

Appendix.

A chemical-genetic interaction map of small molecules using high-throughput imaging in cancer cells

Breinig et al.

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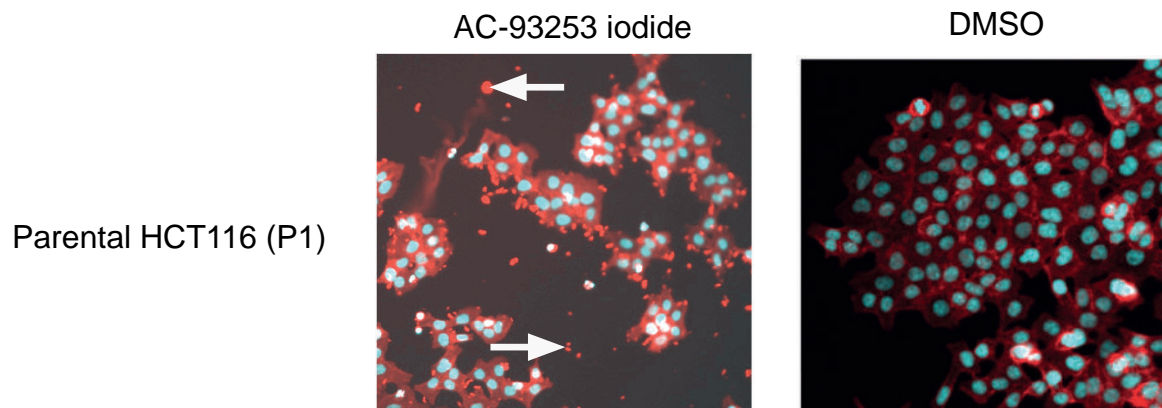
Appendix Figure S8: Clustering of chemical-genetic interactions.

Appendix Figure S9: Association between clustering of compounds as shown in Fig 5A and respective interaction spectra for drugs within clusters.

Appendix Figure S10: Integration of phenotypic profiling and chemical-genetic interaction mapping improves resolution.

Appendix Figure S11: Image-based chemical-genetic interaction analyses outperforms other methods.

Appendix Figure S12: The EGFR inhibitor tyrphostin AG555 impairs proteasome function.

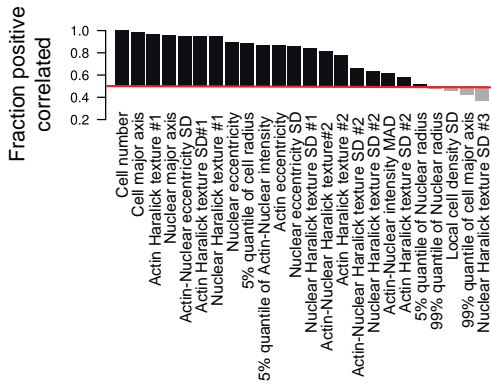
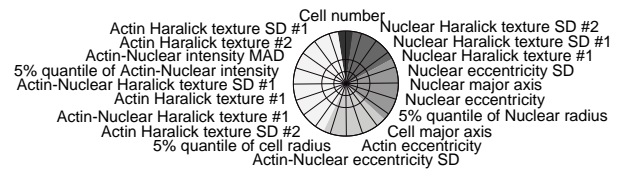
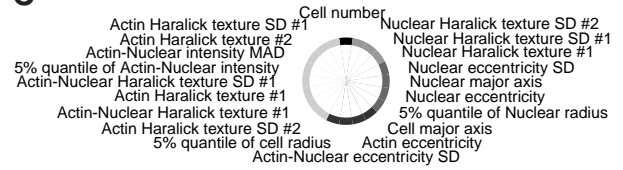


Appendix Figure S1. Quality control.

Images showing experimental artefact, such as autofluorescence of AC-93253 iodide, were removed from the analysis.

Here, a high fluorescence background and the occurrence of fluorescent speckles (arrows) can be seen in the TRITC channel used to detect actin via Phalloidin-TRITC staining.

Image of DMSO treated cells is included as a reference, showing low fluorescence background and specific actin staining.

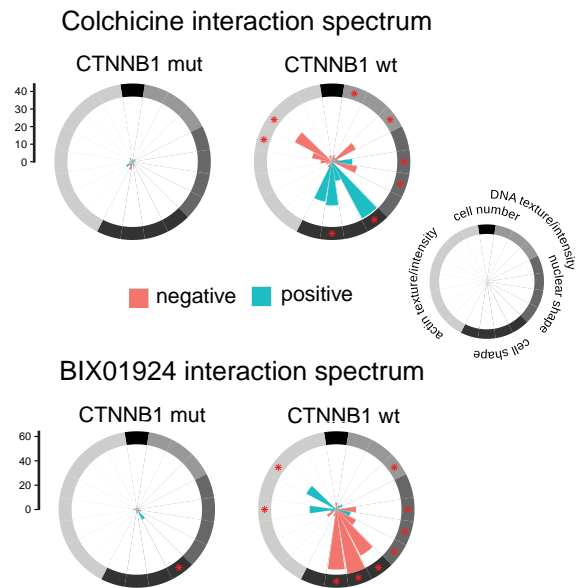
A**B****C**

Appendix Figure S2. Phenotypic features.

A Feature names to Figure 1C. Linear decomposition selected a final set of 20 phenotypic features.

B Feature names to Figure 1D. Phenotypic features are grouped in 5 phenotypic categories and span phenoprints.

C Feature names to Figure 2 and 4. Phenotypic interactions for the selected 20 features are grouped in 5 phenotypic categories.



Appendix Figure S3. Quantitative analysis of chemical-genetic interactions across multiple phenotypic features.

