient P13 using probes for 5p11(red) and 5q21.1 (green). d) A schematic 458 diagram showing the percentage of cells with copy number alterations on 5q21.1 with 459 disease progression from the time of the prostatectomy until apheresis in patient P13.

461 Figure 4. Intra-patient genomic heterogeneity in P03: patient a) 462 Tissue micrographs from four distinct TURP regions shown, depicting intra-patient 463 heterogeneity of tumor morphology with A and C, as well as B and D, similar to one 464 another. In regions A and C glandular differentiation is noticeable with small, 465 monomorphic, hyperchromatic nuclei and inconspicuous nucleoli, whereas in regions B 466 and D a more solid arrangement with pleomorphic nuclei and an open chromatin 467 pattern with large, discernible nucleoli is seen. b) Genome profiles of these TURP 468 regions presented by aCGH. Intra-patient heterogeneity between the 4 areas is 469 highlighted by dashed red lines; regions A and C had gains of 17g and 12g and losses 470 of 3p whereas regions B and D had loss of chromosome 18 and 2p. All areas had 471 homozygous deletion of the BRCA2 genomic locus. A metastatic lymph node biopsy 472 taken at a later date had multiple new aberrations including new AR amplification. c) 473 Exome sequencing revealed that while all samples had an SPOP mutation there was 474 intra-patient heterogeneity as identified by morphology and copy number analysis. d) 475 Heatmap depicting CNA heterogeneity for 12 selected prostate cancer genes with 476 dendrogram utilizing hierarchical clustering of CNA data, based on Euclidean distance, 477 for these tumor tissues and CTCs. Individual CTC are depicted as C#, with # depicting 478 CTC number; "A" represents archival TURP material, "M" the metastatic lymph node 479 biopsy, with A-A, A-B, A-C and A-D respectively representing TURP tissue from 480 regions A, B, C and D respectively. e) Chromosome 13 plot showing heterogeneous 481 BRCA2 loss in different CTCs and biopsies. f) FISH analysis of TURP tumor tissue with BRCA2 probe in green and MYC probe in red; BRCA2 was homozygously deleted 482 483 in most but not all cells (green arrows depict tumor cells with BRCA2 heterozygous 484 loss or no copy loss).

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486

488 **Supplementary Figure legends:**

489 **Supplementary Figure 1. Clinical data: a)** Summary of prior treatments of all 14 490 patients prior to apheresis. **b)** A histogram presenting the lymphocyte and neutrophil 491 counts $(x10^{9}/L)$ in peripheral blood pre- and post-apheresis procedures.

492

Supplementary Figure 2. Summary of the validation steps. a) Male vs female:
Genome plot of amplified male DNA vs amplified female DNA using the Ampli 1 kit. b)
WBC vs WBC: Genomic profile of Ampli1 amplified WBCs against another WBC. c)
Dilution evaluation: Genomic aberrations of an mCRPC sample with known CNA
diluted serially to 10ng/µL, 1ng/µL, 0.1ng/µL, and 0.03ng/µL with all dilutions
generating similar profiles after Ampli1[™] WGA and aCGH. Gains and amplification
depicted in blue, and losses and homozygous/deep deletion in red.

500

501 **Supplementary Figure 3. Unsupervised clustering analyses of all samples:** Fan 502 presentation of unsupervised clustering of all CTCs, tissue biopsies and organoids 503 evaluated in this study. Each CTC is annotated as a circle, each tissue sample as a 504 square, and an organoid as a triangle. Each apheresis patient is depicted by a color. 505 CTCs largely cluster with tumor biopsies from the same patient although as a result of 506 intrapatient heterogeneity some clustered away.

507

508 Supplementary Figure 4: Heatmaps presenting unsupervised hierarchical 509 clustering based on CNA and Euclidean distance, of all the samples for each 510 patient. Each individual patient is depicted by number from left to right, with 511 chromosomal aberrations from top to bottom. Tumor biopsies are identified by black 512 bars, and CTCs by green bars, at the bottom of the heatmap.

513

Supplementary Figure 5: Organoid cultures of CTCs acquired by apheresis from
patient P05: a) Dendrogram and heat map of hierarchical clustering, based on
Euclidean distance, for patient P05 evaluating CTC (green bars) and organoid CNAs
(red). b) Micrographs of two organoids from P05 with scale bar in bottom left (100µm).
c) Phylogenetic tree showing the cultured organoids have CNA that cluster with CTCs.
d) Two organoids and 3 CTCs with truncal CNA including shared *BRCA2* loss and *AR* amplification but sub-clonal chromosome 1 aberrations.

521 Supplementary Table legends

522 Supplementary Table 1: Baseline characteristics of study patients (n=14).

523 *All values given are at time of apheresis unless otherwise specified.

524 A The Eastern Cooperative Oncology Group (ECOG) performance status score ranges

from 0 to 5, with 0 indicating no symptoms and higher scores indicating increasingdisability.

527

Supplementary Table 2: Summary of the CTC and WBC counts from both peripheral blood and apheresis product for all 14 patients, with additional clinical characteristics including sites of disease at apheresis and time to disease progression following apheresis procedure (when available). [ND = Not determined; WBC = White Blood Cells; CTC = Circulating Tumor Cells; PB = Peripheral Blood; Tot.Vol = Total Volume; Inc. = Increase]

534

535 **Supplementary Table 3:** Summary of individual CTCs per patient with percentage of 536 the genome covered by a copy number segment and percentage of genes that are 537 altered.

