

# **ARTICLE**

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# Methylation of all *BRCA1* copies predicts response to the PARP inhibitor rucaparib in ovarian carcinoma

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Accurately identifying patients with high-grade serous ovarian carcinoma (HGSOC) who respond to poly(ADP-ribose) polymerase inhibitor (PARPi) therapy is of great clinical importance. Here we show that quantitative *BRCA1* methylation analysis provides new insight into PARPi response in preclinical models and ovarian cancer patients. The response of 12 HGSOC patient-derived xenografts (PDX) to the PARPi rucaparib was assessed, with variable dose-dependent responses observed in chemo-naive *BRCA1*/2-mutated PDX, and no responses in PDX lacking DNA repair pathway defects. Among *BRCA1*-methylated PDX, silencing of all *BRCA1* copies predicts rucaparib response, whilst heterozygous methylation is associated with resistance. Analysis of 21 *BRCA1*-methylated platinum-sensitive recurrent HGSOC (ARIEL2 Part 1 trial) confirmed that homozygous or hemizygous *BRCA1* methylation predicts rucaparib clinical response, and that methylation loss can occur after exposure to chemotherapy. Accordingly, quantitative *BRCA1* methylation analysis in a pre-treatment biopsy could allow identification of patients most likely to benefit, and facilitate tailoring of PARPi therapy.

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he development of therapy with poly(ADP-ribose) polymerase inhibitors (PARPi) has been a major advance in the treatment of high-grade serous ovarian carcinoma (HGSOC). PARPi are efficacious in HGSOCs with defective DNA repair by homologous recombination (HR) due to mutation in the breast and ovarian cancer predisposition genes *BRCA1* or *BRCA2* (*BRCA1/2*)<sup>1</sup>. When administered as maintenance therapy in the setting of platinum-sensitive relapsed HGSOC, PARPi prolong progression-free survival (PFS), with some patients deriving durable benefit for more than 3 years<sup>2-6</sup>. As a result, PARPi are now approved in both the treatment and maintenance settings in relapsed ovarian cancer (OC) by the European Medicines Agency (EMA) and the US Food and Drug Administration (FDA).

PARPi may also be relevant as targeted therapy for cancers with a range of defects in HR DNA repair beyond *BRCA1/2* mutation. In high-grade OC, HR defects caused by *BRCA1/2* mutations are present in 17–25% of cases, of which approximately ¾ are germline and ¼ are somatic<sup>7–9</sup>. Other HR pathway alterations have been documented in an additional 25% of HGSOC<sup>7,9</sup>. These HR defects include mutations in the HR pathway genes *RAD51C*, *RAD51D*, and *PALB2* (6–10%)<sup>7,9,10</sup>, as well as methylation of *BRCA1* (7–17%)<sup>7,11,12</sup> or *RAD51C* (1.5–3%) promoters<sup>11,13</sup>, which is generally mutually exclusive of *BRCA1/2* mutation<sup>7,9,10</sup>.

Despite exciting clinical efficacy, one third of the patients with *BRCA1/2* mutant relapsed HGSOC fail to derive benefit from PARPi, with a higher failure rate observed with increasing platinum resistance. Even when patients do respond, the majority relapse within 12 months<sup>3</sup>. A well-defined PARPi resistance mechanism is restoration of HR function via secondary somatic mutations occurring within mutated *BRCA1/2* genes, resulting in re-institution of in-frame gene transcription <sup>14,15</sup>. Secondary mutations that revert primary *BRCA1/2* and *RAD51C/D* mutations have been described in HGSOC and prostate cancers in association with resistance to both platinum and PARPi therapy <sup>10,16,17</sup>. Improved understanding of HR defects beyond *BRCA1/2* mutations (both primary or secondary) is still required to allow more accurate targeting of PARPi therapy and design of strategies to abrogate PARPi resistance.

BRCA1 promoter methylation was first noted 20 years ago in breast cancer<sup>18</sup>, followed by reports in OC<sup>19-22</sup>. Methylation of CpG sites close to the BRCA1 transcription start site<sup>23,24</sup> is associated with reduced BRCA1 mRNA and protein<sup>7,13,21,23</sup>. Accordingly, one of the accepted mechanisms for functional BRCA1 loss involves methylation of one BRCA1 allele combined with a loss of heterozygosity (LOH) event resulting in loss of the other BRCA1 allele<sup>21</sup>. The impact of methylation of a single BRCA1 copy, with retention or demethylation of another, on response to treatment remains unexplored. In support of BRCA1 methylation conferring an HR defect, it has been associated with the same gene expression signature and copy number alterations observed in BRCA1-mutated HGSOC<sup>25</sup> and, more recently, with genomic signatures suggesting HR deficiency in breast cancer<sup>26</sup>. Contrary to these observations, unlike for BRCA1/2 mutations, BRCA1 methylation has not been shown to impact survival in patients with OC, with multiple studies failing to observe a significant improvement in overall survival upon stratification by BRCA1 methylation status<sup>7,11,27,28</sup>. More recently in a clinical trial in triple-negative breast cancer, no benefit was observed for carboplatin in subjects with tumor-associated BRCA1 methylation, compared with BRCA1/2 mutation<sup>29</sup>. Further study of BRCA1 methylation is required to reconcile these observations.

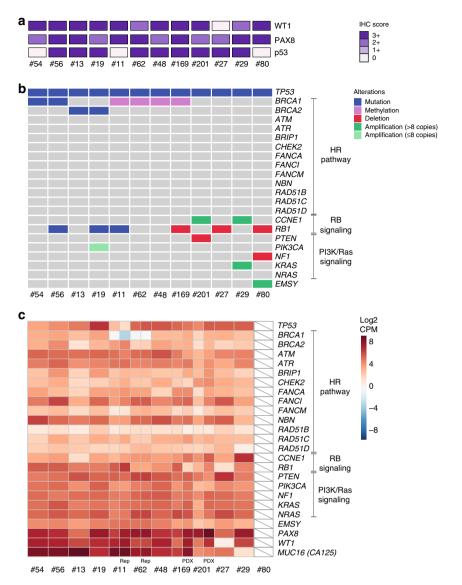
Use of PARPi therapy was previously proposed for cancers with *BRCA1* methylation<sup>30</sup>. A *BRCA1*-methylated breast cancer cell line displayed PARPi sensitivity; and *BRCA1* silencing as well

as PARPi sensitivity were abolished by the demethylating agent 5-azacytidine<sup>31</sup>. *BRCA1* methylation was also weakly associated with response to monotherapy with the PARPi rucaparib in the ARIEL2 Part 1 trial, but it was unclear which *BRCA1*-methylated cases would respond to treatment<sup>32</sup>. In contrast, in a study of long-term responders following maintenance therapy with PARPi after response to platinum, no long-term responders (>2 years) were found to have *BRCA1* methylation in their archival HGSOC<sup>33</sup>. Thus, the likelihood of PARPi response in patients with *BRCA1*-methylated HGSOC requires clarification.

Variable levels of BRCA1 promoter methylation, ranging from 5 to 100%, have been previously reported in breast and OC samples, with most studies assigning "methylation" status to samples when as little as 5–15% methylation is detected <sup>13,25,27,33</sup>. In some cases, this is consistent with low neoplastic cellularity. However, the possibility that methylation of all BRCA1 copies might be required to impact therapeutic outcome has not yet been addressed. Here we test the hypothesis that the zygosity status of BRCA1 methylation (homozygous or hemizygous vs. heterozygous) may have an impact on PARPi or platinum response and may be affected by treatment pressure, allowing for the rapid development of drug resistance. The terms "homozygous" and "homozygosity" used to define the methylation status in this paper will cover all cases where unmethylated alleles are absent, regardless of the BRCA1 copy number (Supplementary Fig. 1). Here we show that the rucaparib response of BRCA1methylated OC cell lines and patient-derived xenografts (PDX) depends upon the BRCA1 methylation zygosity. Further, we report quantitative methylation analysis of pre-treatment HGSOC samples from the ARIEL2 Part 1 PARPi trial, which is the only published clinical trial to date for which pre-treatment biopsies of cases documented to contain BRCA1 methylation are available. In this clinical trial setting, we also demonstrate that BRCA1 methylation zygosity correlates with rucaparib response.