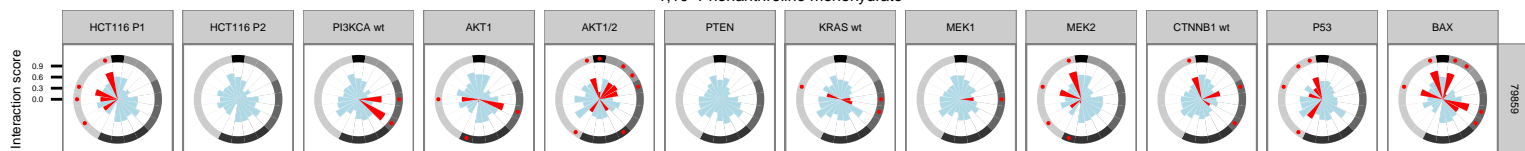
Chemical-genetic interactions were calculated for all 20 phenotypic features as described.

Colchicine and BIX01294 show multiple interactions in CTNNB1 wt cells.

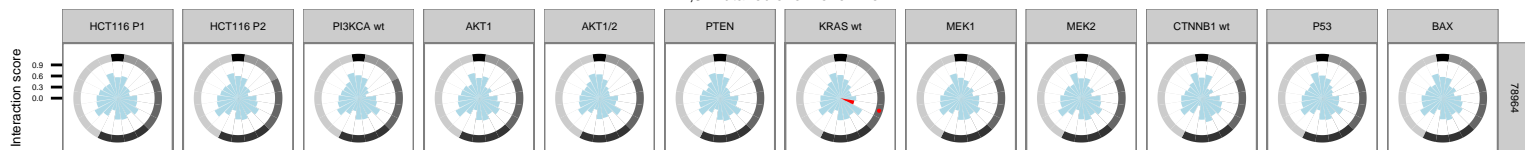
Phenotypic chemo-genomic interactions are shown unscaled.

Interactions are further categorized in positive and negative interactions according to the sign of interaction terms (see Material and Methods for details). * adjusted p-value < 0.01.

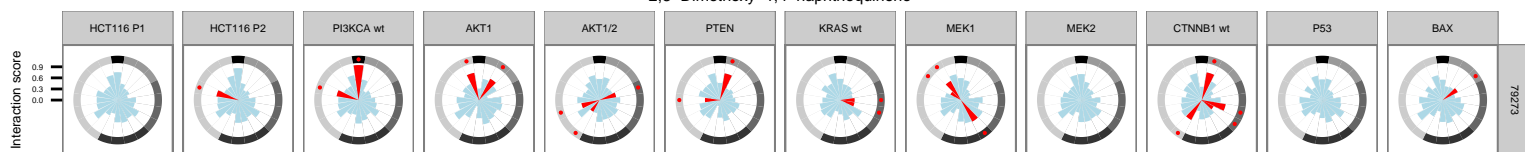
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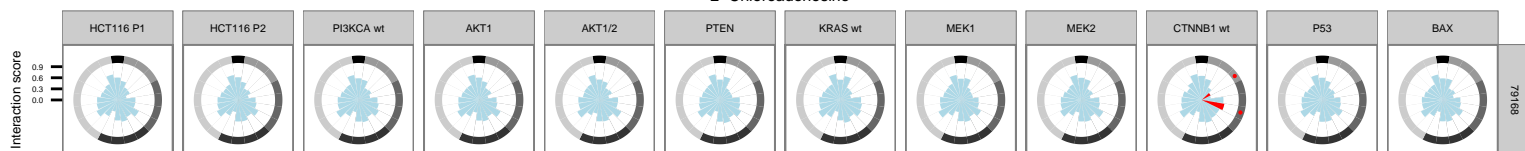
2,3-Butanedione monoxime



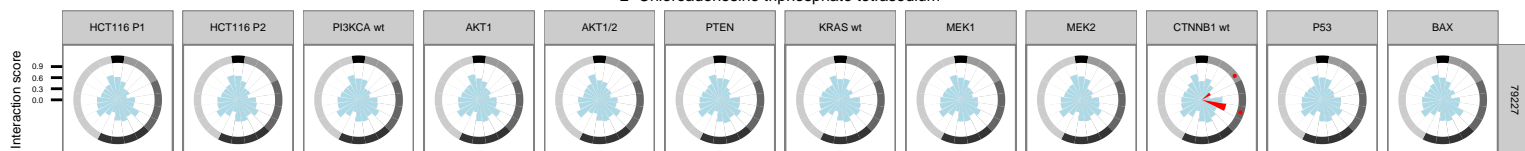
2,3-Dimethoxy-1,4-naphthoquinone



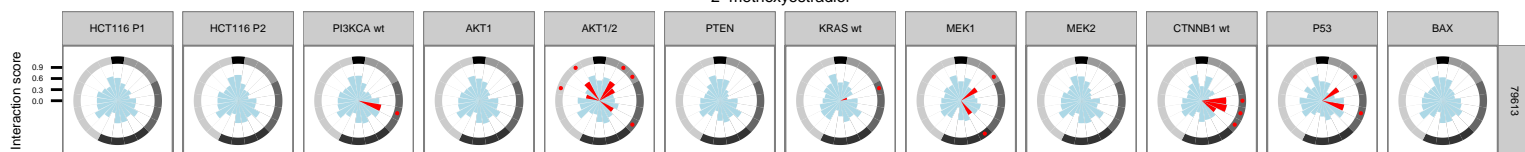
2-Chloroadenosine



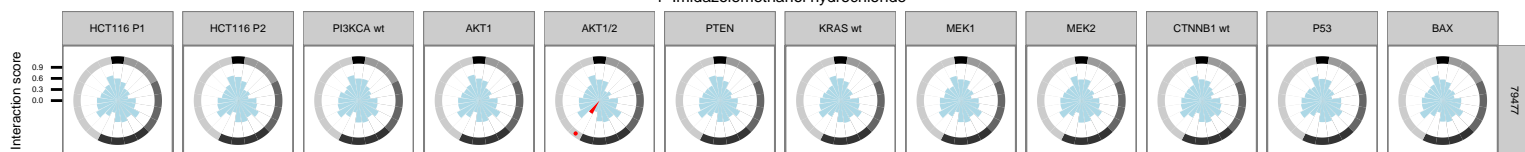
2-Chloroadenosine triphosphate tetrasodium