- 538
- 539
- 540

541 Authors' Contributions

542 Conception and design: MBK Lambros, LWMM Terstappen, Nikolas Stoecklein, J.S.543 de Bono.

544 Development of methodology: MBK Lambros, G Seed, S Sumanasuriya, V Gil, M

545 Crespo, A Mackay, W Yuan, G Fowler, B Ebbs, P Flohr, S Miranda, RP Neves, K. 546 Andree, J. Swennenhuis, LWMM Terstappen, NH Stoecklein and J.S. de Bono

- 547 Acquisition of data (provided animals, acquired and managed patients, provided
- 548 facilities, etc.): MBK Lambros, G Seed, S Sumanasuriya, V Gil, M Crespo, A Mackay,
- 549 M Fontes, G Fowler, B Ebbs, P Flohr, S Miranda, W Yuan, A Mackay, A Ferreira, R
- 550 Pereira, C Bertan, I Figueiredo, R Riisnaes, D Nava Rodrigues, A Sharp, J Goodall, G
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- 552 D Moloney, L Hamilton and J.S. de Bono.

Analysis and interpretation of data (e.g., statistical analysis, biostatistics,
computational analysis): MBK Lambros, G Seed, A Mackay, W Yuan, A Sharp and
J.S. de Bono

- 556 Writing, review, and/or revision of the manuscript: MBK Lambros, S 557 Sumanasuriya, M Crespo, V Gil, M Fontes, LWMM Terstappen and J.S. de Bono.
- 558 Administrative, technical, or material support (i.e., reporting or organizing data,
- 559 constructing databases: MBK Lambros, G Seed, M Crespo, S Sumanasuriya, V Gil,
- 560 and J.S. de Bono

561 **Study supervision:** J.S. de Bono

562 **Other (member of trial management, oversight of trial conduct, and sample** 563 **collection):** S Sumanasuriya, A Sharp, N Mehra, R Chandler, D Bianchini, P 564 Rescigno, Z Zafeirou, J Hunt, D Moloney, L Hamilton and J.S. de Bono.

