Ang et al; Plasma metabolites predict response to MEK inhibitor.

**RESEARCH ARTICLE**

Modulation of plasma metabolite biomarkers of MAPK pathway with the MEK inhibitor RO4987655: pharmacodynamic and predictive potential in metastatic melanoma.

**AUTHORS:** Joo Ern Ang1,2*, Akos Pal1*, Yasmin J Asad1, Alan T Henley1, Melanie Valenti1, Gary Box1, Alexis de haven Brandon1, Victoria L Revell5, Debra J. Skene5, Miro Venturi6, Ruediger Rueger3, Valerie Meresse4, Suzanne A Eccles1, Johann S de Bono1,2, Stanley B Kaye1,2, Paul Workman1, Uda Banerji1,2, Florence.I Raynaud1,2

**AFFILIATIONS:**
1Cancer Research UK Cancer Therapeutics Unit, The Institute of Cancer Research, London SW7 3RP, UK  
2Drug Development Unit, The Royal Marsden NHS Foundation Trust, Sutton SM2 5PT, UK  
3Roche Pharmaceutical Research and Early Development, Translational Medicine Oncology, Roche Innovation Center Penzberg, Penzberg, Germany  
4Roche Pharmaceutical Research and Early Development, Translational Medicine Oncology, Roche Innovation Center Basel, Basel Switzerland  
5Faculty of Health and Medical Sciences, University of Surrey, Guildford GU2 7XH, United Kingdom  
6F. Hoffmann-LaRoche Ltd., Diagnostics Division, DIA Biomarker Group, Basel, Switzerland

*J. E. Ang and A. Pal contributed equally and are joint first authors.

**CORRESPONDING AUTHOR:**
Dr Florence Raynaud  
Drug Metabolism, Pharmacokinetics & Metabolomics Group  
Cancer Research UK Cancer Therapeutics Unit  
The Institute of Cancer Research,  
Sutton SM2 5NG, UK
Ang et al; Plasma metabolites predict response to MEK inhibitor.

Tel: +44 (0)2087224383
Fax: +44 (0)2087224309
Email: Florence.Raynaud@icr.ac.uk

RUNNING TITLE: Plasma metabolites predict response to MEK inhibitor.

KEYWORDS: metabolomics, MEK, pharmacodynamics, plasma biomarker, amino acids, phospholipids

ACKNOWLEDGEMENTS FOR RESEARCH SUPPORT: F.I.R., P.W., S.A.E., A.D.H.B., G.B., M.V., A.H., Y.A, A.P. are supported by a Cancer Research UK programme grant (C309/A11566) at the Cancer Research UK Cancer Therapeutics Unit. P.W. is a Cancer Research UK Life Fellow (C309/A8992). J.E.A. was supported by a Wellcome Trust PhD studentship grant (090952/Z/09/Z) as part of the Wellcome Trust PhD programme in mechanism-based drug discovery research project at The Institute of Cancer Research which is directed by P.W. The Phase I clinical trial was supported by Roche. The Drug Development Unit, the Royal Marsden NHS Foundation Trust and The Institute of Cancer Research. Support was also provided by the Experimental Cancer Medicine Centre grant to The Institute of Cancer Research and from the National Health Service to the National Institute for Health Research Biomedical Research Centre at the Institute of Cancer Research and the Royal Marsden Hospital.
Ang et al; Plasma metabolites predict response to MEK inhibitor.

ABSTRACT

MAPK pathway activation is frequently observed in human malignancies, including melanoma, and is associated with sensitivity to MEK inhibition and changes in cellular metabolism. Using quantitative mass spectrometry-based metabolomics, we identified in preclinical models 21 plasma metabolites including amino acids, propionylcarnitine, phosphatidylcholines and sphingomyelins that were significantly altered in two B-RAF mutant melanoma xenografts and that were reversed following a single dose of the potent and selective MEK inhibitor RO4987655. Treatment of non-tumour bearing animals and mice bearing the PTEN null U87MG human glioblastoma xenograft elicited plasma changes only in amino acids and propionylcarnitine. In patients with advanced melanoma treated with RO4987655, on-treatment changes of amino acids were observed in patients with disease progression and not in responders. In contrast, changes in phosphatidylcholines and sphingomyelins were observed in responders. Furthermore, pre-treatment levels of 7 lipids identified in the preclinical screen were statistically significantly able to predict objective responses to RO4987655. The RO4987655 treatment-related changes were greater than baseline physiological variability in non-treated individuals. This study provides evidence of a translational exo-metabolomic plasma readout predictive of clinical efficacy together with pharmacodynamic utility following treatment with a signal transduction inhibitor.
INTRODUCTION

The MAPK cascade (the Ras/Raf/MEK/ERK pathway) is a receptor tyrosine kinase-mediated signaling pathway that regulates cell proliferation, cell cycle progression, and cell migration (1). The frequent constitutive activation of RAS and RAF proteins has been well-established in human malignancies (2). Mutations in the genes encoding members of the RAF protein family have been documented in 20% of cancers and 66% of melanomas (2-6). This pathway has been targeted at various loci and inhibitors of B-RAF, MEK and ERK have been developed (7). A number of MEK inhibitors such as trametinib and RO4987655 have shown activity in B-RAF and N-RAS mutant metastatic melanoma (8, 9). In these studies, currently utilised biomarkers including B-RAF and NRAS mutations but those are not completely predictive, and responses are observed in patients not harboring these mutations (10).