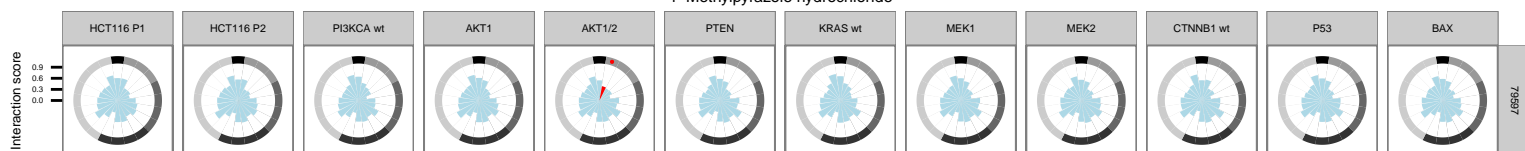
2-methoxyestradiol



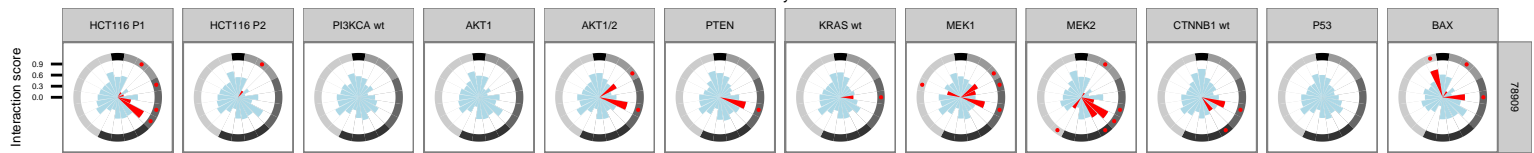
4-Imidazolemethanol hydrochloride



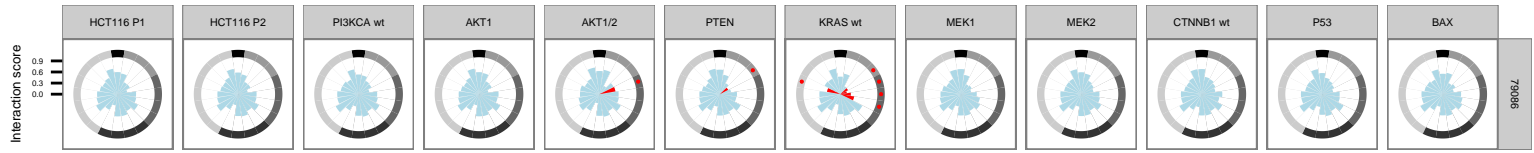
4-Methylpyrazole hydrochloride



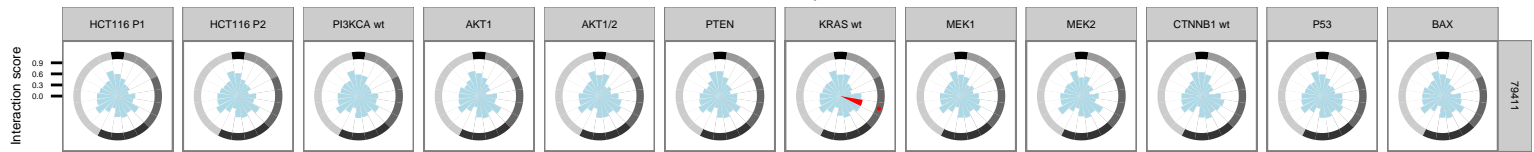
5-azacytidine



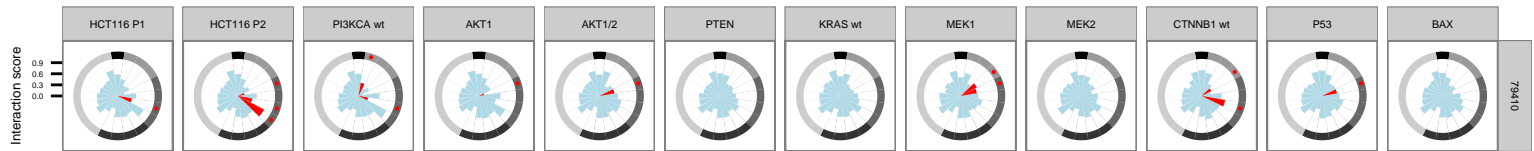
5-Bromo-2'-deoxyuridine



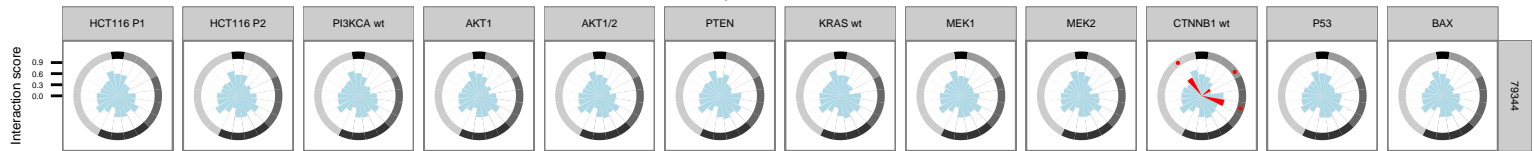
5-fluoro-5'-deoxyuridine



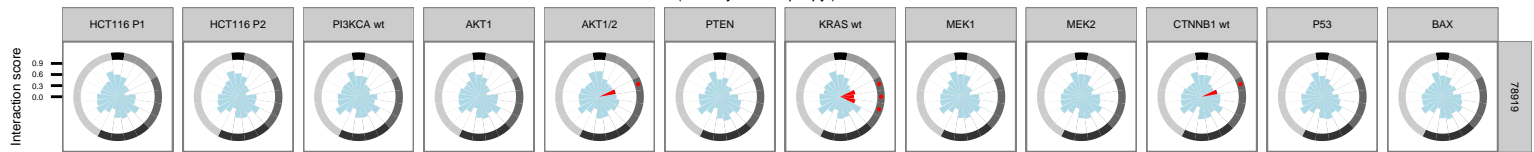