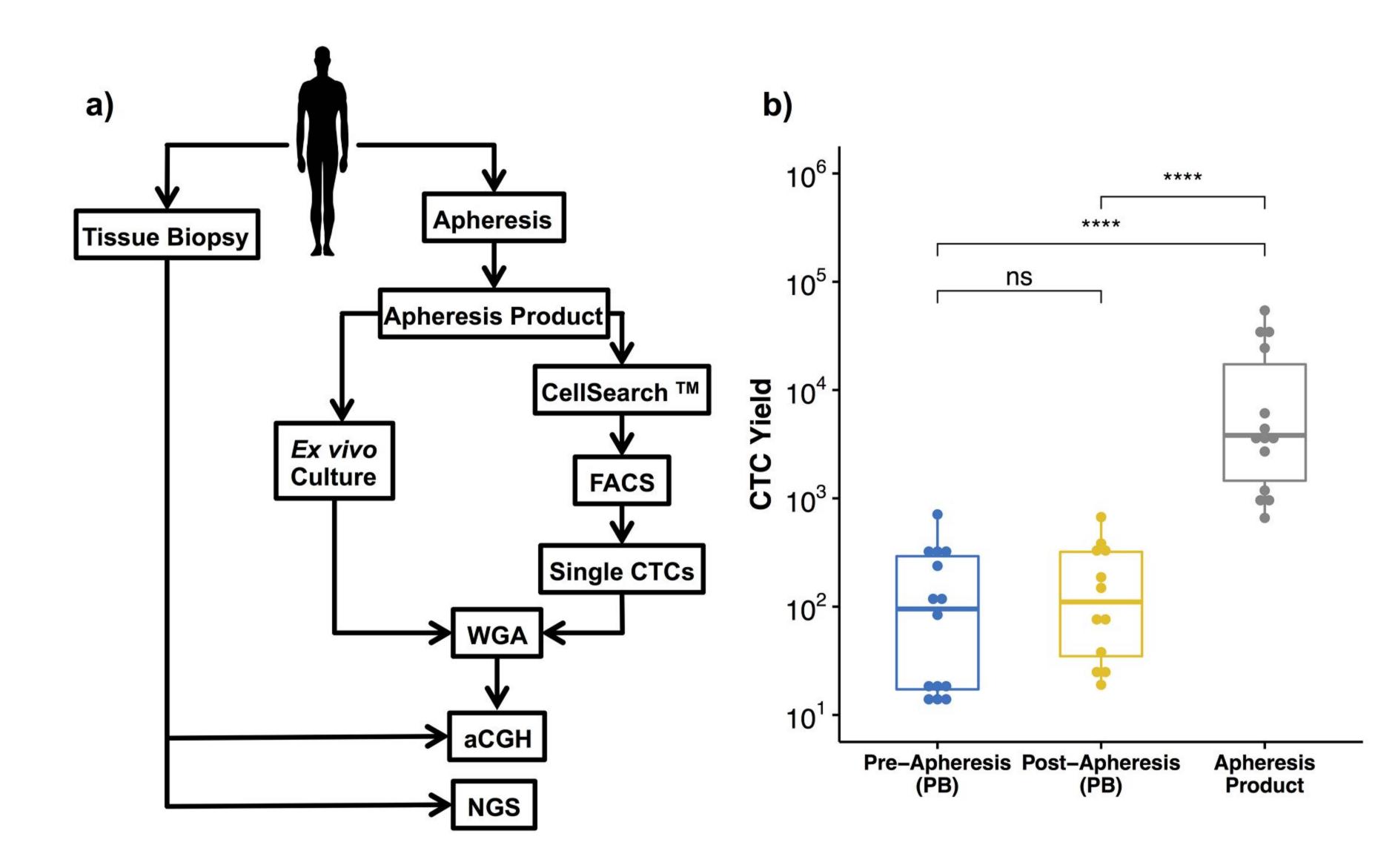
565 Acknowledgements

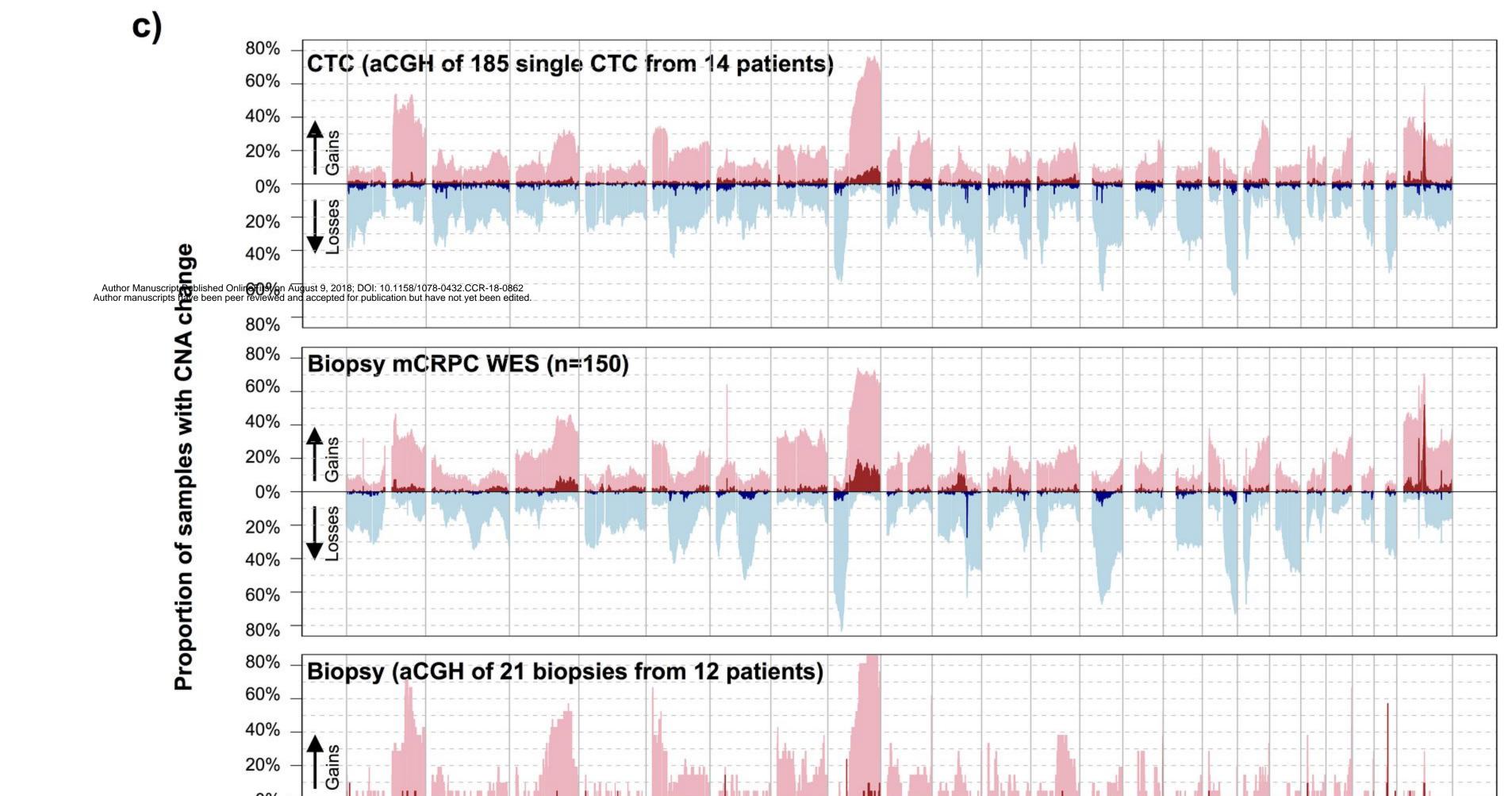
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576 References 577 Siegel, R.L., K.D. Miller, and A. Jemal, Cancer statistics, 2016. CA Cancer J 1. 578 Clin, 2016. 66(1): p. 7-30. 579 Attard, G., et al., Improving the outcome of patients with castration-resistant 2. 580 prostate cancer through rational drug development. Br J Cancer, 2006. 95(7): p. 581 767-74. 582 3. Haffner, M.C., et al., Tracking the clonal origin of lethal prostate cancer. J Clin 583 Invest, 2013. 123(11): p. 4918-22. 584 4. Goodall, J., et al., Circulating Cell-Free DNA to Guide Prostate Cancer 585 Treatment with PARP Inhibition. Cancer Discov, 2017. 7(9): p. 1006-1017. 586 5. Wan, J.C.M., et al., Liquid biopsies come of age: towards implementation of 587 circulating tumor DNA. Nat Rev Cancer, 2017. 17(4): p. 223-238. 588 Premasekharan, G., et al., An improved CTC isolation scheme for pairing with 6. 589 downstream genomics: Demonstrating clinical utility in metastatic prostate, lung 590 and pancreatic cancer. Cancer Lett, 2016. 380(1): p. 144-52. 591 7. Cristofanilli, M., et al., Circulating tumor cells, disease progression, and survival 592 in metastatic breast cancer. N Engl J Med, 2004. 351(8): p. 781-91. 593 Lucci, A., et al., Circulating tumor cells in non-metastatic breast cancer: a 8. 594 prospective study. Lancet Oncol, 2012. 13(7): p. 688-95. 595 9. de Bono, J.S., et al., Circulating tumor cells predict survival benefit from 596 treatment in metastatic castration-resistant prostate cancer. Clin Cancer Res. 597 2008. 14(19): p. 6302-9. 598 10. Kling, J., Beyond counting tumor cells. Nat Biotechnol, 2012. 30(7): p. 578-80. 599 11. Budd, G.T., et al., Circulating tumor cells versus imaging--predicting overall 600 survival in metastatic breast cancer. Clin Cancer Res, 2006. 12(21): p. 6403-9. 601 12. Danila, D.C., et al., Circulating tumor cell number and prognosis in progressive 602 castration-resistant prostate cancer. Clin Cancer Res, 2007. 13(23): p. 7053-8. 603 13. Scher, H.I., et al., Circulating tumor cell biomarker panel as an individual-level 604 surrogate for survival in metastatic castration-resistant prostate cancer. J Clin 605 Oncol, 2015. 33(12): p. 1348-55. 606 14. Stoecklein, N.H., et al., Challenges for CTC-based liquid biopsies: low CTC 607 frequency and diagnostic leukapheresis as a potential solution. Expert Rev Mol 608 Diagn. 2016. 16(2): p. 147-64. 609 15. Bambauer, R., et al., Therapeutic Apheresis in Hematologic, Autoimmune and 610 Dermatologic Diseases With Immunologic Origin. Ther Apher Dial, 2016. 20(5): 611 p. 433-452.