### Results

Genomic characterization of HGSOC PDX. For this study, we have characterized PDX from 12 HGSOC patients, ten who were chemotherapy naive and two who had received multiple prior lines of therapy. Histologic assessment and WT1, PAX8, and p53 immunohistochemistry (IHC) staining confirmed that the PDX retained HGSOC features that were observed in the baseline carcinoma (Fig. 1a, Supplementary Fig. 2)<sup>34</sup>. The patient HGSOC and/or PDX whole tumor DNA samples were profiled using the Foundation Medicine T5a next-generation sequencing (NGS)based test and RNA sequencing (RNA-seq). In addition, each PDX was also capture-sequenced for mutations in DNA repair pathway genes, in particular mutations that could cause HR deficiency, as previously described<sup>9</sup>, and tested for BRCA1 promoter methylation. Apart from the expected somatic mutations in TP5335, mutations were also identified in BRCA1/2 in four HGSOC, one of which was confirmed to be germline (#56; Fig. 1b, Supplementary Fig. 3a, Supplementary Data 1). Other events that are commonly detected in HGSOC included RB1 mutation or deletion in six cases (#56, 19, 11, 169, 27, 80), NF1 deletion in one case (#80), and CCNE1 amplification in two cases (#29, 201). RNA-seq analysis, performed on the baseline patient HGSOC samples used to generate the PDX, confirmed the reduced expression of deleted genes and high expression of amplified genes (Fig. 1c, Supplementary Fig. 3b). In addition to deleterious BRCA1/2 mutations in four HGSOC, BRCA1 methylation was detected in four of the 12 HGSOC and in the corresponding PDX (#11, 62, 48, 169)<sup>34</sup>. The remaining four PDX were assigned an HR-DNA repair gene wild-type status, since no pathogenic mutations were detected in a curated set of HR pathway genes (Fig. 1b).



**Fig. 1** Genomic profiling of 12 HGSOC PDX. **a** IHC staining of PAX8, WT1, and p53 of passage one (T1) PDX tumors. Loss of p53 expression was observed for PDX #54 with a frameshift *TP53* mutation (p.G199fs\*8), #11 with a nonsense *TP53* mutation (p.E198\*), and #80 with a splice site *TP53* mutation (IVS6-IG>T). **b** Select genomic events detected by the Foundation Medicine T5a test, BROCA assay, and *BRCA1* promoter methylation testing. The Foundation Medicine T5a test was performed on PDX samples, except for case #48, where it was performed on patient HGSOC material. T5a test results and BROCA v4 assay results for PDX #11, #13, #27, #29, #56, and #62 were previously published<sup>34</sup>; BROCA v6 was performed for all other PDX<sup>34</sup>. **c** RNA-seq gene expression for genes with detected mutations or copy number changes. RNA-seq was performed on baseline patient HGSOC material samples. RNA-seq was also performed on PDX #169 and #201 samples, to verify expression levels observed in the matched HGSOC with suboptimal sample quality due to either low neoplastic cellularity or poor RNA quality (#80 inadequate quality); rep—RNA-seq library replicate

**Dose-dependent rucaparib responses in** *BRCA1/2* **mutant PDX**. To assess PARPi sensitivity, rucaparib was delivered by oral gavage 5 days a week for 3 weeks at one of the three dose levels—150, 300, or 450 mg kg<sup>-1</sup>. As expected, three of four PDX that were HR deficient due to *BRCA1/2* mutations responded to rucaparib in vivo (Table 1, Supplementary Data 2). Some mice bearing PDX #19 or #56 obtained durable regressions lasting more than 80 days (Fig. 2a, b). Despite being tested in the chemo-naive/first-line setting, without prior exposure to chemotherapy or PARPi, variable dose-dependent responses were observed, and not all *BRCA1/2* mutant HGSOC PDX were equally sensitive to PARPi (Table 1, Fig. 2a, b, Supplementary Fig. 4a, b).

Two of four BRCA1/2 mutant PDX responded to the lowest dose of rucaparib tested: BRCA2 mutant PDX #19 (median time to harvest (TTH) 74 days vs. vehicle 22 days, p = 0.012, log-rank test,

n = 4, 21) and BRCA1 mutant PDX #56 (median TTH 67 days vs. vehicle 15 days, p = 0.003, log-rank test, n = 5, 16) at 150 mg kg<sup>-1</sup>. The chemo-naive BRCA2 mutant PDX #13 had a statistically significant response to both 300 and 450 mg kg<sup>-1</sup> rucaparib, with median TTH of 81 days for rucaparib  $300~\text{mg}~\text{kg}^{-1}~\text{vs.}$  43 days for vehicle (p = 0.01, log-rank test, n = 9, 22), although regressions were not observed. Strikingly, PDX #54, with a pathogenic missense BRCA1 BRCT domain mutation (c.5095C>T, p.R1699W), was refractory to rucaparib in the first-line setting (median TTH for rucaparib 300 mg kg<sup>-1</sup> 36 days vs. vehicle 32 days, p = 0.9, log-rank test, n = 9, 4), possibly due to HSP90-mediated stabilization of the mutant BRCA1 protein, as has been observed with other BRCT domain-mutant BRCA1 proteins<sup>36</sup>. In further experiments, DNA sequencing failed to detect any secondary mutations in either BRCA1 or BRCA2 in these four PDX at recurrence (Supplementary Data 3).

PDX #	Baseline tumor	Patient response to platinum agents/PARP inhibitors <sup>a</sup>	HR gene defect	TTH vehicle	Cisplatin response in PDX				Rucaparib (300 mg $kg^{-1}$ ) response in PDX				Explored
					Response	Median TTH (days)	Average TTP (days)	p- value	Response	Median TTH (days)	Average TTP (days)	p-value	mechanisms of resistance to rucaparib in vivo
#54	Chemo- naive	Platinum sensitive <sup>a</sup> PARPi unknown	BRCA1: c.5095C>T	32	Resistant SD	78	50	0.010	Refractory PD	36	8	0.900	No secondary mutations; BRCA1 structural reversion predicted
#56	Chemo- naive	Platinum sensitive <sup>a</sup> PARPi 2 <sup>nd</sup> line single agent CR	BRCA1: c.894_895delTG	15	Sensitive CR	>120	113	<0.001	Response SD	95	53	<0.001	No secondary mutations
#13	Chemo- naive	Platinum resistant <sup>a</sup> <b>No PARPi</b>	BRCA2: c.5517_5518delA	43	Resistant PR	>120	99	<0.001	Minimal response SD	81	32	0.010	No secondary mutations
#19	Chemo- naive	Platinum sensitive <sup>a</sup> PARPi unknown	BRCA2: c.2323_2323delT	22	Sensitive CR	>120	>120	<0.001	Response CR	>120	>120	<0.001	No secondary mutations
#11	Chemo- naive	Platinum sensitive <sup>a</sup> PARPi 4 <sup>th</sup> line single agent PR for 11 months	BRCA1 methylation homozygous	46	Sensitive CR	>120	>120	<0.001	Not assessed	-	-	-	No loss of methylation
#62	Chemo- naive	Platinum sensitive <sup>a</sup> <b>No PARPi</b>	BRCA1 methylation homozygous	18	Resistant/ Refractory SD	60	46	<0.001	Response SD	71	50	<0.001	No loss of methylation
#48	Pre- treated	Platinum resistant PARPi 3rd line single agent refractory	BRCA1 methylation heterozygous	36	Resistant SD	>120	43	<0.001	Refractory PD	67	8	0.095	No further loss of methylation
#169	Pre- treated	Platinum refractory <b>No PARPi</b>	BRCA1 methylation heterozygous	29	Refractory PD	67	8	0.077	Refractory <sup>b</sup> PD	36	8	0.924	No further loss of methylation
#201	Chemo- naive	Platinum sensitive No PARPi	HR-DNA repair gene wild type	25	Resistant PR	99	57	<0.001	Refractory PD	46	8	<0.001c	-
#27	Chemo- naive	Platinum sensitive <sup>a,d</sup> <b>No PARPi</b>	HR-DNA repair gene wild type	22	Resistant PR	109	57	0.001	Refractory PD	36	8	0.887	-
#29	Chemo- naive	Platinum refractory <sup>a</sup> <b>No PARPi</b>	HR-DNA repair gene wild type	25	Refractory PD	32	8	0.128	Refractory PD	32	8	0.306	-
#80	Chemo- naive	Platinum sensitive No PARPi	HR-DNA repair gene wild type	53	Sensitive CR	>120	>120	0.021	Refractory PD	64	15	0.021 <sup>c</sup>	-

PDX were derived from the chemo-naive baseline patient HGSOC samples apart from PDX #48, derived from a patient who had undergone three prior chemotherapeutic regimens, and PDX #169, generated from ascites fluid (the only PDX in this study not to be derived from solid tumor) from a young woman whose HGSOC progressed 1 month after completing first-line therapy and was refractory to second-line platinum treatment. Bold—patient PARPi response

Variable rucaparib responses in PDX with BRCA1 methylation. In keeping with the proposed requirement of an HR defect for PARPi response, the four PDX derived from HGSOC lacking mutation of HR genes and BRCA1 promoter methylation showed no evidence of tumor regression or disease stabilization with rucaparib (Table 1, Fig. 2c, d, Supplementary Fig. 4c, d). In contrast, variable rucaparib responses were observed in models with BRCA1 methylation. Two chemo-naive baseline patient HGSOC samples and the corresponding PDX (#11 and #62), in which no pathogenic HR gene mutations were detected, were found to harbor BRCA1 methylation by methylation-specific PCR (MSP) as previously reported (Fig. 1b)<sup>34</sup>. Furthermore, two baseline patient HGSOC samples obtained from patients who had received prior treatment in the clinic and their corresponding PDX (#48 and #169) were also found to harbor BRCA1 methylation by MSP. No other pathogenic events in HR pathway genes were identified in these four HGSOC or corresponding PDX (Fig. 1b).