We have previously shown that plasma metabolite markers of PI3K inhibition identified in mouse models were confirmed in a Phase I clinical trial of pictilisib (GDC-0941). The changes observed are consistent with the insulin resistance phenotype developing upon treatment with PI3K inhibitors (11). In the present study, we evaluated whether circulating metabolites also represent attractive biomarkers to assess the sensitivity and response to MEK inhibitors. We implemented an exploratory screen for plasma metabolites exhibiting changes associated with MAPK modulation using a validated quantitative liquid chromatography-tandem mass spectrometry-based metabolomic analysis (Biocrates Absolute IDQ ®p180 kit). We first compared plasma samples from female athymic mice bearing xenografts of B-RAF mutant WM266.4 and A375 human melanoma with their non-tumor bearing age-matched littermates. We next evaluated the effect of a single dose of RO4987655 on the plasma metabolite concentrations in treated animals compared with vehicle controls. We identified a metabolomics signature consistent with MAPK activation and reversed by treatment with the MEK inhibitor. We then evaluated this signature in U87MG glioma xenografts which are driven by loss of PTEN (and thus an activated PI3 kinase pathway) following treatment with the MEK inhibitor RO4987655.
Ang et al; Plasma metabolites predict response to MEK inhibitor.

We tested the hypothesis that the levels of these plasma metabolites may reflect the degree of MAPK pathway activation (e.g via \textit{B-RAF} mutation); and that these novel biomarkers may be predictive of clinical outcome in addition to having pharmacodynamic utility following MEK inhibitor therapy. We tested our preclinical metabolomic signature in 35 evaluable patients with relapsed, metastatic melanoma treated with RO4987655, at the maximal tolerated dose in a non-randomized open-label Phase I clinical trial (12). We examined the effect of treatment on metabolite concentrations and the relationship between pre-treatment baseline levels of the metabolite biomarker candidates and objective response determined by RECIST criteria (12) in 35 patients. Time-of-day variation can impact significantly the plasma metabolome (13, 14). To assess the potential confounding impact of this factor on the candidate biomarkers, we studied the degree of variation of these metabolites in 35 subjects with advanced melanoma and in 12 healthy male volunteers over 24h.

We show that the metabolomics signature identified in the preclinical setting in the sensitive melanoma xenografts is recapitulated in patients and that baseline levels of 7 candidate biomarkers are prognostic of clinical response.
Ang et al; Plasma metabolites predict response to MEK inhibitor.

MATERIALS & METHODS

In the exploratory preclinical screening studies, we compared plasma from female athymic mice 6-8 weeks of age inoculated subcutaneously with human WM266.4 or A375 (B-RAF mutant) melanoma cells with samples from their age-matched non-tumor bearing controls. Next, tumor-bearing and non tumor-bearing animals were randomized to receive the maximum tolerated dose of RO4987655 (6mg/kg) or cremaphor/methanol/water (1/1/3) vehicle. RO4987655 was provided by Chugai. We selected plasma metabolites that were different in tumor bearing mice compared with non-tumor bearing controls and changes that were reversed by addition of a single dose of the MEK inhibitor in both xenograft models.

A metabolic signature identified from these studies was then tested in the PTEN (-/-) null U87MG human glioblastoma xenograft. The signature was also tested in the Phase I clinical study with RO4987655 in patients with advanced metastatic melanoma. Finally we applied the MEK signature to patients with advanced solid tumors in a Phase I clinical study of the PI3K inhibitor pictilisib (clinicaltrials.gov identifier: NCT00876122)(15, 16).

Preclinical human tumor xenograft studies

All animal experiments were conducted in accordance with local and UK National Cancer Research Institute guidelines (17). WM266.4 melanoma cells (ATCC lot #3272826, 13/02/03), A375 (ATCC lot #61573377 07/07/2015 2015) and U87MG glioblastoma cells (ATCC lot unavailable; obtained 10/07/2008) were profiled and authenticated in house (2015). Cell lines were analyzed by short tandem repeat (STR) profiling. Polymorphic STR loci were amplified using a PCR primer set. The PCR product (each locus was labelled with a different fluorophore) was analysed simultaneously with size standards by using an automated fluorescent detection technique. The number of repeats at 7-10 different loci defines the STR profile and was cross-referenced with online databases to confirm authenticity. All cell lines showed 100% match and were mycoplasma negative.

For pharmacodynamics and metabolomics experiments 2 million cells were injected subcutaneously bilaterally into the flanks of female NCr athymic mice 6-8 weeks of age, bred in-house. During the experiment, food pellets (Certified Rodent Diet 5002, Labdiet, Indianapolis, Indiana, USA) and water were
Ang et al; Plasma metabolites predict response to MEK inhibitor.

available ad libitum. Dosing of the animals was undertaken synchronously under sterile conditions in the same experiment when tumors were well-established and approximately 8-10 mm in diameter. A single dose of 6mg/kg RO4987655 was administered p.o. in cremaphor/methanol/water Control animals received an equivalent volume of vehicle. Blood and tumor samples were collected at the following times after drug administration: 2, 4, 8 and 24 h (WM266.4); 2, 4 and 8 h, (A375) and 2, 8 and 24 h (U87MG). Five mice were used for each time point per treatment. For therapy studies, 3 million cells were injected subcutaneously into right flanks and mice (10/group) were dosed p.o. with 6mg/kg RO4987655 or with vehicle for 12 (WM266.4) or 16 days (A375).

In pharmacodynamics, metabolomics and therapy studies, blood samples were collected (using sodium heparin as anticoagulant) and tumors were snap frozen. The blood samples were centrifuged at 13000 rpm for 2 min and the plasma transferred onto dry ice; the entire process from collection to storage in dry ice took less than 5 min per sample. Plasma and tumor samples were stored at -80°C until further analysis.