- 612 16. Sumanasuriya, S., M.B. Lambros, and J.S. de Bono, *Application of Liquid*613 *Biopsies in Cancer Targeted Therapy.* Clin Pharmacol Ther, 2017. **102**(5): p.
 614 745-747.
- Kiki C. Andree, A.M., Martin Scholz, Roland Kirchner, Rui P. Neves, Christiane
 Driemel, Rita Lampignano, Hans Neubauer, Dieter Niederacher, Tanja Fehm,
 Wolfram T. Knoefel, Johannes C. Fischer, Nikolas H. Stoecklein and Leon
 WMM Terstappen, *The isolation of CTC from diagnostic leukapheresis*. Cancer
 research, 2016. Volume 76(Issue 14): p. Supplement, pp. 1532.
- Robinson, D., et al., *Integrative clinical genomics of advanced prostate cancer*.
 Cell, 2015. **161**(5): p. 1215-1228.
- 622 19. Gao, D., et al., Organoid cultures derived from patients with advanced prostate
 623 cancer. Cell, 2014. 159(1): p. 176-187.
- Armstrong, A.J., et al., *Biomarkers in the management and treatment of men with metastatic castration-resistant prostate cancer.* Eur Urol, 2012. 61(3): p.
 549-59.
- Fischer, J.C., et al., *Diagnostic leukapheresis enables reliable detection of circulating tumor cells of nonmetastatic cancer patients.* Proc Natl Acad Sci U S
 A, 2013. **110**(41): p. 16580-5.
- Punnoose, E.A., et al., *PTEN loss in circulating tumor cells correlates with PTEN loss in fresh tumor tissue from castration-resistant prostate cancer patients.* Br J Cancer, 2015. **113**(8): p. 1225-33.
- 633 23. Drost, J., et al., Organoid culture systems for prostate epithelial and cancer
 634 tissue. Nat Protoc, 2016. 11(2): p. 347-58.