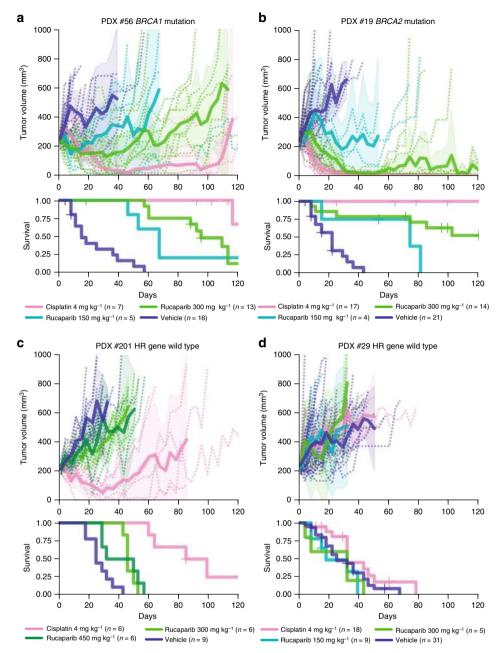
The methylation status of these PDX samples was re-assessed by both methylation-specific high-resolution melting (MS-HRM) and methylation-sensitive droplet digital PCR (MS-ddPCR). Seven co-methylated CpG sites of the BRCA1 promoter region were assessed; MS-HRM  $(-37, -29, -21, \text{ and } -19)^{37}$  and ddPCR (+14, +16, and +19). Two modes of *BRCA1* methylation were observed, with (i) homozygous methylation on all BRCA1 copies present and (ii) heterozygous methylation where both

methylated and unmethylated copies were observed (Fig. 3a, b, Supplementary Figs. 1 and 5). The two chemo-naive PDX (#11 and #62) were consistently found to harbor ~100% BRCA1 methylation and hence were assigned a homozygous status. The two PDX from HGSOC from patients treated with multiple lines of prior therapy (#48 and #169) were consistently found to harbor around 50% methylation and, therefore, were assigned a heterozygous status. The presence of two peaks in the MS-HRM analysis indicated that methylation was concordant across the four sites, as molecules with partial methylation would have intermediate melting temperatures and form more complex patterns (Supplementary Fig. 5). Analysis of the matched source patient HGSOC samples was also consistent with homozygous (#11 and #62) and heterozygous (#48 and #169) methylation of the BRCA1 promoter, although due to variable neoplastic purity in patient HGSOC samples, it was more challenging to estimate the proportion of methylated copies (Supplementary Data 4). RNA-seq, BRCA1 quantitative reverse transcription PCR (qRT-PCR) and western blotting (WB) analysis showed markedly reduced BRCA1 expression in the two source patient HGSOC samples and matched PDX models with homozygous methylation, but not in the two with heterozygous methylation, further supporting that methylation, mutation, or loss of all copies is required for BRCA1 silencing (Supplementary Fig. 6a-c, Supplementary Table 1)26. We assessed HR pathway activity by ex vivo

TTH time to harvest, TTP time to progression, SD stable disease, CR complete response, PR partial response, PD progressive disease <sup>a</sup>As previously reported <sup>34</sup>

<sup>&</sup>lt;sup>b</sup>Rucaparib 450 mg kg<sup>−1</sup> No tumor regressions or stabilization of disease was achieved despite significant p-value

dClinical trial involving standard chemotherapy with placebo/novel agent, followed by maintenance therapy with placebo/novel agent

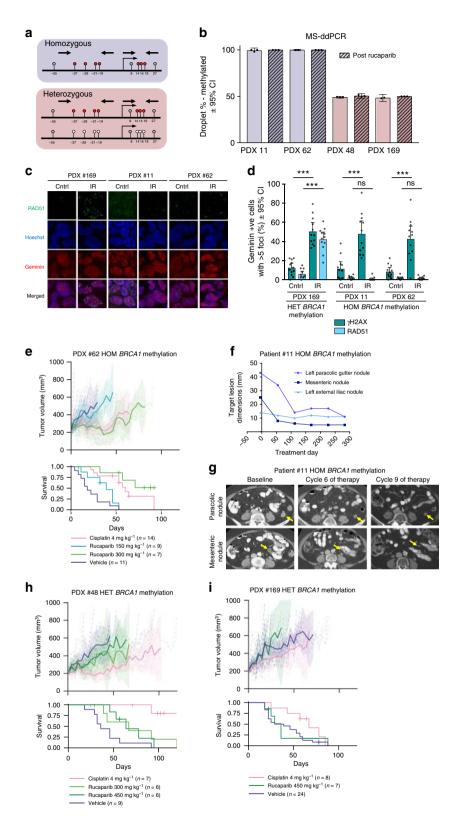


**Fig. 2** Cisplatin and rucaparib responses in *BRCA1/2* mutant and HR wild-type HGSOC PDX. Rucaparib and cisplatin response in **a** PDX #56 (*BRCA1* mutant); **b** PDX #19 (*BRCA2* mutant); **c** PDX #201 (HR-DNA repair gene wild-type); and **d** PDX #29 (HR-DNA repair gene wild-type). Recipient mice bearing PDX were randomized to treatment with vehicle or rucaparib, at the dose shown. PDX were harvested at a tumor volume of 600-700 mm<sup>3</sup>. Cisplatin response data for PDX #19, #56, and #29 were previously published<sup>34</sup>. See Table 1 and Supplementary Data 2 for median TTH and *p*-values for survival comparison. Mean tumor volume (mm<sup>3</sup>)  $\pm$  95% CI (hashed lines are representing individual mice) and corresponding Kaplan-Meier survival analysis. Censored events are represented by crosses on Kaplan-Meier plot; n = 1 individual mice

RAD51 foci formation assay, which showed formation of RAD51 foci in response to DNA damage in PDX #169, which harbored heterozygous methylation, but not in PDX #11 or PDX #62, which both harbored homozygous methylation (Fig. 3c, d, Supplementary Fig. 7).

One of the two chemo-naive PDX with homozygous BRCA1 promoter methylation (#62) responded to 300 mg kg<sup>-1</sup> rucaparib, with tumor regressions observed in two of seven mice (median TTH 71 days vs. vehicle 18 days, p < 0.001, log-rank test, n = 7, 11) (Table 1, Fig. 3e). This was notable, given that PDX #62 was resistant/refractory to cisplatin (defined as three or more mice with tumor progressing during cisplatin treatment) and was

characterized by the presence of multiple oncogene amplifications (Table 1)<sup>34</sup>. The other PDX with homozygous *BRCA1* methylation (#11), despite being exquisitely sensitive to platinum<sup>34</sup>, failed to respond to rucaparib at the low dose tested (150 mg kg<sup>-1</sup>) but was not exposed to 300 and 450 mg kg<sup>-1</sup> (Supplementary Data 2, Supplementary Fig. 6d). However, the patient from whom PDX #11 was derived subsequently received single-agent rucaparib with starting dose of 600 mg twice daily and had a partial response (PR) of 10 months as demonstrated by Response Evaluation Criteria In Solid Tumors version 1.1 (RECIST 1.1) (Fig. 3f, g), suggesting that in the PDX, a higher dose of rucaparib treatment in vivo may have been efficacious.



Conversely, no disease stabilization or tumor regression was observed in response to rucaparib for either PDX #48 or #169 both of which harbored heterozygous *BRCA1* promoter methylation (Table 1, Fig. 3h, i). In terms of the corresponding patient courses, case #48 progressed 4 months following third-line platinum therapy, at which point the disease was biopsied (PDX established) and she was subsequently treated with single-agent PARPi therapy, progressing after just 2 months. Case #169 had

platinum refractory disease and progressed within 1 month of first-line carboplatin/paclitaxel chemotherapy (PDX established from ascites) and did not receive a PARPi. Importantly, the heterozygous *BRCA1* methylation status in both cases reflected a change from baseline. DNA from archival patient HGSOC samples for cases #48 and #169 revealed homozygous *BRCA1* methylation in chemotherapy-naive ascites collected at diagnosis for both cases and also in the surgical debulking samples

Fig. 3 BRCA1 promoter methylation in HGSOC PDX and rucaparib response. a A diagram of two modes of BRCA1 promoter methylation observed in four PDX #11, #62, #48, and #169. Homozygous methylation status was assigned when % of methylation was close to 100%, therefore all observed copies were methylated. Heterozygous methylation status was assigned when both, methylated and unmethylated, copies were observed. b BRCA1 methylation in four HGSOC PDX (#62, #48, #169, #11) assessed by MS-ddPCR (mean ± 95% CI); n = 2-3 mice for each treatment and PDX model. c RAD51 foci formation 4 h after 10 Gy irradiation was observed in PDX #169 with heterozygous BRCA1 methylation and not in PDX #11 and PDX #62 with homozygous BRCA1 methylation. d Quantification of ex vivo yH2AX and RAD51 foci formation in geminin-positive cells 4 h after 10 Gy irradiation (mean ± 95% CI).  $\gamma$ H2AX foci are observed at the sites of DNA damage, and RAD51 foci are observed at the sites of HR pathway repair; n=12 (four fields of view from three independent experiments) for each treatment and PDX model. Untreated and irradiated cells were compared by multiple t-tests for yH2AX and RAD51 foci formation. \*\*\*p < 0.001; ns not significant. e Responses to cisplatin and rucaparib in vivo treatment observed in chemo-naive PDX #62 with homozygous BRCA1 methylation. f RECIST 1.1 measurements of three monitored tumor lesions in patient #11, with homozygous methylation of BRCA1, treated with rucaparib. g CT scans of the two largest monitored lesions prior to and during rucaparib treatment of the patient #11. h, i Responses to cisplatin and rucaparib in vivo treatment observed in PDX #48 and #169 with heterozygous BRCA1 methylation. Recipient mice bearing PDX were randomized to treatment with vehicle or rucaparib, at the dose shown. PDX were harvested at a tumor volume of 600-700 mm<sup>3</sup> (see Table 1 and Supplementary Data 2 for median TTH and p-values for survival comparison). Mean tumor volume (mm<sup>3</sup>) ± 95% CI (hashed lines are representing individual mice) and corresponding Kaplan-Meier survival analysis. Censored events are represented by crosses on Kaplan-Meier plot; n = individual mice. HOM homozygous, HET heterozygous

following neoadjuvant chemotherapy for both cases (Supplementary Data 4).