Meso Scale Discovery (MSD)® assay

Meso Scale Discovery (MSD) 96-well multispot assays were carried out according to the manufacturer's protocol with minor modifications. Briefly, ERK1/2 (duplex) plate was blocked (MSD blocking solution, as recommended by the manufacturer, plus 0.1% bovine serum albumin (BSA)) for 1 h at room temperature with shaking and then washed four times. Ten μg of total protein of tumour homogenates were added in duplicate wells and incubated overnight at 4 °C. Plates were washed as previously; then 25 μl of detection antibody was added and incubated at room temperature for 2 h with shaking. Plates were washed four times, 150 μl of read buffer was added, and the plates were analyzed on a MESO QuickPlex SQ 120. The two additional spots in each well coated with BSA were used to correct for the background and for any effects of the lysis buffer. Data shown are the mean values of left and right tumors of the pharmacodynamic experiments (five tumors per time point per treatment).

Phase I expansion trial of RO4987655
Plasma samples for metabolomic analysis were obtained from 35 patients with advanced metastatic melanoma treated as part of an expansion Phase I study with RO4987655 (10). Patients received 8.5mg RO4987655 twice daily for 28 days cycles and metabolomic samples were collected pre-dose, 8 and 24h post-dose on day 1 and cycle 2 day 1 (day 29). Plasma was separated from blood (using sodium heparin as anticoagulant) following centrifugation at 1500 g for 15 min at 4°C; it was then stored at -80°C until further analysis. All aspects of the study were conducted in accordance with the Declaration of Helsinki and the International Conference on Harmonization Good Clinical Practice Guidelines. Written informed consent was obtained from all participants. The details of the Phase I study, the metabolomics sample collection and analysis of pictilisib responses have been described previously (15, 16).

**Plasma metabolomics analysis**

We carried out targeted, quantitative metabolomic analysis by electrospray ionization tandem MS using the AbsoluteIDQ™ p180 kit (Biocrates Life Sciences AG, Innsbruck, Austria). Samples were anonymized and randomized and analyses were carried out on a Waters Acquity H-class UPLC coupled to Xevo TQ-S triple-quadrupole MS/MS System (Waters Corporation, Manchester, UK). Quantification of the metabolites of the biological sample was achieved by reference to appropriate internal standards. The method follows the United States Food and Drug Administration Guidelines ‘Guidance for Industry – Bioanalytical Method Validation (May 2001)’, providing proof of reproducibility within a given error range.

**Data analysis**

The analytical process to derive metabolite concentrations was performed using MassLynx™ (Waters corporation Manchester UK) and the MetIDQ software package (Biocrates Life Sciences, Innsbruck, Austria.) Multivariate analysis was performed using SIMCA v.14.1 software (MKS Umetrics AB, Sweden); to determine metabolite features that were differentially expressed between defined groups of mice: (1) WM266.4 tumor-bearing mice versus non tumor-bearing animals; (2) Non-tumor bearing mice treated with vehicle or 6mg/kg RO498766 (3) RO-treated (6mg/kg) versus vehicle-treated mice bearing WM266.4 tumors. The same analysis was carried out in mice bearing A375 tumors. Metabolites responsible for
differences were identified using OPLS-DA (18) with a threshold of variable importance in the projection (VIP) value >0.5 and cross validation by permutation analysis carried out. To pass the exploratory pre-clinical screen and establish the signature, a metabolite was required to be affected consistently across tumor-bearing mice versus controls and to show reverse changes in xenograft-bearing mice treated with a single dose of the MEK inhibitor. For the relevant plasma metabolites at each time point the changes relative to control concentration (pre-treatment or vehicle) were used to generate heat maps. We tested the metabolomics signature identified in melanoma mice with an additional cohort bearing PTEN null U87MG human glioblastoma xenografts following treatment with a single dose of the MEK inhibitor.

In the clinical studies with the MEK inhibitor and the PI3K inhibitor, we focused on the metabolites that had been identified in the pre-clinical studies. Changes relative to pre-treatment baseline levels were calculated for each patient across all time points for each metabolite. In the study with the MEK inhibitor, the separation between the response categories of disease progression and objective RECIST response (Response Evaluation Criteria in Solid tumors) was assessed using the receiver operator characteristic (ROC) curve. The statistical significance of the differences were determined using Mann-Whitney, Kruskall-Wallis and Dunn`s multiple comparison tests (Graphpad Prism v6, California, USA), and values <0.05 were considered statistically significantThe venn diagram was generated on http://bioinformatics.psb.ugent.be/webtools/Venn/ website. Clustered heatmap diagram was constructed using MetaboAnalyst 3.0 (19).
RESULTS

Preclinical models

**RO4987655 inhibits ERK phosphorylation and tumor growth in human melanoma xenografts**

Following a single dose of 6mg/kg RO4987655 to female athymic mice bearing s.c. human B-RAF mutant melanoma xenografts WM266.4 or A375, a complete inhibition of ERK phosphorylation was observed in tumors at 2, 6, and 8h post treatment in both models (Fig. 1A and B). This target modulation resulted in significant tumor growth inhibition following daily treatment with RO4987655 at 6mg/kg with T/C of 16% and 3.5% respectively (Fig. 1C). This schedule was well tolerated with no body weight loss.