Figure 1





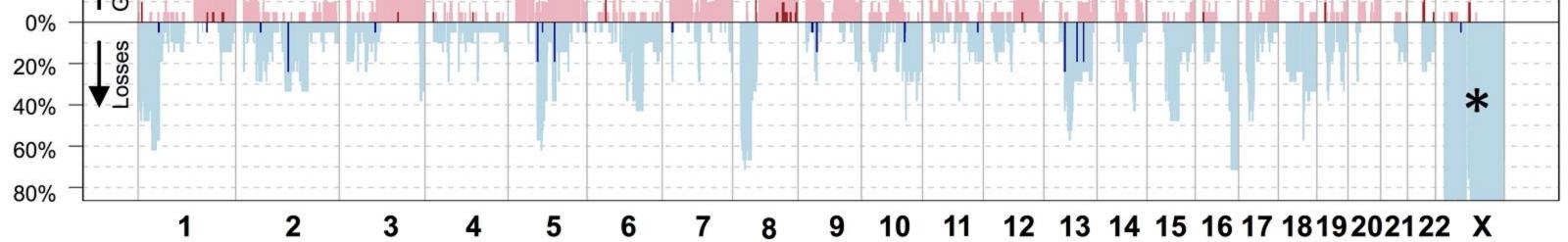
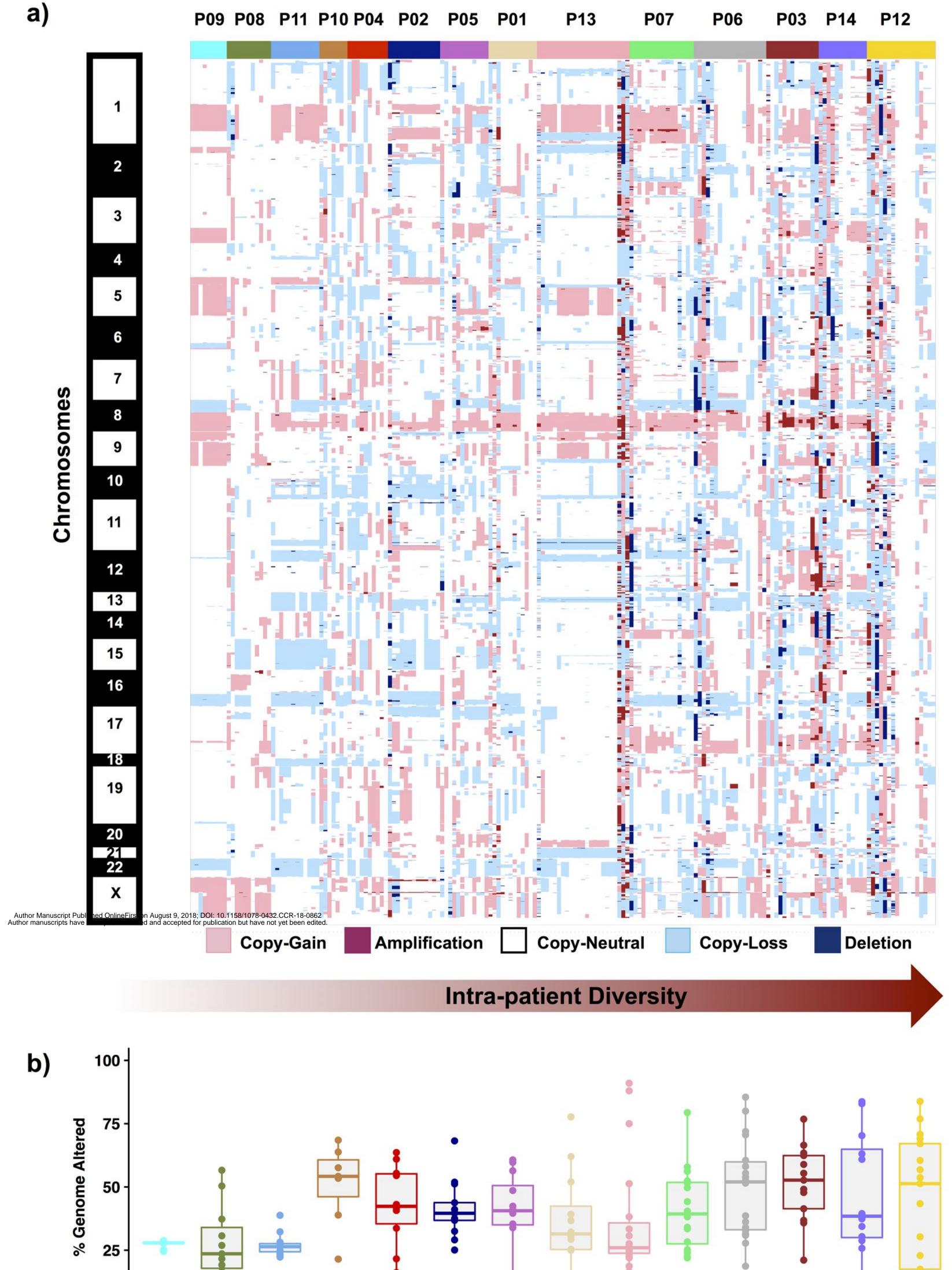
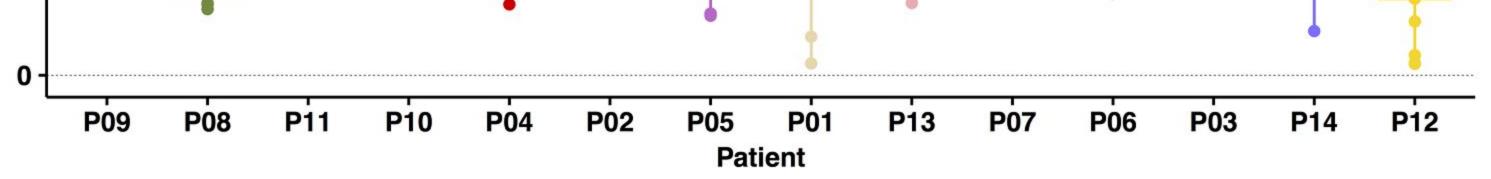