BRCA1 promoter methylation was also examined in PDX samples upon cancer recurrence following in vivo treatment with either cisplatin or rucaparib. No loss of homozygous BRCA1 methylation was observed for either PDX #11 or #62 following treatment with rucaparib or cisplatin (Fig. 3b). Similarly, no loss of heterozygous BRCA1 methylation or gain of homozygous methylation was observed for either PDX #48 or #169 following treatment with either cisplatin or rucaparib (Fig. 3b).

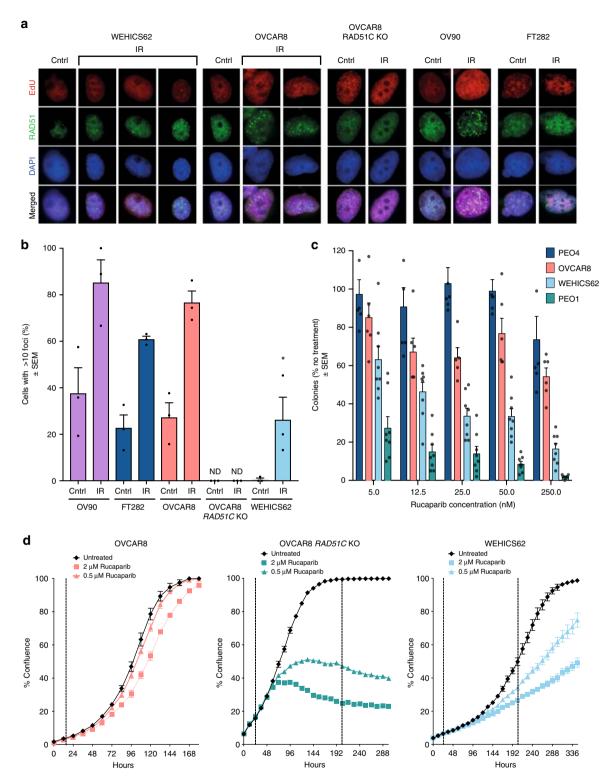
Variable rucaparib responses in BRCA1-methylated cell lines. To further study whether BRCA1 promoter methylation predisposes OC cells to rucaparib response through loss of the HR pathway activity, we generated a cell line from PDX #62 (WEHICS62) that retained homozygous BRCA1 methylation. Reduced expression of BRCA1 mRNA, consistent with silencing of BRCA1, was observed in RNA-seq and qRT-PCR analysis of the WEHICS62 cell line (two samples), the matched PDX (six samples), and the baseline patient HGSOC sample, compared to a PDX with unmethylated wild-type BRCA1 (Supplementary Fig. 6b, Supplementary Fig. 8). In contrast, OVCAR8, a cell line generated from a patient with OC refractory to carboplatin<sup>38,39</sup> and previously reported to harbor BRCA1 methylation<sup>40</sup>, was found to have heterozygous BRCA1 methylation when assessed by quantitative MS-ddPCR (~66% methylation with three copies of BRCA1, likely two methylated copies and one unmethylated copy) (Supplementary Table 2-3, Supplementary Fig. 9). Furthermore, BRCA1 expression was detected by qRT-PCR (Supplementary Fig. 6b). This finding was in keeping with our previous report of the ability of OVCAR8 cells to form RAD51 foci and resistance of the OVCAR8 cell line to both platinum and PARPi agents in vitro, both consistent with a competent HR pathway<sup>17</sup>.

The homozygous *BRCA1*-methylated cell line, WEHICS62, had a reduced capacity to form RAD51 foci in response to IR damage, as did an HR-deficient cell line derivative of OVCAR8 (with *RAD51C* KO), when compared to the heterozygous *BRCA1*-methylated OVCAR8 cell line, a second HR-competent OC cell line, OV90, or a normal immortalized fallopian tube epithelial cell line, FT282<sup>41</sup> (Fig. 4a, b). Colony formation and cell proliferation analyses revealed that WEHICS62 cells were sensitive to rucaparib, as were the HR-deficient cell line derivative of OVCAR8 (with *RAD51C* KO) and the *BRCA2*-mutant OC cell line PEO1<sup>42</sup>. In comparison, the parental OVCAR8 cell line with heterozygous *BRCA1* promoter methylation and the HR-

competent PEO4 OC cell line were not sensitive to rucaparib in vitro (Fig. 4c, d).

Rucaparib response in patients with BRCA1-methylated HGSOC. To investigate whether heterozygous and homozygous BRCA1 promoter methylation correlated with PARPi response in clinical samples, we used quantitative MS-ddPCR to analyze the archival and pre-treatment (study-entry) tumor biopsies from 21 patients who were identified to have BRCA1-methylated HGSOC from the cohort of 204 patients treated on the ARIEL2 Part 1 single-agent rucaparib trial<sup>32</sup> (detail provided in methods, Table 2, Supplementary Data 5). To determine BRCA1 methylation percentage and zygosity status in tumor cells, the raw MSddPCR percentage of methylated copies was adjusted for neoplastic cellularity and BRCA1 copy number. This adjustment was required because the expected proportion of observed unmethylated copies is dependent on the ratio of unmethylated somatic copies to tumor copies at the BRCA1 locus. A BRCA1 copy number of 1 was assigned in cases where LOH was consistently predicted by both the Foundation Medicine T5 test and the BROCA assay and a copy number of 1 was reported by the Foundation Medicine T5 test. Cases that had a single methylated BRCA1 locus and deletion of the second allele were classified as homozygous for BRCA1 methylation. Low estimated neoplastic cellularity (of 20%) precluded accurate determination of BRCA1 methylation zygosity in five out of 32 samples (archival and/or pre-treatment) tested from the 21 cases. Archival BRCA1 methylation zygosity status could be determined with high confidence for 17 cases: ten cases were homozygous and seven cases were heterozygous (four of which had surgery at the time of diagnosis).

In order to assess the impact of *BRCA1* methylation zygosity on PARPi response, as determined at the time of treatment commencement, we focused on ARIEL2 cases for which pretreatment biopsy samples were available for *BRCA1* methylation analysis. For 12 of the 21 *BRCA1*-methylated cases, sufficient material from pre-treatment tumor biopsies was available (Supplementary Data 5). Eight of the 12 cases (#15–21) had homozygous *BRCA1* methylation in the pre-treatment tumor biopsy, six of these (#16–21) were high confidence calls based on neoplastic cellularity of >20% (these six cases are hereafter referred to as the homozygous *BRCA1* methylation (high confidence) subgroup). Two of the 12 cases with material available for analysis (#1, 2) had homozygous and heterozygous *BRCA1* methylation, respectively, in the archival sample, and no evidence of methylation in the pre-treatment tumor biopsy



**Fig. 4** Assessment of HR deficiency and rucaparib sensitivity in *BRCA1*-methylated cell lines. **a** RAD51 foci formation assessed 6 h post exposure to 10 Gy irradiation in HR-competent OC cell line (OV90), immortalized fallopian tube cell line (FT282), OC cell line with heterozygous *BRCA1* methylation (OVCAR8), OVCAR8 derivative with *RAD51C* KO, and HGSOC cell line with homozygous *BRCA1* methylation (WEHICS62). **b** Quantification of RAD51 foci formation in EdU-positive cells for OV90, FT282, OVCAR8, OVCAR8 derivative with *RAD51C* KO, and WEHICS62. RAD51 foci formation ability was compared to the untreated controls. At least 170 EdU-positive cells were counted for each cell type and treatment (multiple fields of view from three independent experiments). Mean ± SEM. **c** Colony formation assay assessing rucaparib response at 14 days in HR-competent OC cell line (PEO4), at 10 days in OC cell line with heterozygous *BRCA1* methylation (OVCAR8) and HR-deficient OC cell line (PEO1), and at 21 days in HGSOC cell line with homozygous *BRCA1* methylation (WEHICS62); n = 3 independent experiments. Mean ± SEM. **d** In vitro rucaparib response assessed by cell count proliferation time course assay using IncuCyte ZOOM of OC cell lines OVCAR8, OVCAR8 derivative with *RAD51C* KO and WEHICS62. One of three similar independent experiments shown. Mean ± SEM; \* denotes p < 0.05 for post-IR WEHICS62 % comparison with irradiated OVCAR8 and OV90 counterparts. IR irradiated, Cntrl untreated control, ND not detected