5-Fluorouracil



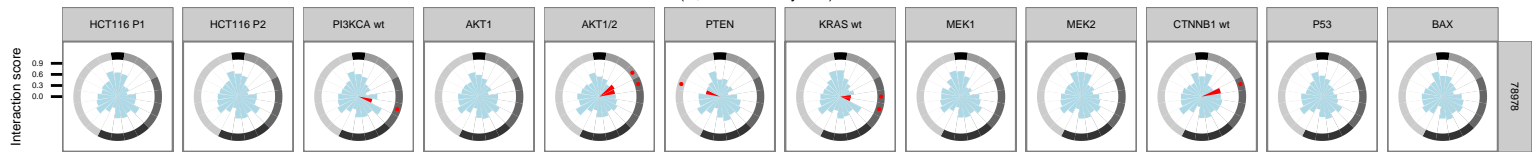
5-N-Ethylcarboxamidoadenosine



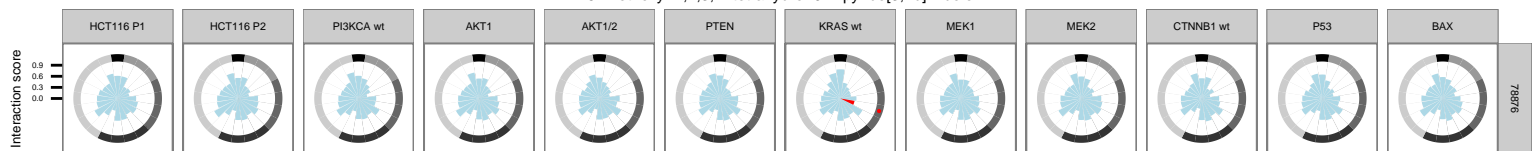
5-(N-Ethyl-N-isopropyl)amiloride



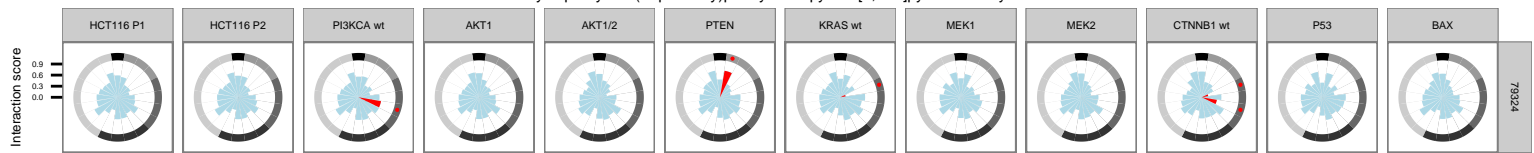
5-(N,N-hexamethylene)amiloride



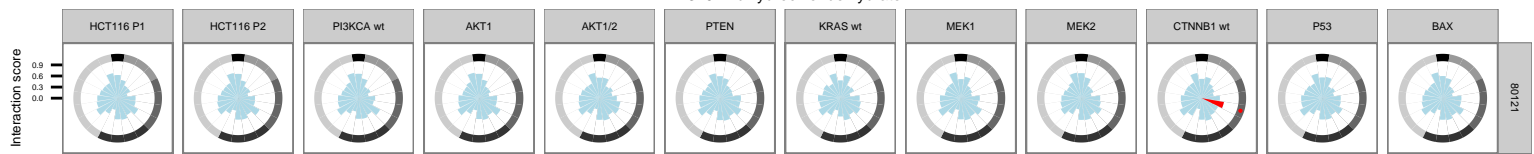
6-Methoxy-1,2,3,4-tetrahydro-9H-pyrido[3,4b] indole



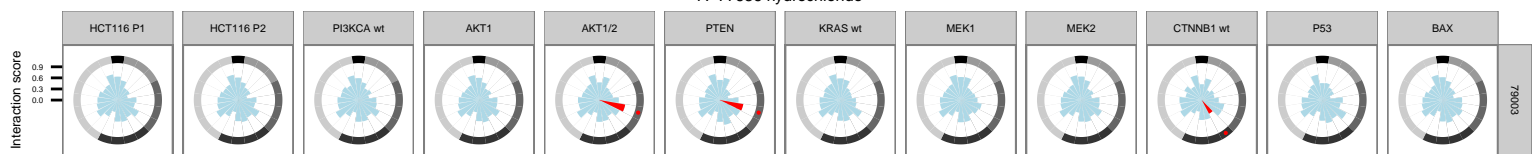
7-Cyclopentyl-5-(4-phenoxy)phenyl-7H-pyrrolo[2,3-d]pyrimidin-4-ylamine