Figure 2





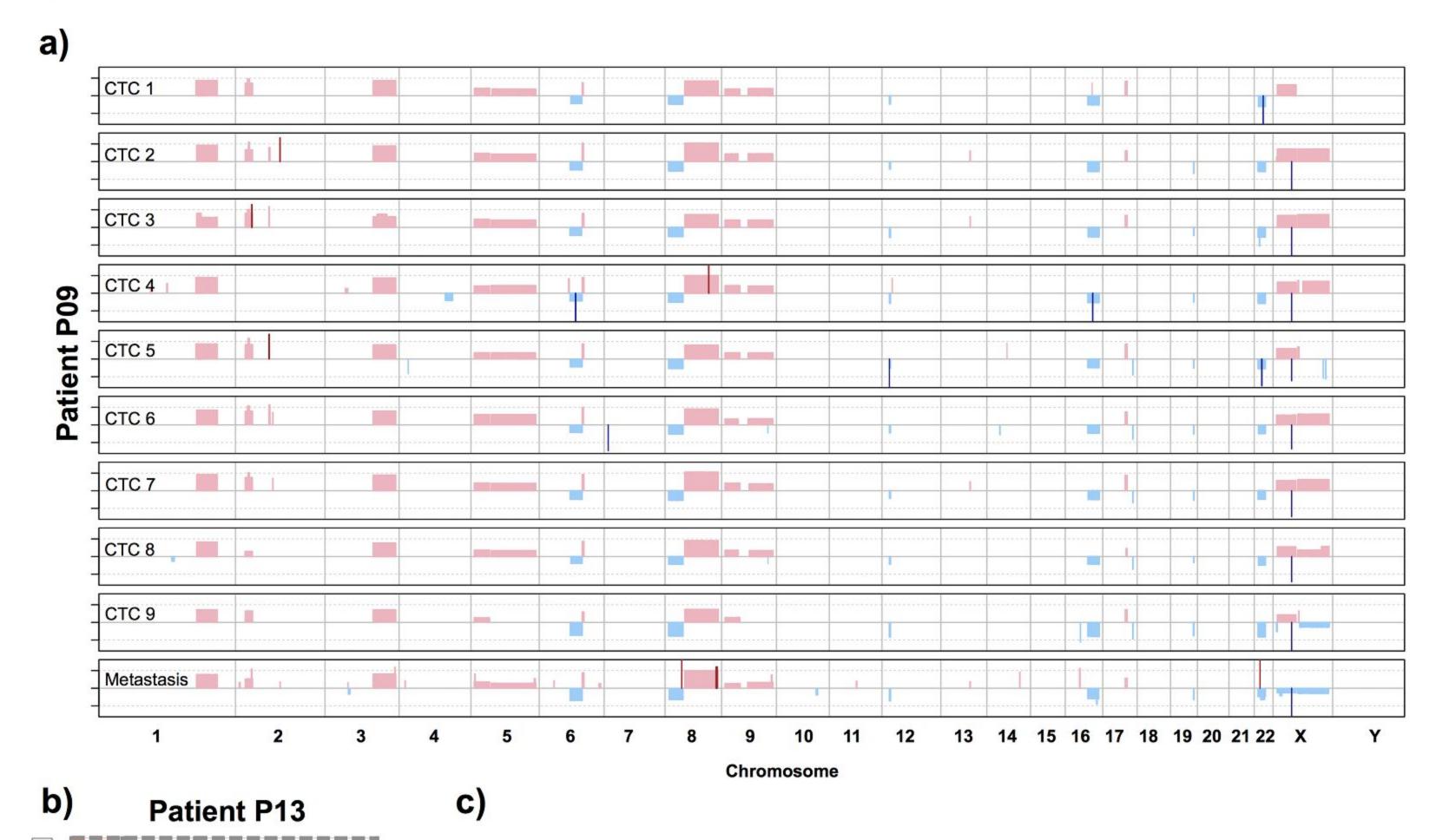
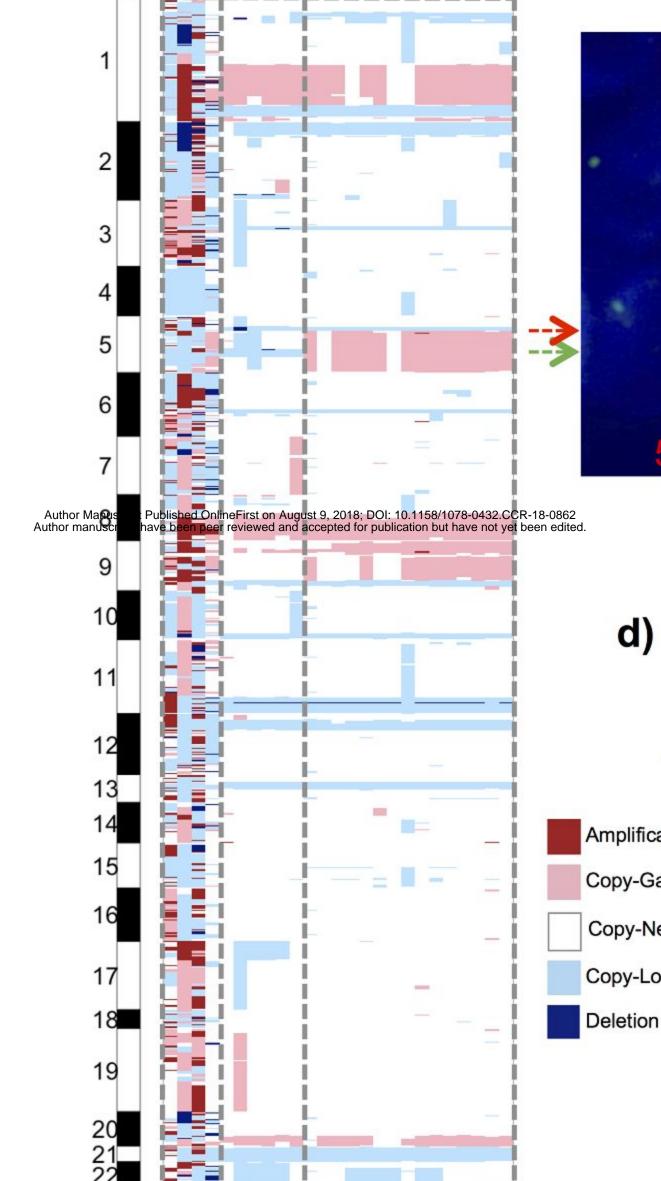