Table 2 Degree of BRCA1 methylation in HGSOC where a pre-treatment biopsy was available for analysis in the ARIEL2 Part 1 clinical trial

Patient #	Archival sample					Pre-treatment biopsy						Best confirmed
	BRCA1me status	Estimated BRCA1me <sup>a</sup>	Neoplastic cellularity	BRCA1 CN	LOH FM/ BROCA	BRCA1me status	Estimated BRCA1me <sup>a</sup>	Neoplastic cellularity	BRCA1 CN	LOH FM/ BROCA	(months)	response
1	ном	84%	60%	2	Yes/yes	NO	0%	50%	2	Yes/-	20.1	SD
2	HET	45%	70.6%	2	Yes/-	NO	0%	34%	4	Yes/-	1.8	PD
7	$HET^b$	13%	40%	2	Yes/-	HET	55%	30%	2	Yes/no	14.2	PR
8	HET	41%	68.9%	2	Yes/no	HET	34%	63.1%	2	Yes/no	16.1	SDc
14	-	-	-	-	- '	$HOM^d$	77.1%	20%	NA	-/-	7.7	CR
15	ном	75.3%	70%	1	Yes/-	$HOM^d$	76.4%	20%	1	Yes/-	3.6	SD
16	HET <sup>b,d</sup>	8.4%	20%	NA	-/-	ном	74.6%	64.2%	1	Yes/-	18.3	PR
17	HET	34.9%	33.5%	NA	-/yes	ном	74.0%	62.4%	1	Yes/no	4.7	PR
18	ном	98.5%	55.8%	2	Yes/-	ном	85.6%	64.2%	3	Yes/-	17.2	PR
19	ном	92.4%	60%	2	Yes/yes	ном	101.2%	83.6%	2	Yes/ves	14.5	SD
20	ном	99.3%	52.3%	1	Yes/yes	ном	91.7%	30%	2	Yes/-	14.6	PR
21	ном	86.5%	92.7%	1	Yes/-	ном	76.4%	64%	1	Yes/-	7.2	PR

Neoplastic cellularity and BRCA1 copy number were based on the computational genome-wide copy number estimates, as outlined previously<sup>52</sup>. Italics—low confidence calls, bold—high confidence calls BRCA1me BRCA1 promoter methylation, CN copy number, LOH loss of heterozygosity, FM Foundation Medicine T5 test, BROCA—BROCA assay, PFS progression-free survival, HET heterozygous, HOM homozygous, NA not available, PR partial response, PD progressive disease, SD stable disease, CR complete response

(Table 2), consistent with loss of methylation. Two final cases (#7, 8) had heterozygous *BRCA1* methylation in both the archival sample and matched pre-treatment tumor biopsy.

We hypothesized that patients with homozygous BRCA1 methylation (high confidence) at the time of enrollment into the trial (n=6) would respond similarly to the BRCA1/2 mutant subgroup with higher response rates and a longer PFS than patients with BRCA1/2 wild-type tumors that had never been observed to have any BRCA1 methylation (BRCA1/2 wild-type non-BRCA1-methylated). The homozygous BRCA1 methylation (high confidence) subgroup had a median PFS of 14.5 months (95% CI 4.8–18.3, n=6) comparable to the BRCA1/2 mutant subgroup (12.8 months, 95% CI 9.0–14.7, n=40). Whilst not statistically significant, the PFS was longer for the high-confidence homozygous BRCA1-methylated group when compared to BRCA1/2 wild-type non-BRCA1-methylated cases (5.5 months, 95% CI 5.0–6.2, p=0.062, log-rank test, n=143) (Fig. 5a).

All homozygous BRCA1 methylation samples had high genomic LOH scores (>16%), an indirect marker of potential HR deficiency through genomic scarring<sup>6</sup> (Fig. 5b, Supplementary Fig. 10a). The mean LOH score for homozygous BRCA1-methylated cases was significantly higher than for BRCA1/2 wild-type non-BRCA1-methylated cases (27.9 vs. 15.9, p = 0.04, independent t-test). There were no significant differences observed in the mean genomic LOH scores between the homozygous BRCA1 methylation subgroup and the subgroup of other cases which had ever had any BRCA1 methylation (Table 2, Fig. 5b, Supplementary Fig. 10a), indicating that these samples may have harbored homozygous BRCA1 methylation in the past, leading to accumulation of genomic scarring.

The objective response rates in the high confidence homozygous BRCA1-methylated subgroup were significantly better compared to BRCA1/2 wild-type non-BRCA1-methylated cases (n=143 cases, p=0.0014, Fisher Exact test, Supplementary Table 4), with five of six (83%) patients with homozygous BRCA1 methylation detected in the pre-treatment biopsy achieving a PR and the sixth patient having a 33% reduction in target lesions that was not confirmed by subsequent CT scanning and was classified instead as stable disease (SD). A significant difference in reduction in the mean change in target lesion sizes was observed between the homozygous BRCA1-methylated groups and BRCA1/2 wild-type non-BRCA1-methylated cases (-53.9 vs. -13.5%, p=0.001, independent t-test, Fig. 5c, d, Supplementary Fig. 10b).

These findings indicated that cases with confirmed homozygous *BRCA1* promoter methylation were more likely to respond to rucaparib.

# **Discussion**

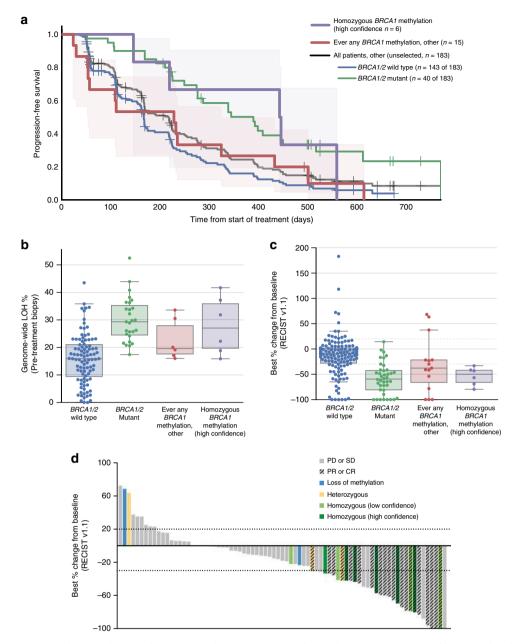
To improve our understanding of the sensitivity and resistance mechanisms to PARP inhibitors, both primary and acquired, we assessed the in vivo rucaparib response of 12 chemo-naive or post-treatment HGSOC PDX. Variable responses to rucaparib were observed in the four chemo-naive HGSOC PDX with BRCA1/2 mutations, ranging from complete response (CR) to progressive disease. Of note, PARPi response has not been tested in the chemo-naive setting in the clinic, but our results were in keeping with the range of single-agent PARPi responses reported for patients with recurrent BRCA1/2 mutant HGSOC<sup>1,32,43</sup>. We also explored mechanisms of acquired PARPi resistance by screening post-rucaparib treated PDX samples for the presence of reversion or secondary BRCA1/2 mutations and none were observed. None of the four PDX thought to be HR proficient showed regression or disease stabilization in response to rucaparib treatment in vivo.

Recently, the ARIEL2 Part 1 trial reported that OC with BRCA1 promoter methylation had increased levels of genomic LOH, a historical marker of HR deficiency, with some durable responses being reported<sup>32</sup>. To further investigate whether BRCA1 methylation sensitized HGSOC to PARPi, we focused on the four PDX harboring this epigenetic lesion. PDX models have the advantage that the human component of PDX samples is highly enriched for neoplastic cellularity in comparison with baseline patient samples. Two of the three orthogonal BRCA1 methylation assays used in this study were quantitative; either semi-quantitative (MS-HRM) or fully quantitative (MS-ddPCR), and both were human specific. As a result, we were able to observe two states of BRCA1 methylation, homozygous and heterozygous, in the four BRCA1-methylated PDX studied. When we took into account the zygosity status of BRCA1 methylation which importantly has not been systematically addressed in the literature with respect to clinical outcomes and association with response to PARPi or platinum<sup>29,33</sup>—we observed that the zygosity of each of the four BRCA1-methylated PDX correlated with the zygostity status of the source tumor used to generate PDX, and did not change under the pressure of subsequent in vivo treatment of the PDX. The two chemo-naive HGSOC and corresponding PDX with homozygous BRCA1 methylation showed

all both LOH estimation (RROCA and FM) were available and concordant, we estimated BRCA1 methylation % using copy number and neoplastic cellularity, otherwise we used neoplastic cellularity