The metabolomics workflow is summarized in Fig. 2A

**Identification of the metabolomic signature**

We compared plasma samples from mice bearing WM266.4 and A375 melanomas with their non-tumor bearing age-matched littermates. Orthogonal partial least square-discriminant analysis (OPLS-DA) of the metabolic profile revealed 11 metabolites increased in these MAPK-driven tumors and decreased following RO4987655 treatment plus 10 metabolites decreased in the plasma of tumor-bearing mice and increased following treatment (summarized in Fig. 2B and Fig. 2C). Hence, a total of 21 metabolites including propionylcarnitine, arginine, asparagine, isoleucine, leucine, phenylalanine, tryptophan, tyrosine, valine, methylsulfoxide, 7 phosphatidylcholines (PC aa C30:0, PC aa 36:6, PC aa 40:1, PC ae 42:0, PC ae 44:3 and PC ae 44:6 and 4 sphingomyelins (SM 16:0, SM 20:2, SM C24:1, SM C26:1) were different in plasma of animals bearing *B-RAF* mutant melanomas compared with controls and inversely affected by treatment with the MEK inhibitor. (Fig. 2D). Overall, propionylcarnitine and the amino acids were decreased in the plasma of tumor-bearing animals compared with controls and increased by treatment. In contrast, lipids were increased in plasma of tumor-bearing mice and decreased with treatment (Fig. 2D). In tumor-bearing mice, the metabolic effects were most pronounced at 4 and 8h and were different from those observed in non-tumor-bearing mice (Fig 2D). In the *PTEN* (-/-) null human glioblastoma xenograft (U87MG), which is not MAPK-dependent, a single dose of the MEK inhibitor had different effects on the plasma metabolites identified in melanoma models (Fig. 2D, fifth column) with only amino acids and propionylcarnitine...
increased following treatment with the MEK inhibitor. Reversed changes of lipid levels following RO4987655 treatment were observed only in melanoma xenograft models.

**The metabolic effects following RO4987655 are different in clinical responders and patients with disease progression**

We examined the relationship between all 182 metabolites and objective responses determined by RECIST criteria (12) in 35 evaluable patients treated with 8.5 mg/kg (i.e the maximum tolerated dose) of RO4987655. The OPLS-DA model revealed a high degree of separation between the response categories of disease progression and objective RECIST response (Fig. 3A). The most significant effects were observed on propionylcarnitine, and aminoacids that showed an increase at all time points. The sphingomyelins and one phosphatidylcholine (PC aa C38:6) showed an overall decrease at 24h but this was not statistically significant (Table 1, Fig. 3B PD-PR-SD column). Additionally, the metabolic alterations were significantly different between patients with disease progression and those who achieved an objective response (Fig. 3B, PD and PR columns). Overall, progressors showed a significant increase in amino acids relative to pre-dose levels while responders showed no significant increase in these amino acids up to Cycle 2, 24h. In addition, a significant decrease in 7 phospholipids was observed from cycle 2 which was not observed in patients who progressed. The metabolite changes observed in responsive patients were consistent with the effects observed in mice bearing the sensitive WM266.4 and A375 melanoma xenografts and the effects in non-responsive patients were in line with the effects in non-tumour bearing mice or the U87MG xenograft model (Fig. 2C, Fig. 3B, Table 2). In addition, the effect of the PI3K inhibitor pictilisib on the MEK signature also showed an increase in the amino acids but no decrease in phospholipids which is comparable with that observed in patients with progressive disease following RO4987655 administration. The effect on amino acids following pictilisib was not observed below 80mg (suggesting that it is genuinely associated with PI3K inhibition and not disease progression) (Supplementary Figure 1).
Baseline levels of 7 plasma metabolites predict clinical response to RO4987655

We examined the relationship between pre-treatment baseline levels of the metabolite biomarker candidates and objective response determined by RECIST criteria (12) in 35 evaluable patients. Of 21 biomarker candidates, 7 plasma metabolites were significantly different between patients who responded and those who progressed (p-values <0.05) and all 7 metabolites exhibited an estimated area under the receiver operating characteristic curve of ≥0.75 (Table 3). The plasma levels of all these lipid metabolites were higher in patients who subsequently achieved an objective response to RO4987655. (Fig.3B). In contrast, a poor separation between the metabolic profiles of patients harbouring \textit{B-RAF}-mutant and \textit{B-RAF} wild-type melanomas was observed with only 3 metabolites correlating with \textit{B-RAF} mutational status. The lack of a significant difference in these plasma metabolites between the two groups is summarised in Table 3.

A heat map of an unsupervised analysis of the pre-treatment levels of selected lipids (based on preclinical signature Fig. 3C) shows clustering of 7/8 all of patients with partial response and 11/12 patients with progressive disease (Fig. 3C).

Collectively, these results suggest hitherto-unknown biological pathways involving the panel of metabolite biomarkers being implicated in mechanisms underlying vulnerability of melanoma cells to MEK inhibition. A summary of the levels of 4 representative metabolites throughout the course of treatment is presented in Fig. 3D.

Changes in the metabolite biomarkers following RO4987655 exceed time-of-day variations

Time-of-day variation can impact significantly on the plasma metabolome (13, 14). To assess the potential confounding impact of this factor on the candidate biomarkers, we studied the degree of variation of these metabolites in an additional study (Supplementary Table 1). One study examined the variability of these metabolites in 35 subjects with advanced melanoma and the second evaluated time-of-day variation over a 24-hour period using the same clinical sampling schedule in 12 healthy male volunteers. Reassuringly, 90%
DISCUSSION

This study provides evidence of plasma metabolites as biomarkers predictive of objective response to a molecularly targeted anti-cancer drug with good discrimination. The prior identification of biomarker candidates in molecularly-characterized preclinical tumor screens where control animals were included significantly increases confidence that these metabolites represent genuine exometabolomic changes associated with MAPK pathway modulation.