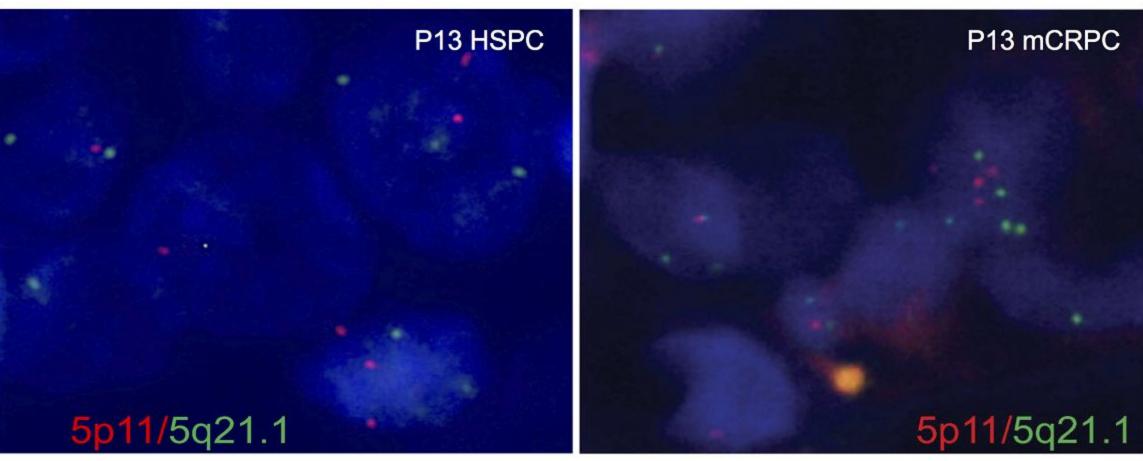
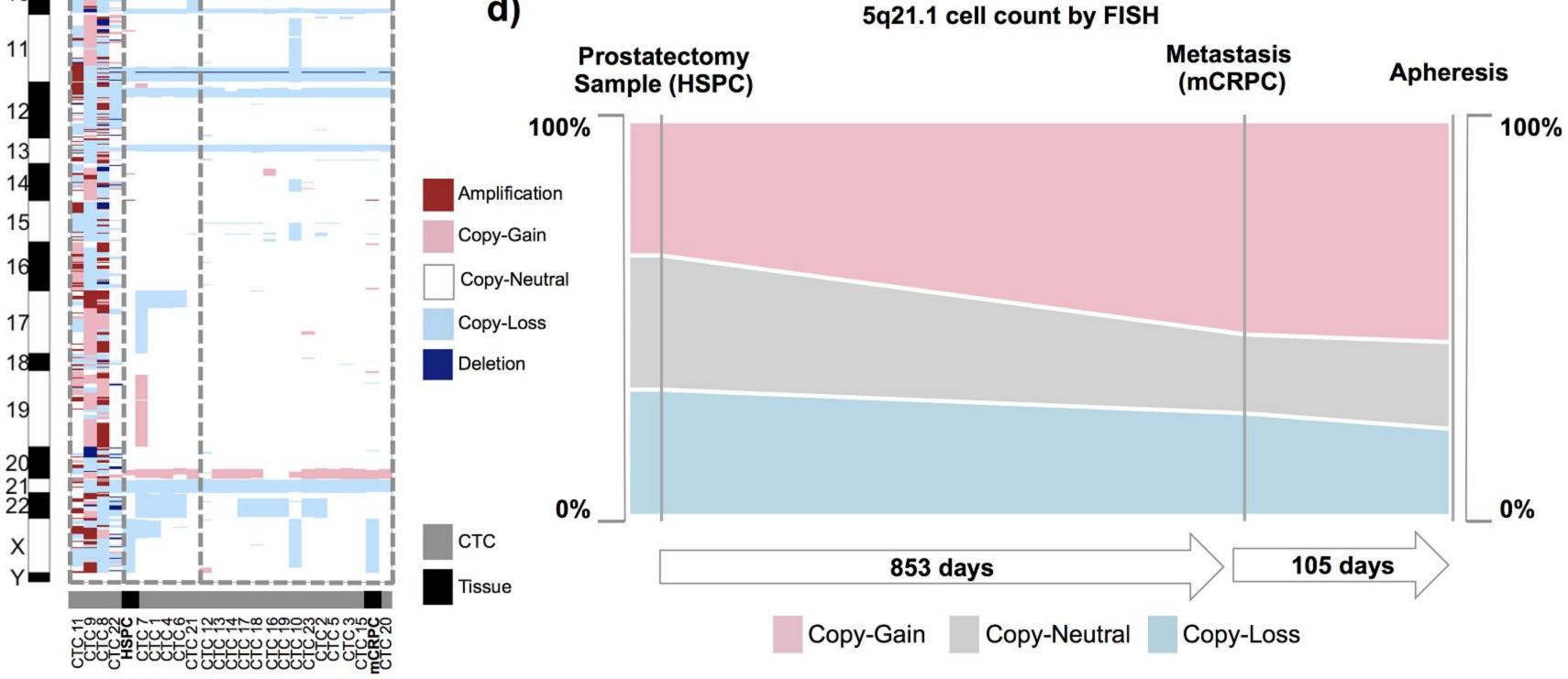