Congoing without response

dLow neoplastic cellularity



**Fig. 5** Homozygous *BRCA1* methylation and rucaparib response in the ARIEL2 Part 1 trial. **a** Kaplan-Meier progression-free survival analysis of patients with HGSOC with homozygous *BRCA1* methylation in the pre-treatment tumor biopsy, which was of high confidence based on adequate neoplastic cellularity (homozygous *BRCA1* methylation (high confidence)), compared with patients with HGSOC in which there had ever been any other evidence of *BRCA1* methylation (ever any *BRCA1* methylation), compared with all other patients in the ARIEL2 Part 1 trial without any *BRCA1* methylation (*BRCA1/2* mutant vs. *BRCA1/2* wild-type non-*BRCA1*-methylated subgroups). Shaded areas represent 95% CI for homozygous *BRCA1* methylation (high confidence) and ever any BRCA1 methylation, other groups. **b** Genome-wide LOH % assessed in the pre-treatment biopsies compared across subgroups: homozygous *BRCA1* methylation (high-confidence), (n = 6); ever any *BRCA1* methylation, (n = 6); *BRCA1/2* mutant, (n = 27); and *BRCA1/2* wild-type non-*BRCA1*-methylated, (n = 96). Boxplot—median, whiskers—95% CI, dots represent individual samples. **c** Best percentage change from baseline in sum of longest diameter of target lesions according to RECIST 1.1 compared across subgroups: homozygous *BRCA1* methylation (high confidence), (n = 6); ever any *BRCA1* methylation, (n = 15); *BRCA1/2* mutant, (n = 40); and *BRCA1/2* wild-type non-*BRCA1*-methylated, (n = 143). Boxplot—median, whiskers—95% CI, dots represent individual samples. **d** Best percentage change from baseline in sum of longest diameter of target lesions according to RECIST 1.1 in the *BRCA* wild-type LOH-high subgroup of patients by *BRCA1* methylation status. Each bar represents percentage change from baseline in sum of the longest diameter of target lesions for an individual patient according to RECIST 1.1. In some patients, although best percentage change of >30% was observed, the response was not investigator confirmed and thus classified as stable disease (SD

low *BRCA1* expression by RNA-seq and responded to rucaparib in either the PDX or patient. Conversely, the two PDX with heterozygous *BRCA1* methylation and some expression of *BRCA1* by RNA-seq, had been generated from HGSOC treated with multiple lines of prior therapy and had failed to respond to rucaparib. In keeping with the possibility that partial loss of methylation may have occurred under treatment pressure, analysis of chemo-naive archival HGSOC samples for these two cases indicated homozygous *BRCA1* methylation. These PDX studies, coupled with earlier reports correlating complete *BRCA1* methylation and LOH at the *BRCA1* locus<sup>21</sup>, provide evidence that, as is the case for *BRCA1* mutated carcinomas<sup>26</sup>, silencing of all copies of *BRCA1* by promoter methylation is required to cause an HR defect of sufficient magnitude to induce PARPi-related synthetic lethality.

Consistent with these findings in PDX, we also observed that BRCA1 promoter methylation zygosity influenced PARPi response in OC cell lines. The OVCAR8 cell line has been reported to be methylated at the BRCA1 promoter, with reduction in BRCA1 mRNA and protein expression<sup>40,44</sup>, but nevertheless has been reported to be HR competent<sup>45</sup>. In keeping with this paradox, we found that despite having a genomic profile consistent with genomic scarring and HR deficiency<sup>46</sup>, OVCAR8 cells formed RAD51 foci in response to DNA damage and were resistant to PARPi in vitro, consistent with an intact HR pathway. Notably, the BRCA1 methylation status of OVCAR8 was heterozygous. In contrast, we generated a HGSOC PDX-derived cell line, WEHICS62, which retained homozygous BRCA1 methylation, had reduced ability to form RAD51 foci and was sensitive to rucaparib in vitro. The low number of cell lines reported to date with homozygous loss of BRCA1 or loss of function by mutation<sup>40,47</sup> suggests possible selection against BRCA1-deficient cells in two-dimensional culture. Thus, the zygosity status of BRCA1-methylated cell lines should be ascertained and reconfirmed regularly in studies where the HR status is critical.

In order to investigate BRCA1 promoter methylation zygosity in clinical samples, we studied 21 high-grade OC with BRCA1 methylation from the ARIEL2 Part 1 trial<sup>32</sup>. Establishing the zygosity of BRCA1 methylation in patient samples was more challenging than in PDX, due to the variability in the proportion of normal stroma within each clinical sample, as well as variation in BRCA1 gene copy number. We were able to identify six highgrade OC, in which we determined with high confidence that homozygous BRCA1 methylation was present at the time of trial enrollment (in the pre-rucaparib treatment biopsy, with neoplastic cellularity >20%). Consistent with our hypothesis that homozygous methylation was required for sensitivity to rucaparib, we observed a strong association between homozygous BRCA1 methylation and rucaparib response, compared to BRCA1/2 wild-type non-BRCA1-methylated cases. It would thus be important for patient selection/stratification to use a highly quantitative method for methylation assessment, as well as accurate estimation of neoplastic cellularity and BRCA1 copy number to determine the zygosity of BRCA1 methylation, even at diagnosis, when BRCA1-methylated cases might already have heterozygous rather than homozygous methylation. Indeed, our data strongly suggest that methylation zygosity should be assessed in contemporaneous tumor samples before any firm conclusions are drawn regarding the impact of BRCA1 methylation on therapeutic efficacy<sup>29,33</sup>.

Genomic scarring assays, such as percentage genomic LOH score, are indicative of defective HR DNA repair and are likely to identify HR-defective cases with homozygous *BRCA1* methylation. However, there will also be false-positive cases, where HR has been restored (e.g., through loss of methylation) yet the genomic scarring remains, reflecting a history of prior HR

deficiency rather than the current HR status. In keeping with this, LOH status (percentage genomic LOH score) was not different in the *BRCA1* homozygous methylated vs. "ever-methylated" cases in the ARIEL2 Part 1 trial. Furthermore, we identified cases in our clinical studies that supported the hypothesis that loss of methylation of the *BRCA1* promoter could occur under platinum treatment pressure. In our PDX studies, we observed altered zygosity of *BRCA1* methylation, from homozygosity in the chemo-naive archival clinical sample to heterozygosity in the previously-treated HGSOC patient source sample used to generate the PDX. Thus, heterozygous *BRCA1*-methylated cases may represent loss of methylation from an earlier homozygous *BRCA1* methylation and HR-deficient state, contributing to PARPi resistance.

A survival advantage has been demonstrated for BRCA1/2 mutated HGSOC treated with platinum-based therapies<sup>7</sup>, despite reversion of BRCA1/2 mutation occurring under treatment pressure<sup>14–16</sup>. However, a number of challenges may exist in demonstrating a survival advantage for BRCA1 promotermethylated HGSOC. The first is that our data suggest that cases need to be classified according to BRCA1 methylation zygosity. The second is that homozygous BRCA1 methylation loss may occur readily under chemotherapy pressure, as our analysis of the ARIEL2 data suggests, necessitating a pretreatment biopsy. Confirmatory studies of BRCA1 methylation zygosity in larger clinical cohorts will also be required; however, large PARPi trials in OC have focused on the maintenance setting, where tumor tissue immediately prior to PARPi has not been collected. The ARIEL2 Part 1 study is the only study to date which has routinely collected pre-treatment biopsies and which is of sufficient size to permit this analysis (204 patients enrolled with the expected case rate of BRCA1 methylation of ~10%, yielding 21 BRCA1-methylated cases, of which 12 had homozygous methylation in the archival biopsy, eight of which had homozygous methylation in the pre-treatment biopsy (six of which were of adequate tumor purity)). Given the difficulty in accessing additional similar or larger cohorts, our data support early scheduling of PARPi treatment, for example in the first-line maintenance setting, or as combination PARPi therapy upon first relapse, to minimize the population of malignant cells in which loss of methylation and consequently resistance to treatment can occur.

In summary, the study of PDX models, in which quantitative assessment of tumor BRCA1 promoter methylation is not obscured by stromal signal or complicated by variable copy number, enabled the observation that homozygous methylation and complete silencing of BRCA1 induces HR deficiency and PARPi sensitivity. By using a highly quantitative method and adjusting for neoplastic cellularity and BRCA1 copy number, we identified patients with homozygous BRCA1 methylation in the ARIEL2 Part 1 PARPi study and observed improved clinical outcomes. This study is the first to clarify the critical role of BRCA1 methylation zygosity in the response of carcinomas to PARPi and has potentially important clinical implications. Further development and refinement of methods to accurately and efficiently classify BRCA1 homozygous methylation status, and a suitably powered prospective clinical trial are required to validate our findings that homozygous BRCA1 methylation predicts PARPi sensitivity. Further, BRCA1 methylation loss in carcinomas exposed to chemotherapy underscores the importance of real-time pre-treatment biopsies to assess methylation as a predictor of response to treatment in women with recurrent HGSOC. As with secondary mutations in BRCA1/2, loss of methylation of BRCA1 under treatment pressure disables a therapeutic mechanism of response, suggesting that earlier introduction of PARPi therapy in the disease trajectory may

prevent such resistance mechanisms emerging under treatment pressure.