We demonstrated that basal levels of 21 metabolites including amino acids, glycerophosphocholines and sphingomyelins were differentially affected in clinical responders and progressors following treatment with RO4987655. In patients with progressive disease, we observed an increase in amino acids and no decrease in lipids. This significant increase in amino acids was also observed following treatment with the PI3K inhibitor pictilisib where no therapeutic benefit was observed in all but one patient (15, 16). In patients responding to the MEK inhibitor, the amino acids and lipids were decreased. In addition, basal levels of 7 metabolites (glycerophosphocholines and sphingomyelins) were significantly able to predict response with higher levels in responders. In contrast to the metabolite biomarker changes, the median decrease in ERK phosphorylation in tumors was higher in patients with a B-RAF mutation than those without; but there was no evidence of a significant difference in pERK inhibition between different response outcome groups (12).

A previous study showed that reduction of p-ERK was correlated with response to the B-RAF inhibitor vemurafenib (20); however, there is published evidence that this is not the case for MEK inhibitors (12). In addition, the metabolic responses measured by FDG-PET confirmed the negative predictive value of FDG-PET for MEK inhibition (10). In this context, it is notable that we observe an increase in branched chain amino acids in non-responders and following treatment with pictilisib which is consistent with the insulin resistant phenotype (16). In addition, our previous studies showed a decrease in glycerophosphocholine in PI3K-activated tumors and an increase following PI3K inhibition with pictilisib (16)). The fact that low levels
Ang et al; Plasma metabolites predict response to MEK inhibitor.

of these phospholipids are predictive of resistance to the MEK inhibitor is consistent with the PI3K activated metabotype. It has been shown that de novo PI3K activation is associated with resistance to MEK inhibitors (21) which is consistent with our metabolic findings. PI3K activation is also known to be induced as a result of MEK inhibition but our metabolic response to doses of drug inhibiting the MAPK pathway does not recapitulate that observed upon PI3K activation whatever the therapeutic outcome. Studies aiming at the prediction of sensitivity to MEK inhibition by gene expression profiling have also shown compensatory signaling through RAS effectors other than PI3K (22). Tumors often harbor genetic abnormalities in both PI3K and MAPK pathways as observed in WM266.4 (although they are known to be driven primarily by MAPK). In addition, PI3K pathway abnormalities in the patients enrolled in the clinical study have not been determined and melanomas have a high mutational load in addition to the known PI3K and MAPK drivers (23-25). Our exometabolomic data in sensitive human tumor xenograft models and clinical responders are in agreement with cellular metabolomics studies by NMR reporting decreased glycerophosphocholine levels which were associated with lowered expression of choline-kinase α following MEK inhibition (26). Increased levels of phosphatidylcholines delivered by nanoparticles, in the cellular plasma membrane is able to activate EGFR which is one of the major mechanisms of resistance to MEK inhibition suggesting effectors for these molecules upstream and downstream of MAPK (23, 27, 28). Similarly, previous studies established that activated sphingomyelinase leads to ceramide-mediated activation of MAPK (29). In our study, we show a decrease in sphingomyelins following MEK inhibition suggesting complex regulation of sphingomyelins on the MAPK network.

We and others have demonstrated that levels of plasma metabolites vary throughout the day (12,13). Reassuringly, we have demonstrated that the variations observed in the biomarker metabolites following treatment with the MEK inhibitor exceed time-of-day variations both in patients and healthy volunteers. We found that over 70% (15 out of 21) of the metabolites identified pre-clinically translate to the clinical setting and we also found additional metabolites that could be associated with responses using the clinical data alone. The metabolomic profiling of plasma (as opposed to tumor tissue) circumvents significant limitations of many current standard biomarkers (for example lack of stability of phospho signals) and importantly is
readily amenable to repeated sampling. In addition, the use of a mass spectrometry-based platform crucially allows for up-scaling and implementation in large studies. We emphasize, however, that this is a retrospective study with a limited sample size, and hence cannot be regarded as definitive at this time. Further investigations in an independent cohort are needed. This is challenging given the fact that MEK inhibitors are now administered in combination in the clinical setting. Although the mechanistic links between MAPK pathway modulation and the panel of plasma metabolite biomarkers are currently poorly understood, we anticipate that our novel findings may be helpful in guiding future investigations including those of MEK inhibitor resistance.

In summary, using LC-MS metabolomics, we showed that plasma metabolite markers of MEK inhibition can be identified in mice bearing human melanoma xenografts. In patients with advanced melanoma treated with RO4987655, the pre-treatment levels of 7 candidate plasma metabolite biomarkers identified in the pre-clinical screen were statistically significantly able to retrospectively predict objective responses to RO4987655. Our current findings and those we reported previously (10) provide a rational study design for the determination of metabolomic signatures of drug sensitivity/activity and resistance which is directly translatable to the identification of preclinical and clinical metabolomic biomarkers for other new classes of drug. Thus metabolomics analysis can be added to the technical approaches to support the use of The Pharmacological Audit Trail for biomarker led decision making in cancer therapeutics (30)
ACKNOWLEDGEMENTS
The authors would like to thank Chugai Pharmaceutical Co., Ltd. for providing RO4897655 to perform therapy experiment, Sharon Gowen for her MSD technical support and Vladimir Kirkin for supporting in vivo therapy experiments.
Ang et al; Plasma metabolites predict response to MEK inhibitor.