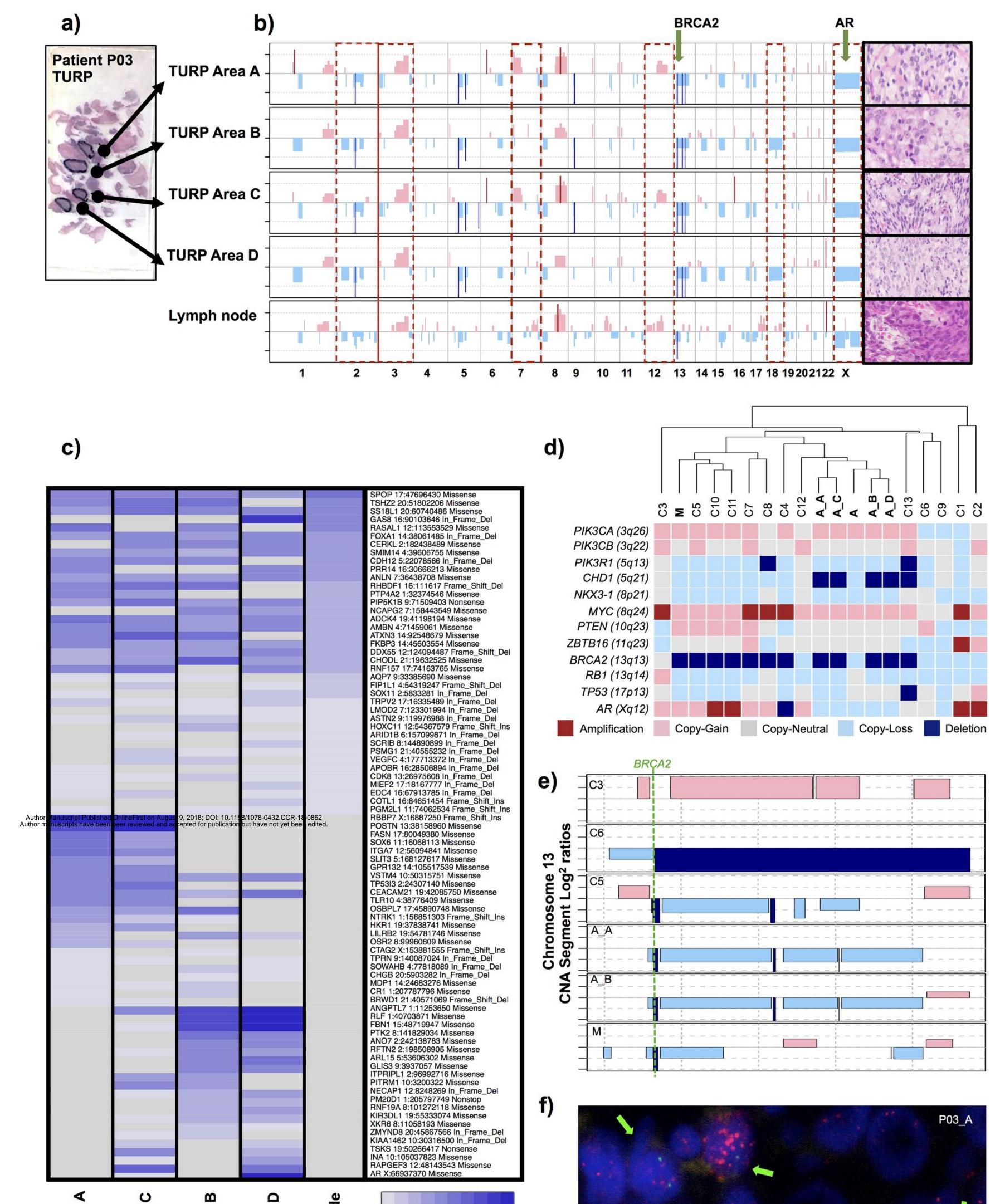
Figure 3

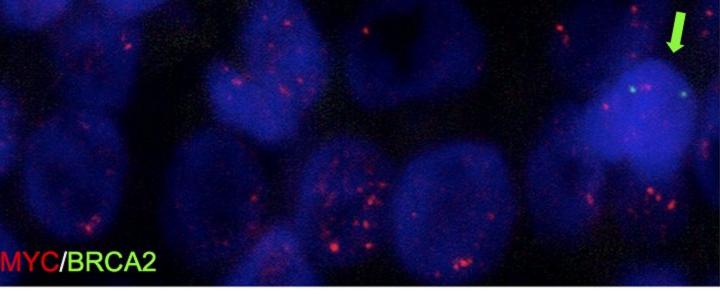


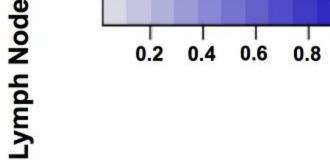














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Clinical Cancer Research

Single Cell Analyses of Prostate Cancer Liquid Biopsies Acquired by Apheresis

Maryou BK Lambros, George Seed, Semini Sumanasuriya, et al.

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