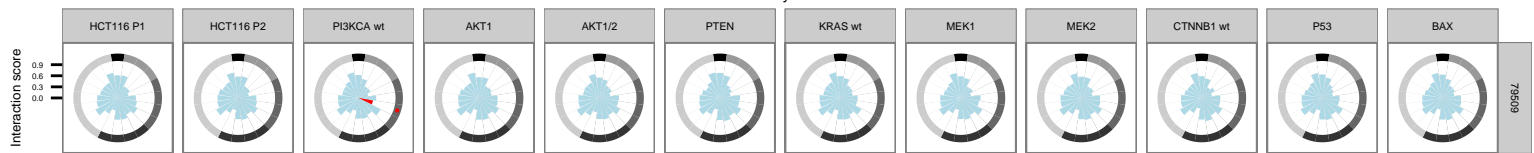
A-134974 dihydrochloride hydrate



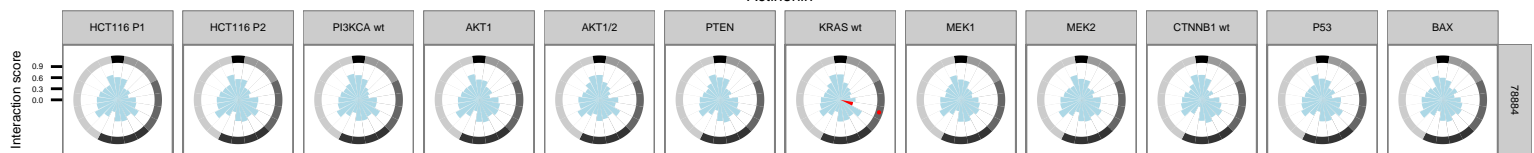
A-77636 hydrochloride



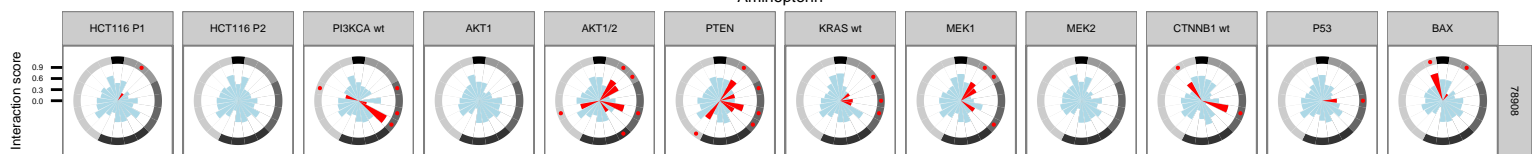
ABT-702 dihydrochloride



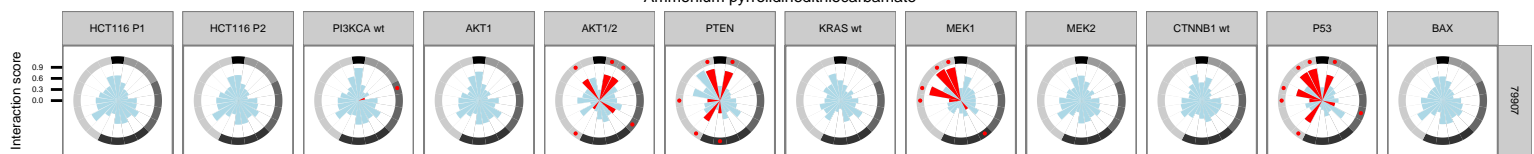
Actinonin



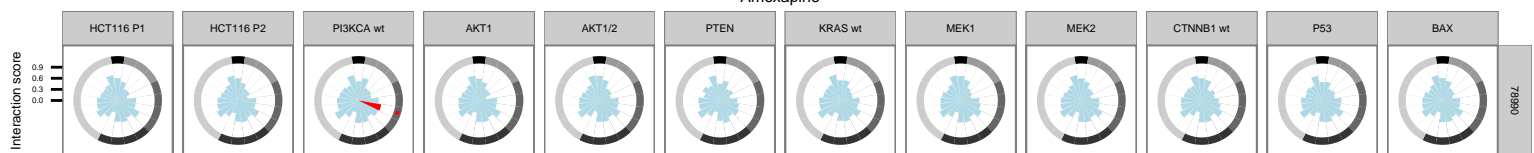
Aminopterin



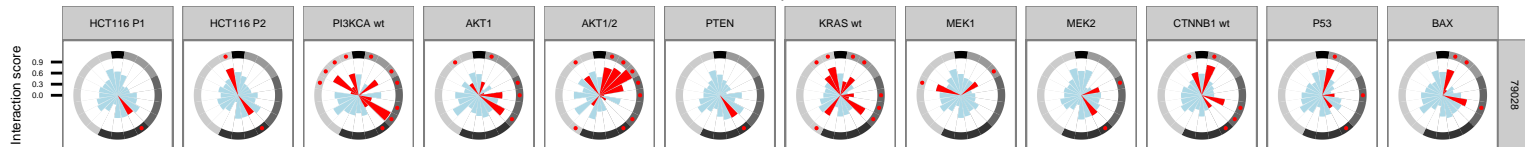
Ammonium pyrrolidinedithiocarbamate



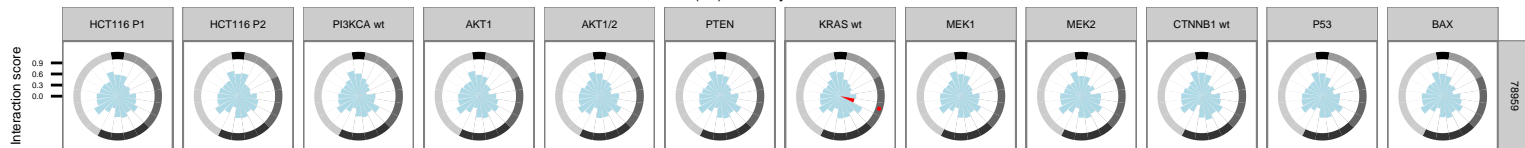
Amoxapine



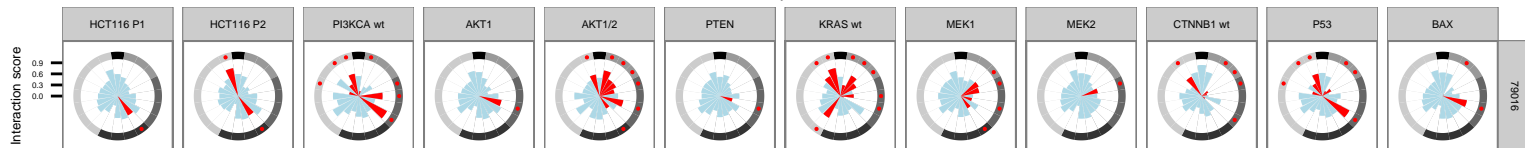
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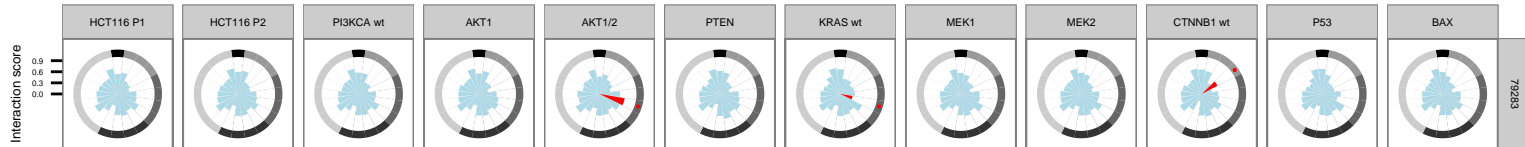
(+/-)-AMT hydrochloride