REFERENCES

References and Notes:

Ang et al; Plasma metabolites predict response to MEK inhibitor.


Table 1: Evaluation of the significance of the changes in metabolite levels compared with pre-dose levels following treatment with the MEK inhibitor RO4987655. Statistical tests carried out are Kruskal-Wallis test for all time points and Dunn’s multiple comparison tests for individual time points. (p values <0.05 are shaded grey). Mean values are percentage increase or decrease relative to time 0.

<table>
<thead>
<tr>
<th>Metabolites</th>
<th>Kruskal-Wallis</th>
<th>Dunn’s multiple comparison test</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>p value</td>
<td>C1-8h</td>
</tr>
<tr>
<td>C3</td>
<td>0.0016</td>
<td>28.46</td>
</tr>
<tr>
<td>Arg</td>
<td>&lt; 0.0001</td>
<td>42.23</td>
</tr>
<tr>
<td>Asn</td>
<td>&lt; 0.0001</td>
<td>34.09</td>
</tr>
<tr>
<td>Ile</td>
<td>&lt; 0.0001</td>
<td>59.14</td>
</tr>
<tr>
<td>Leu</td>
<td>&lt; 0.0001</td>
<td>47.26</td>
</tr>
<tr>
<td>Phe</td>
<td>&lt; 0.0001</td>
<td>28.74</td>
</tr>
<tr>
<td>Trp</td>
<td>0.0371</td>
<td>22.57</td>
</tr>
<tr>
<td>Tyr</td>
<td>0.0003</td>
<td>36.4</td>
</tr>
<tr>
<td>Val</td>
<td>0.0004</td>
<td>16.49</td>
</tr>
<tr>
<td>Met-SO</td>
<td>0.0046</td>
<td>117.8</td>
</tr>
<tr>
<td>PC aa C30:0</td>
<td>0.2272</td>
<td>0.6268 &gt; 0.9999</td>
</tr>
<tr>
<td>PC aa C38:6</td>
<td>0.0005</td>
<td>4.286 &gt; 0.9999</td>
</tr>
<tr>
<td>PC aa C40:1</td>
<td>0.2189</td>
<td>3.8  &gt; 0.9999</td>
</tr>
<tr>
<td>PC aa C42:0</td>
<td>0.626</td>
<td>2.514 &gt; 0.9999</td>
</tr>
<tr>
<td>PC aa C42:4</td>
<td>0.6558</td>
<td>0 &gt; 0.9999</td>
</tr>
<tr>
<td>PC ae C44:3</td>
<td>0.7112</td>
<td>4.771 &gt; 0.9999</td>
</tr>
<tr>
<td>PC ae C44:6</td>
<td>0.6457</td>
<td>-0.8286 &gt; 0.9999</td>
</tr>
<tr>
<td>SM C16:0</td>
<td>0.0019</td>
<td>1.686 &gt; 0.9999</td>
</tr>
<tr>
<td>SM C20:2</td>
<td>0.0317</td>
<td>3.886 &gt; 0.9999</td>
</tr>
<tr>
<td>SM C24:1</td>
<td>0.1213</td>
<td>1 &gt; 0.9999</td>
</tr>
<tr>
<td>SM C26:1</td>
<td>0.0096</td>
<td>-1.057 &gt; 0.9999</td>
</tr>
</tbody>
</table>
Table 2: Statistical analysis of the effect of treatment with RO4987655 on metabolites identified pre-clinically in patient with progressive disease (PD) and partial response (PR). Statistical tests carried out are Kruskal-Wallis test for all time points and Dunn’s multiple comparison tests for individual time points. (p values < 0.05 are shaded grey). Mean values are percentage increase or decrease relative to Time 0.

<table>
<thead>
<tr>
<th>Metabolites</th>
<th>PD Dunn`s multiple comparison test</th>
<th>PR Dunn`s multiple comparison test</th>
</tr>
</thead>
<tbody>
<tr>
<td>C3</td>
<td>0.2294</td>
<td>29.42</td>
</tr>
<tr>
<td>Arg</td>
<td>0.0043</td>
<td>50.33</td>
</tr>
<tr>
<td>Asn</td>
<td>&lt;0.0001</td>
<td>47.67</td>
</tr>
<tr>
<td>Ile</td>
<td>0.0006</td>
<td>69.08</td>
</tr>
<tr>
<td>Leu</td>
<td>&lt;0.0001</td>
<td>60.58</td>
</tr>
<tr>
<td>Phe</td>
<td>0.0007</td>
<td>41</td>
</tr>
<tr>
<td>Trp</td>
<td>0.0539</td>
<td>36.83</td>
</tr>
<tr>
<td>Tyr</td>
<td>0.0003</td>
<td>56.75</td>
</tr>
<tr>
<td>Val</td>
<td>0.0118</td>
<td>26.25</td>
</tr>
<tr>
<td>Met-SO</td>
<td>0.063</td>
<td>38</td>
</tr>
<tr>
<td>PC aa C30:0</td>
<td>0.0566</td>
<td>19.25</td>
</tr>
<tr>
<td>PC aa C38:6</td>
<td>0.0657</td>
<td>13.92</td>
</tr>
<tr>
<td>PC aa C40:1</td>
<td>0.5102</td>
<td>6.58</td>
</tr>
<tr>
<td>PC aa C42:0</td>
<td>0.5951</td>
<td>7.833</td>
</tr>
<tr>
<td>PC aa C42:4</td>
<td>0.3738</td>
<td>11.25</td>
</tr>
<tr>
<td>PC aa C44:3</td>
<td>0.7392</td>
<td>6.5</td>
</tr>
<tr>
<td>PC aa C44:6</td>
<td>0.5176</td>
<td>8.167</td>
</tr>
<tr>
<td>SM C16:0</td>
<td>0.0057</td>
<td>12.25</td>
</tr>
<tr>
<td>SM C20:2</td>
<td>0.3264</td>
<td>16.17</td>
</tr>
<tr>
<td>SM C24:1</td>
<td>0.1162</td>
<td>12.75</td>
</tr>
<tr>
<td>SM C26:1</td>
<td>0.0796</td>
<td>8.917</td>
</tr>
</tbody>
</table>
Table 3: Relationship between baseline candidate biomarker levels with objective response and presence of tumor BRAF-mutation (p values <0.05 are shaded grey)