### Methods

Study approval. All experiments involving animals were performed according to the animal ethics guidelines and were approved by the Walter and Eliza Hall Institute of Medical Research Animal Ethics Committee. PDX were generated from OC, with patients enrolled in the Australian Ovarian Cancer Study. Informed consent was obtained from all patients, and all experiments were performed according to the human ethics guidelines. Additional ethics approval was obtained from the Human Research Ethics Committees at the Royal Women's Hospital and the Walter and Eliza Hall Institute.

**Patient samples.** Surgical, biopsy or ascites HGSOC samples used for PDX generation were collected from chemotherapy-naive patients who underwent surgery or patients treated with multiple lines of prior therapy. Clinical follow-up of patient outcome was obtained via the database at the Royal Women's Hospital. Archival tumor and pre-treatment biopsy samples from 23 patients used for re-testing of *BRCA1* promoter methylation were collected as part of the ARIEL2 Part 1 trial (NCT01891344)<sup>32</sup>. All clinical information used for interrogating rucaparib response in ARIEL2 Part 1 participating patients was collected as part of the ARIEL2 Part 1 trial<sup>32</sup>. Patient response was assessed according to RECIST 1.1.

**Generation and treatment of PDX**. PDX were generated as published previously by transplanting fresh fragments subcutaneously or via the intra-ovarian bursal approach into NOD/SCID/IL2Rynull recipient mice (T1, passage 1)<sup>34</sup>, with the exception of PDX #169, which was generated from tumor ascites. Briefly, tumor cells were isolated from ascites after centrifugation and red blood cell lysis. The tumor cells were resuspended in diluted Matrigel Matrix (Corning) and were subcutaneously injected.

Recipient mice bearing T2-T9 (passage 2 to passage 9) tumors were randomly assigned to treatment with rucaparib, cisplatin or vehicle when tumor volume reached 180-300 mm<sup>3</sup>. In vivo cisplatin treatments were performed as previously described<sup>34</sup>. The regimen for rucaparib treatment was oral gavage once daily (Monday–Friday) for 3 weeks at 150, 300, or 450 mg kg<sup>-1</sup>. Tumors were measured twice per week and recorded in StudyLog software (StudyLog Systems). Tumors were harvested once tumor volume reached 600-700 mm<sup>3</sup> or when mice reached ethical endpoint. Nadir, time to progression (TTP or PD), TTH, and treatment responses are as defined previously<sup>34</sup>. Tumor volume and survival graphs were produced with SurvivalVolume v1.2<sup>48</sup>. Median TTH was calculated by including censored events for PDX where mice were harvested when the tumor volume was >500 mm<sup>3</sup> but <600 mm<sup>3</sup> (for rucaparib response for PDX #62, 4 out of 6 mice). CR was achieved if the average tumor volume for the treatment group reduced to <50 mm<sup>3</sup> for two or more consecutive measurements. PR was achieved if the average tumor volume reduced to between 50 and 140 mm<sup>3</sup> (>30% reduction from nadir, assigned as 200 mm<sup>3</sup>) for two or more consecutive measurements. SD was achieved if TTP for the treatment group was at least twice as long as TTP for the corresponding vehicle group.

Cell lines and culture. The human OC cell line OVCAR8 was obtained from the NCI. Early passages of the parental OVCAR8 and RAD51C KO 2-130 were cryopreserved, and were last authenticated by STR profiling in April 2017. Subsequent revivals were used within 6 months. OC cell line WEHICS62 was generated from PDX #62, by digesting cells with human tumor dissociation kit (Mitenyl Biotec) with gentleMACS dissociator, and then enriching for viable Epcam (347197 1:30; BD) positive cells using flow cytometry. Early-passage were viably stored; subsequent thaws were used within 6 months. The STR profile for WEHICS62 was generated in April 2017: Amelogenin-X; CSF1PO-allele 12; D13S317-allele 9; D16S539—allele 13; D21S11—alleles 29, 30; D5S818—allele 7; D7S820—allele 9; TH01-allele 7; TPOX-allele 8; and vWA-alleles 17, 18. The PEO4 and PEO1 cell lines were obtained from F. Couch (Mayo Clinic) in 2013 and viably stored until 2016. Subsequent thaws were used within 6 months; were last authenticated by STR profiling in April 2017. All cell lines were routinely tested and shown to be negative for Mycoplasma. Cell lines were cultured in RPMI-1640 (Corning) supplemented with 10% FBS (Peak Serum) and 1% penicillin and streptomycin (Corning) or in DMEM/F12, GlutaMAX with  $5 \mu g \text{ ml}^{-1}$  insulin,  $50 \text{ ng ml}^{-1}$  EGF, and 1 µg ml<sup>-1</sup> hydrocortisone in a 5% CO<sub>2</sub> atmosphere at 37 °C. FT282 cells were grown in DMEM:Ham's F12 (50:50) without HEPES in the presence of Ultroser G serum substitute.

**Compounds**. Rucaparib camsylate salt was manufactured by Lonza. Cisplatin was obtained from Pfizer.

**RAD51 foci formation assay**. For RAD51 foci assay in cell lines, cells were first treated with 10 mM EdU, then shortly after irradiated with 10 Gy. Cells were fixed 6 h post irradiation with 10% paraformaldehyde, permeabilized with 0.3% TritonX-100, blocked with blocking buffer (5% goat serum, 0.3% TritonX-100 in PBS), and incubated with rabbit anti-human RAD51 (ab63801 1:100; Abcam), followed by

incubation with goat anti-rabbit 488 secondary antibody (1:600; Invitrogen). Cells were incubated for 30 min at room temperature in Click-IT reaction (100 mM Tris pH 8.5, 10 nM Alexa Fluor 647-azide (Cat# A10277, Thermo Fisher Scientific), 1 mM  $\rm CuSO_4$ , and 100 mM ascorbic acid), then washed with PBS. Nuclei were counterstained with DAPI in Vectashield mounting media (Vector Labs). Images were acquired on an Olympus BX-61 microscope equipped with a Spot RT camera (model 25.4), using the Spot Advanced software. EdU positive cells with more than 10 RAD51 foci/nucleus were manually scored. At least 170 cells from three independent experiments were counted.

For ex vivo RAD51 foci assay, tumor tissue was first harvested, then placed in cell culturing medium and shortly after irradiated with 10 Gy or left untreated. Tissue fragments were fixed 4 h post irradiation for 2 h with 4% paraformaldehyde, then incubated in 10, 20, and 30% sucrose, embedded in Tissue-Tek® O.C.T. (optimal cutting temperature) compound (Sakura Finetek), and 4 µm sections were cut. Following antigen retrieval with pH 6 citrate buffer (Dako) in a pressure cooker, sections were permeabilized for 20 min with 0.2% Triton-X, washed in DPBS, and blocked for 30 min with blocking buffer (1% bovine serum albumin, 2% fetal bovine serum in DPBS). Sections were incubated overnight at 4 °C with rabbit anti-human RAD51 (ab133534 1:100; Abcam) or rabbit anti-human yH2AX (20E3 1:200; Cell Signaling), washed with DPBS, then incubated for 1 h at room temperature (RT) with anti-rabbit 488 secondary antibody (1:800; Invitrogen), washed with DPBS, then incubated for 1 h at RT with mouse anti-human Geminin (ab104306 1:100; Abcam), washed with DPBS, then incubated for 1 h at RT with anti-mouse 546 secondary antibody (1:800, Invitrogen) and Hoechst (1 drop ml-1), then washed with DPBS and mounted with Fluoromount-G® (SouthernBiotech). All antibody dilutions were done with blocking buffer. Sections were imaged using a LSM 780 inverse laser scanning microscope (Zeiss) and captured with an LSM T-PMT detector (Zeiss) using z-stacks. Z-stacks were flattened using Z projection function with maximum intensity in Fiji software. At least 230 cells from four fields of view and three independent experiments were counted. Cells with ≥5 RAD51 or γH2AX foci/geminin-positive nucleus were scored using CellProfiler (version 2.2.0, Broad Institute).

**Cell proliferation assay.** Cell count proliferation assay was performed using IncuCyte ZOOM system according to the manufacturer's protocol. Briefly, cells were seeded (OVCAR8 at 500 cells; OVCAR8-RAD51C KO and WEHISC62 at 2000 cells) in 96-well plates and incubated overnight before adding treatments. Cells were treated for up to 14 days with rucaparib at 0.5 or 2  $\mu$ M or medium. Medium with rucaparib or without rucaparib was replenished at 7 days.

Colony formation assay. Colony formation assay was performed on OC cell lines PEO4, PEO1, OVCAR8, and WEHICS62. Briefly, cells were seeded at 100 cells in 6-well plates and incubated overnight before adding treatments. Cells were treated with rucaparib at 5, 12.5, 25, 50, and 250 nM or equivalent amount of DMSO (no treatment control). The experiment was terminated when colonies formed in cultures without treatment (PEO4 cells fixed at 14 days; OVCAR8 and PEO1 cells fixed at 10 days; WEHICS62 cells fixed at 21 days). Colonies were fixed with 0.5% Crystal Violet and 20% methanol for 20 min. Colonies were counted blindly by three individuals, and then the average count was taken for each replicate.