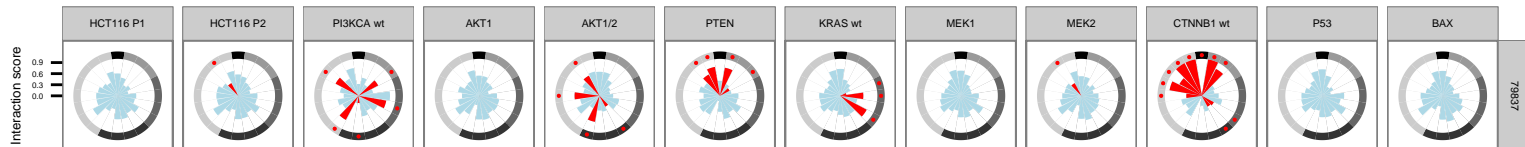
Ancitabine hydrochloride



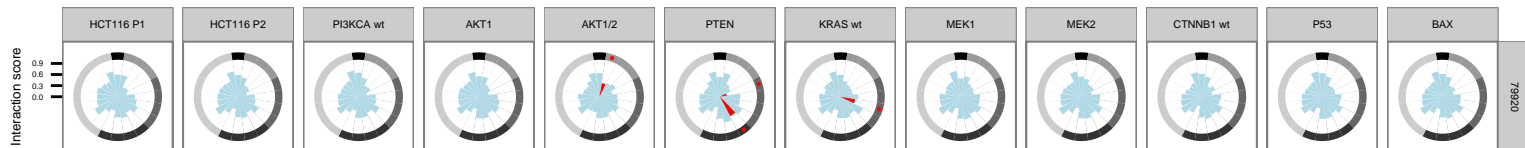
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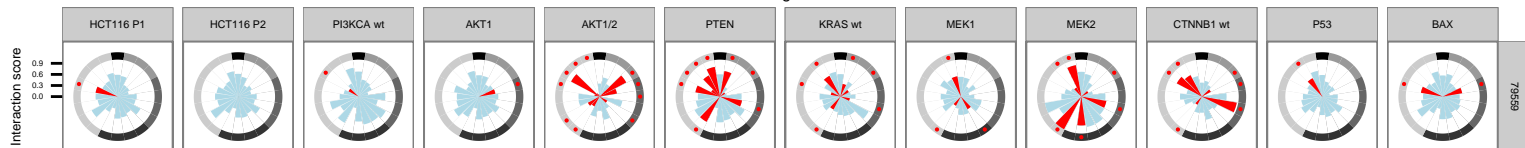
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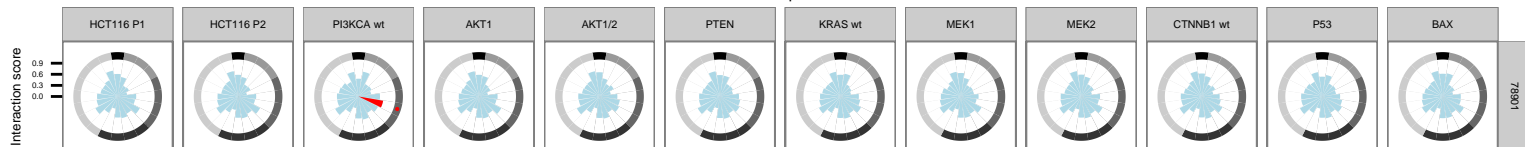
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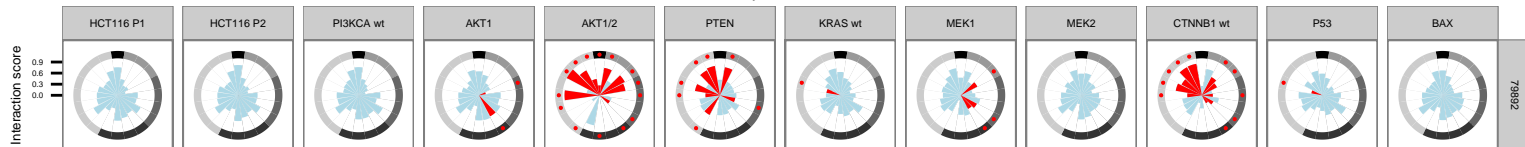
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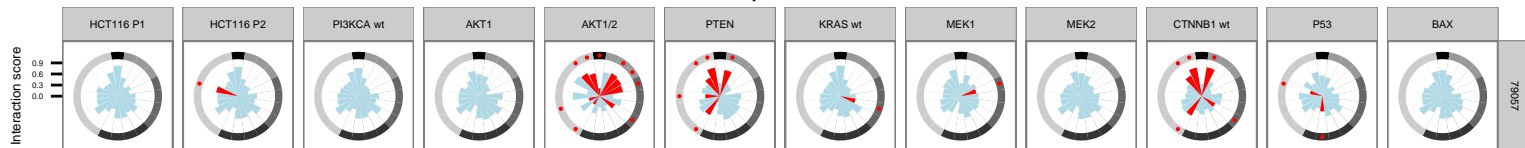
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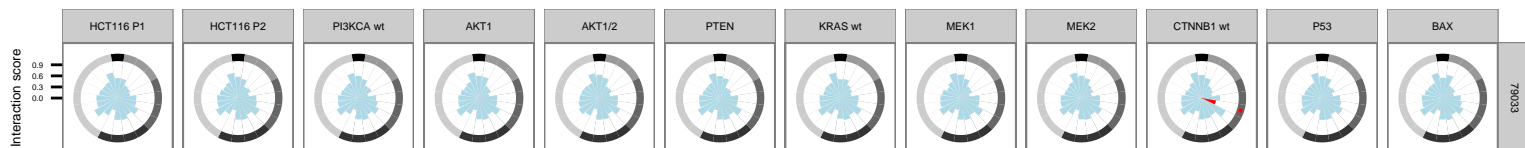
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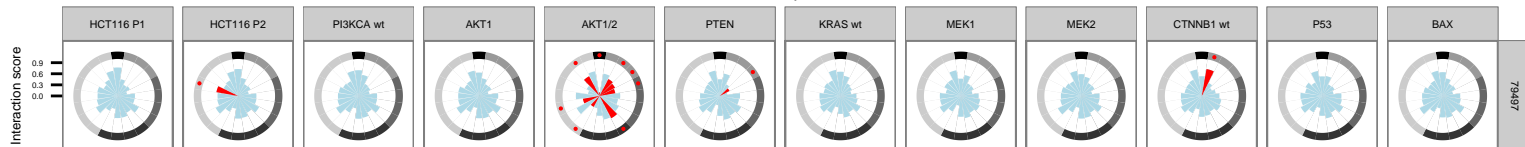
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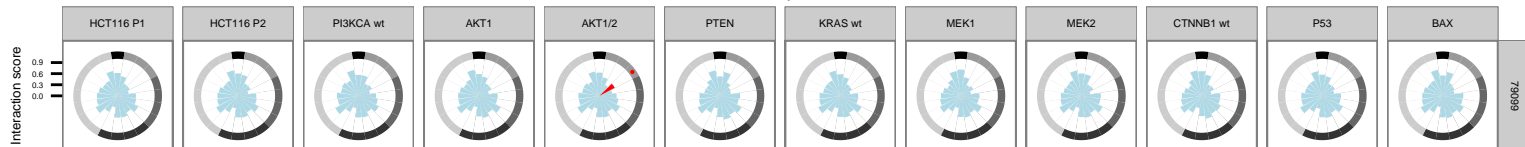
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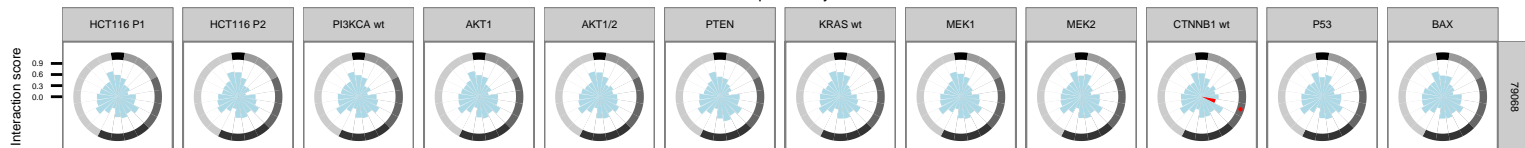
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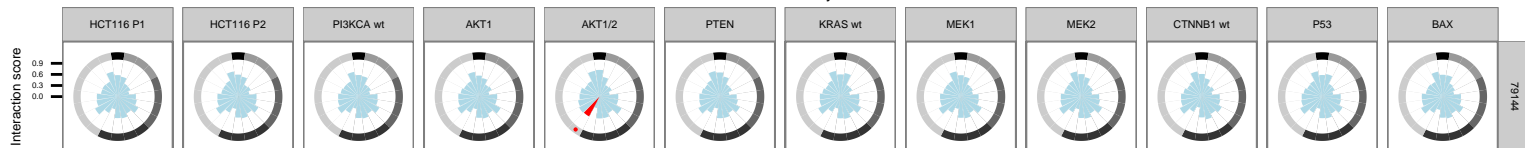
Benoxathian hydrochloride