<table>
<thead>
<tr>
<th>Metabolites</th>
<th>Mann-Whitney test</th>
<th>Patient comparison</th>
<th>ROC analysis PD vs PR</th>
<th>Mann-Whitney test</th>
<th>+/- BRAF mutation</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>p value</td>
<td>Median of PD (µM)</td>
<td>Median of PR (µM)</td>
<td>AUC</td>
<td>95% confidence interval</td>
</tr>
<tr>
<td>C3</td>
<td>0.6239</td>
<td>0.2585, n=12</td>
<td>0.2396, n=8</td>
<td>0.5729</td>
<td>0.3121 to 0.8337</td>
</tr>
<tr>
<td>Arg</td>
<td>0.0096</td>
<td>64.51, n=12</td>
<td>87.93, n=8</td>
<td>0.8438</td>
<td>0.6646 to 1.023</td>
</tr>
<tr>
<td>Asn</td>
<td>0.6784</td>
<td>43.60, n=12</td>
<td>43.44, n=8</td>
<td>0.5625</td>
<td>0.3029 to 0.8221</td>
</tr>
<tr>
<td>Ile</td>
<td>0.5714</td>
<td>59.99, n=12</td>
<td>55.37, n=8</td>
<td>0.5833</td>
<td>0.3146 to 0.8521</td>
</tr>
<tr>
<td>Leu</td>
<td>0.5208</td>
<td>107.6, n=12</td>
<td>101.5, n=8</td>
<td>0.5938</td>
<td>0.3186 to 0.8689</td>
</tr>
<tr>
<td>Phe</td>
<td>0.0979</td>
<td>60.29, n=12</td>
<td>67.46, n=8</td>
<td>0.7292</td>
<td>0.5073 to 0.9510</td>
</tr>
<tr>
<td>Trp</td>
<td>0.238</td>
<td>51.96, n=12</td>
<td>61.09, n=8</td>
<td>0.6667</td>
<td>0.4182 to 0.9151</td>
</tr>
<tr>
<td>Tyr</td>
<td>0.0314</td>
<td>51.91, n=12</td>
<td>66.46, n=8</td>
<td>0.7917</td>
<td>0.5862 to 0.9972</td>
</tr>
<tr>
<td>Val</td>
<td>&gt; 0.9999</td>
<td>189.0, n=12</td>
<td>178.6, n=8</td>
<td>0.5</td>
<td>0.2272 to 0.7728</td>
</tr>
<tr>
<td>Met-SO</td>
<td>0.3829</td>
<td>0.5386, n=7</td>
<td>0.2994, n=7</td>
<td>0.6531</td>
<td>0.3293 to 0.9768</td>
</tr>
<tr>
<td>PC aa C30:0</td>
<td>0.1349</td>
<td>2.829, n=12</td>
<td>3.952, n=8</td>
<td>0.7083</td>
<td>0.4611 to 0.9556</td>
</tr>
<tr>
<td>PC aa C38:6</td>
<td>0.0055</td>
<td>58.20, n=12</td>
<td>115.5, n=8</td>
<td>0.8646</td>
<td>0.6647 to 1.065</td>
</tr>
<tr>
<td>PC aa C40:1</td>
<td>0.0159</td>
<td>0.3345, n=12</td>
<td>0.4752, n=8</td>
<td>0.8229</td>
<td>0.6194 to 1.026</td>
</tr>
<tr>
<td>PC ae C42:0</td>
<td>0.0124</td>
<td>0.4863, n=12</td>
<td>0.7681, n=8</td>
<td>0.8333</td>
<td>0.6543 to 1.012</td>
</tr>
<tr>
<td>PC ae C42:4</td>
<td>0.1569</td>
<td>0.6470, n=12</td>
<td>0.7494, n=8</td>
<td>0.6979</td>
<td>0.4640 to 0.9318</td>
</tr>
<tr>
<td>PC ae C44:3</td>
<td>0.0096</td>
<td>0.1298, n=12</td>
<td>0.1833, n=8</td>
<td>0.8438</td>
<td>0.6645 to 1.023</td>
</tr>
<tr>
<td>PC ae C44:6</td>
<td>0.1349</td>
<td>0.7642, n=12</td>
<td>1.056, n=8</td>
<td>0.7083</td>
<td>0.4555 to 0.9611</td>
</tr>
<tr>
<td>SM C16:0</td>
<td>0.1349</td>
<td>185.9, n=12</td>
<td>203.0, n=8</td>
<td>0.7083</td>
<td>0.4779 to 0.9388</td>
</tr>
<tr>
<td>SM C20:2</td>
<td>0.0201</td>
<td>0.7086, n=12</td>
<td>1.007, n=8</td>
<td>0.8125</td>
<td>0.6207 to 1.004</td>
</tr>
<tr>
<td>SM C24:1</td>
<td>0.1569</td>
<td>212.1, n=12</td>
<td>239.0, n=8</td>
<td>0.6979</td>
<td>0.4586 to 0.9372</td>
</tr>
<tr>
<td>SM C26:1</td>
<td>0.2083</td>
<td>0.7365, n=12</td>
<td>0.8440, n=8</td>
<td>0.6771</td>
<td>0.4319 to 0.9223</td>
</tr>
</tbody>
</table>