Immunohistochemistry. Staining was performed using an automated platform with a DAKO Omnis (Agilent Pathology Solutions) on all first-generation PDX samples (T1) to confirm the retention of HGSOC characteristics when compared to the clinical pathology report, or in-house staining, at the time of sample collection. The following antibodies were used: p53 (M700101 1:100; Dako), Ki67 (M7240 1:50; Dako), Cytokeratin (M3515 1:200; Dako), PAX8 (10336-1-AP 1:20000; Proteintech), and WT1 (ab15249 1:800; Abcam). CD45 (M0701 1:500; Dako) was used to exclude donor-derived transplantable hematologic malignancy. Scoring was performed for each PDX by one investigator on one tumor section each from at least three independent mice bearing that PDX and from the relevant baseline patient tumor. Usually ten high-powered fields (for some only five were available) were surveilled and the staining estimated as follows: 3+ almost all tumor cells were strongly positive; 2+ >25% of tumor cells were strongly positive or nearly all tumor cells were moderately positive; 1+ <25% of tumor cells were moderately to strongly positive, or nearly all cells were weakly positive; 0 occasional positive cells only.

**Genomic analyses and qRT-PCR.** RNA-seq was performed on 12 baseline patient HGSOC samples used to generate PDX, and on two PDX samples (#169 and #201) to verify expression levels observed in the matched HGSOC with suboptimal sample quality due to either low neoplastic cellularity or poor RNA quality. Libraries were prepared using TruSeq RNA Library Prep Kit v2, and the sequencing was performed on the Ilumina HiSeq 2500 platform to read length of 50 bp (Australian Genome Research Facility). Reads were mapped to Human GRCh38 (GCA\_000001405.15) with dbSNP150 and Ensembl 90 annotation using HISAT2<sup>49</sup>, and annotated against dbSNP150 and Ensembl 90. Counts were done using HTSeq<sup>50</sup>, and TMM normalization was performed<sup>51</sup>. Expression plots were produced using Matplotlib. Baseline patient HGSOC sample #80 had to be

excluded from final analysis as it failed alignment QC due to high proportion of multi-mapping reads.

For qRT-PCR BRCA1 assay, RNA was converted to cDNA using Superscript III Reverse Transcriptase (Invitrogen), and qPCR was performed using SYBR Green PCR Master Mix (Applied Biosystems) following manufacturer's instructions. Primer sequences are listed in Supplementary Table 5. Ct values for each sample were normalized to the average Ct values of four different housekeeping genes (HPRT1, ACTB, SDHA, and GAPDH), and resulting values were used to calculate fold-change of BRCA1 expression for each sample.

Baseline patient HGSOC samples used to generate PDX or PDX samples were sequenced using Foundation Medicine's NGS-based T5a assay<sup>52</sup>. Analyzed data were plotted using OncoPrint. HR-DNA repair gene mutations were assessed by sequencing of PDX samples using the NGS-based BROCA assay: PDX #11, #13, #27, #29, #56, #62 were analyzed using BROCA v4 assay and were previously published<sup>34</sup>; and all others were analyzed by BROCA v6 (Supplementary Data 6).

Copy number analysis of BRCA1 was performed using MLPA-seq assay as previous described<sup>53</sup>. Amplicon sequencing of TP53 gene was performed on the patient HGSOC and PDX samples to estimate the neoplastic cellularity proportion. Amplicon libraries were prepared and sequenced as previously described 17, with primers listed in the Supplementary Table 5. Samples from the four BRCA1/2 mutant HGSOC were screened for reversion mutations by NGS and Sanger sequencing. Sanger sequencing was performed to amplify target regions in PDX #13, #19, #54, and #56. Long-range PCR was used to amplify target regions in PDX #19 and #56 samples, with primers specified in Supplementary Table 5. Briefly, 100-120 ng of DNA was amplified with TaKaRa LA Taq polymerase (Takara Bio Inc) or Phusion Polymerase (Thermo Fisher Scientific) using the following cycling conditions: initial denaturation at 94 °C for 1 min or 98 °C for 30 s (respectively), followed by 30 cycles of 94 °C or 98 °C for 15 s, 60-62.8 °C for 30 s or 64-58 °C (-0.2 °C sec<sup>-1</sup>) for 20 s (respectively), and 68 °C for 15 min or 72 °C for 3 min (respectively), followed by final extension at 72 °C for 10 min. Long-range PCR products were cleaned using Agencourt AMPure XP (Beckman Coulter) beads at 1:0.4 ratio following the manufacturer's protocol then processed using the Nextera XT DNA Library Preparation Kit (Illumina) according to manufacturer's protocol. The libraries were sequenced using a 300-cycle MiSeq Nano Reagent Kit v2 (Illumina).

**Promoter methylation analysis.** Promoter methylation of *BRCA1* PDX samples was determined by methylation-sensitive PCR as previously described<sup>21</sup>. *BRCA1* methylation was confirmed by MS-HRM, as previously described<sup>24</sup>. Quantification of *BRCA1* methylation levels in PDX sample series, cell lines, and ARIEL2 Part 1 patient sample series was assessed by a quantitative MS-ddPCR methodology. DNA was bisulfite converted using the EZ DNA Methylation-Lightning kit (Zymo Research). Primers were designed for a 72 bp amplicon in the *BRCA1* UTR. MGB probes hybridizing to the fully methylated (VIC labeled) and the fully unmethylated sequences (FAM labeled) were used. Droplet digital PCR was performed on the Bio-Rad QX-200 system.

**Western blotting.** Nuclear lysates were prepared from snap frozen tumor fragments. Western blotting was carried out using NE-PER Nuclear and Cytoplasmic Extraction Reagents (Thermo Scientific) as previously described<sup>54</sup> and proteins were detected using the following antibodies: BRCA1 (OP92-MS110 1:500, Calbiochem) and Tubulin (2148 1:2000, Cell Signaling).

Analysis of ARIEL2 Part 1 clinical trial cases. Of 204 patients included in the ARIEL2 Part 1 clinical trial and treated with single-agent rucaparib, 23 cases had evidence of BRCA1 promoter methylation according to prior MSP analysis<sup>32</sup>. For these 23 cases, we assessed BRCA1 methylation in a second DNA extraction from the same tumor sample by MS-ddPCR. Two of the 23 cases were excluded from the BRCA1-methylated subgroup because assessment did not confirm BRCA1 methylation. Of the 21 samples with BRCA1 methylation by MS-ddPCR, pretreatment biopsies were available for 12 cases, eight of which had homozygous BRCA1 methylation, and six of these were of high confidence based on adequate neoplastic cellularity (high-confidence homozygous BRCA1 methylation, n = 6). The other 15 cases were included in the "ever any BRCA1 methylation" subgroup as they had other evidence of BRCA1 methylation, which was not high-confidence homozygous methylation in the pre-treatment biopsy. These cases were compared to all other HGSOC from the ARIEL2 Part 1 trial without any evidence of BRCA1 methylation (204 cases, minus 21 cases = 183 cases), subdivided by BRCA1/2 mutant (n = 40 cases) and BRCA1/2 wild-type (BRCA1/2 wild-type non-BRCA1methylated n = 143 cases) status.

**Statistics**. Statistical analysis was performed to compare the high-confidence homozygous BRCA1-methylated subgroup of patients (homozygous BRCA1 methylation (high confidence), n=6 cases) with the subgroup of cases with any other evidence of BRCA1 methylation (ever any BRCA1 methylation, n=15 cases), or with the BRCA1/2 mutant subgroup (n=40) or the BRCA1/2 wild-type non-BRCA1-methylated subgroup (n=143). Statistical analysis was performed in

Python 3.6.1 using the pandas v0.20.2, lifelines v0.11.1, seaborn v0.8.1, matplotlib v2.0.2, and scipy v0.19.1 packages. Comparisons were made between high-confidence homozygous *BRCA1*-methylated subgroup of patients and the *BRCA1/2* wild-type non-methylated subgroup. No statistical comparison was made between the high-confidence homozygous *BRCA1*-methylated subgroup of patients and the ever any *BRCA1* methylation subgroup, as the latter group contains low confidence homozygous and ambiguous cases. Fisher Exact test was used to compare the investigator-confirmed best response, independent *t*-test was used to compare the minimum percentage change of target lesion, and Kaplan–Meier analysis and log rank test were used to compare PFS.

# Data availability

Access to data including RNA-seq can be requested through Walter and Eliza Hall Institute of Medical Research Data Access Committee by contacting dataaccess@wehi. edu.au. The data are not publicly available due to them containing information that could compromise research participant privacy and consent.

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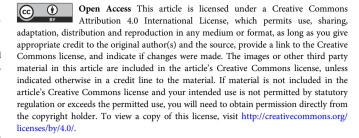
### Additional information

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