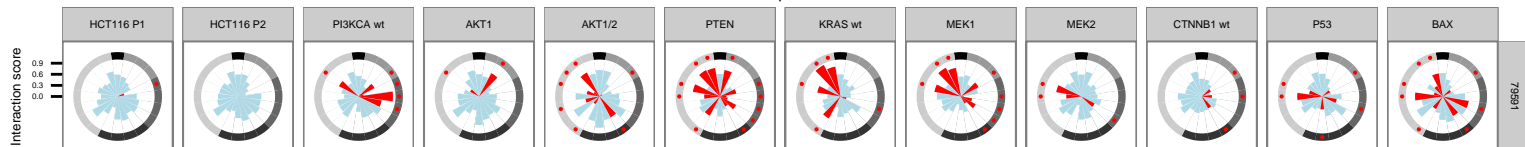
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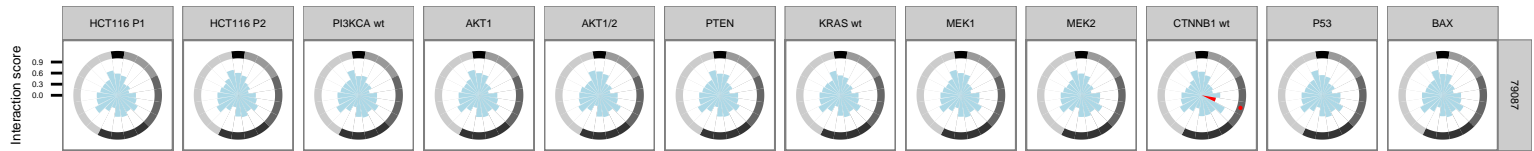
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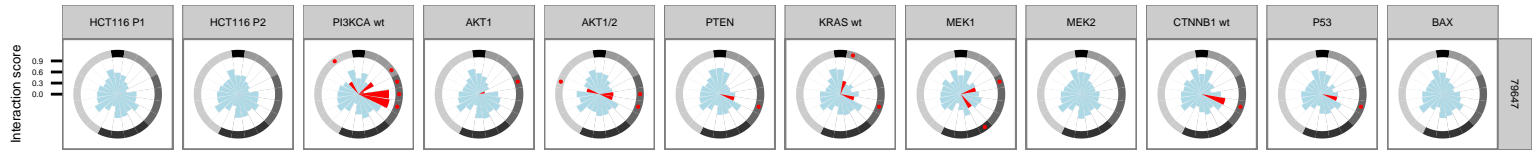
beta-Lapachone