Ang et al; Plasma metabolites predict response to MEK inhibitor.
FIGURE LEGENDS

Figure 1:

(A) (B) Inhibition of ERK phosphorylation by RO4987655 in WM266.4 and A375 human melanoma xenografts

Ratio of phosphorylated (pERK) and total ERK (tERK) demonstrates total inhibition of phosphorylation of ERK in both melanoma models after RO4987655 (RO) administration compared to vehicle control (VEH), measured by MSD. Values are Mean± SEM of left and right tumors.

(C) Tumor growth inhibition following daily treatment with RO4987655 in WM266.4 and A375 human melanoma xenografts.

Target modulation resulted in significant growth inhibition following daily treatment with RO4987655 at 6mg/kg with T/C of 16 % and 3.5 % in WM266.4 and A375 tumor bearing mice, respectively. Values are Mean± SEM.

Figure 2: Metabolomic analysis of plasma from tumor bearing mice or control mice treated with RO4987655

(A) Experimental workflow.

(B) (C) Venn diagrams showing the overlap in plasma metabolites between preclinical animal models: (A) metabolites increased in WM266.4 and A375 tumor bearing mice compared with non-tumor bearing age-matched controls and decrease in the tumor-bearing mice treated with RO4987655 compared with vehicle; or vice versa (B).
Ang et al; Plasma metabolites predict response to MEK inhibitor.

(D) Heat map of differences between MAPK-hyperactivated tumor-bearing mice compared with age-matched non-tumor bearing littermates (change relative to control) and changes across 24 h in candidate plasma metabolite biomarkers following treatment with RO4987655 (relative to vehicle control) in tumor-bearing and non-tumor bearing mice. (aa, acyl-acyl; ae, acyl-alkyl; Cx:y, where x is the number of carbons in the fatty acid side chain; y is the number of double bonds in the fatty acid side chain; PC, phosphatidylcholine; SM, sphingomyelin.)

Figure 3: Metabolomic profiling of RO4987655 in a Phase I clinical trial

(A) OPLS-DA according to response to RO4987655 in patient plasma metabolomic profiles across all time course of treatment (Cycle 1 and Cycle 2). A total of 182 metabolites were measured.

(B) Heat map illustrating the changes relative to baseline treatment in 21 candidate metabolite biomarkers. Data are presented from left to right in all patients (PD-SD-PR column), in patients with progressive disease (PD column), in partial responders (PR column) on Cycle 1 8h, Cycle 1 24h, Cycle 2 predose, Cycle 2 8h and Cycle 2 24h.

(C) Heatmap of unsupervised clustering according to the pre-treatment concentrations of 20 metabolites identified as predictors of response (MetaboAnalyst 3.0, Pareto scaling, Distance Measure: Euclidean; Clustering Algorithm: Ward).
(D) Concentrations of representative plasma metabolites in patients with metastatic melanoma at baseline and following treatment with RO4987655. Values are Mean± SEM in patients who achieved an objective response (n=8) (PR) or experienced disease progression (n=12) (PD).
Figure 1

A

B

C

WM266.4

VEH-2h
VEH-4h
VEH-8h
RO-2h
RO-4h
RO-8h

A375

VEH-2h
VEH-4h
VEH-8h
RO-2h
RO-4h
RO-8h

Tumor volume (cm³)

Day

Final tumor weight (g)

vehicle

RO4987655

100%

16%

3.5%
SCREEN USING IN VIVO PRECLINICAL MODELS

WM266.4-bearing and A375-bearing versus non-tumor-bearing mice

Establish signature:
Reversal of hyperactivated MAPK-related changes in plasma metabolites with RO4987655
RO4987655 vs vehicle-control treated mice bearing WM266.4 and A375

Does signature apply in PTEN driven U87MG following treatment with RO4987655?

CLINICAL QUALIFICATION OF NOVEL BIOMARKERS IN PHASE I CLINICAL TRIAL

Study of candidate biomarker changes across time and relationship with objective response

Figure 2

A

B

C

D
Molecular Cancer Therapeutics

Modulation of plasma metabolite biomarkers of MAPK pathway with the MEK inhibitor RO4987655: pharmacodynamic and predictive potential in metastatic melanoma.


Mol Cancer Ther  Published OnlineFirst June 21, 2017.

Updated version
Access the most recent version of this article at:
doi:10.1158/1535-7163.MCT-16-0881

Supplementary Material
Access the most recent supplemental material at:
http://mct.aacrjournals.org/content/suppl/2017/06/21/1535-7163.MCT-16-0881.DC1

Author Manuscript
Author manuscripts have been peer reviewed and accepted for publication but have not yet been edited.

E-mail alerts
Sign up to receive free email-alerts related to this article or journal.

Reprints and Subscriptions
To order reprints of this article or to subscribe to the journal, contact the AACR Publications Department at pubs@aacr.org.

Permissions
To request permission to re-use all or part of this article, contact the AACR Publications Department at permissions@aacr.org.