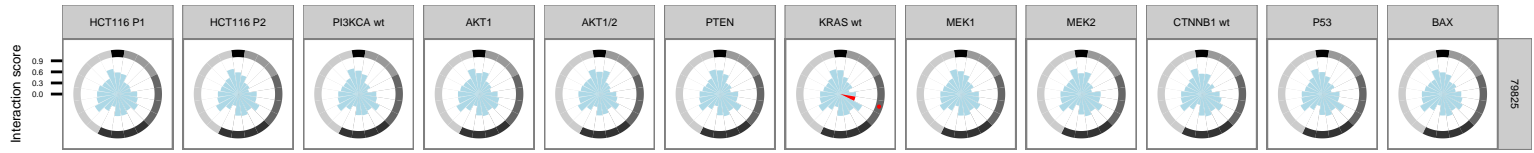
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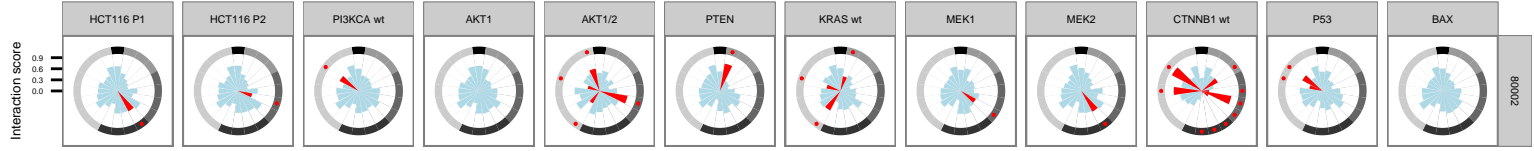
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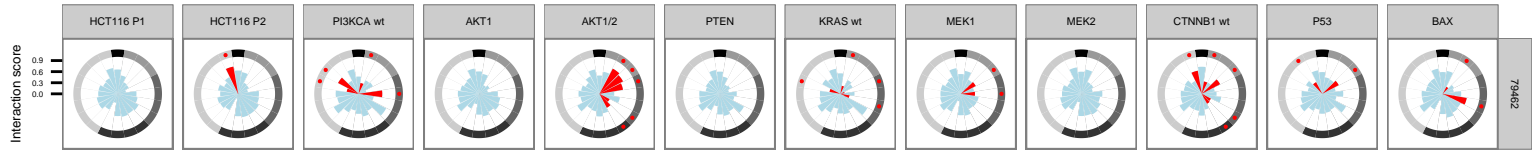
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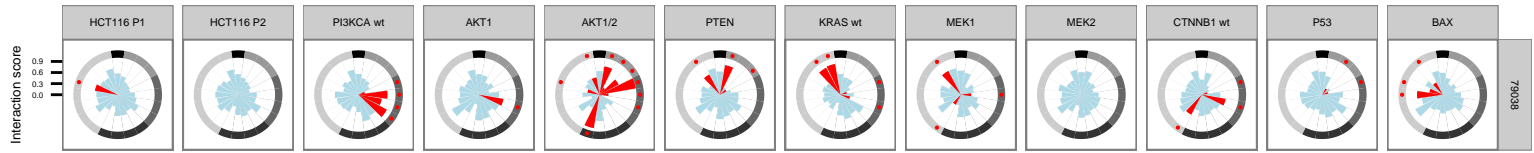
BIX 01294 trihydrochloride hydrate



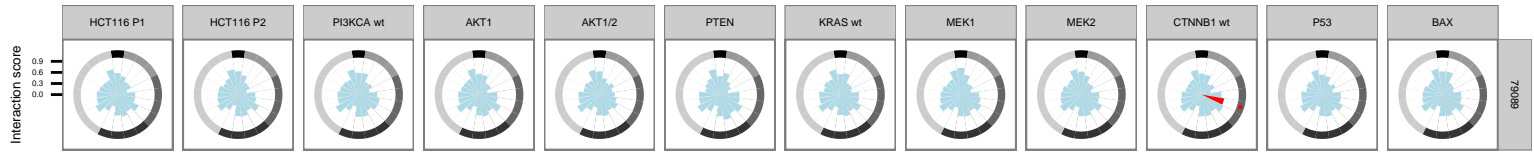
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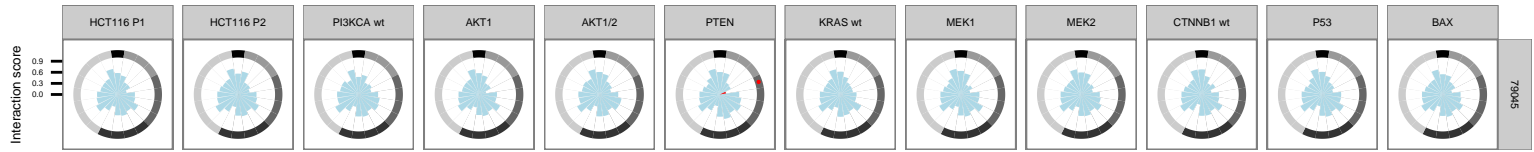
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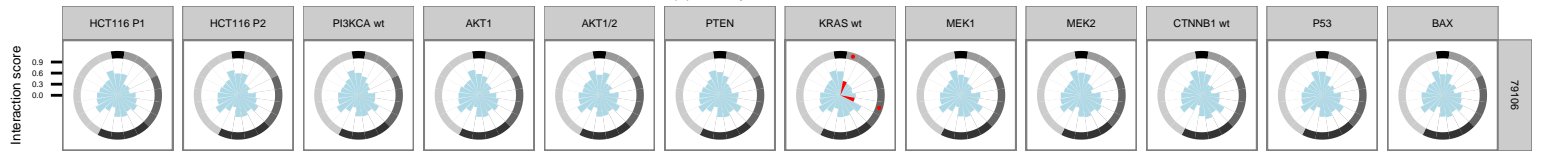
Bromoacetyl alprenolol menthane



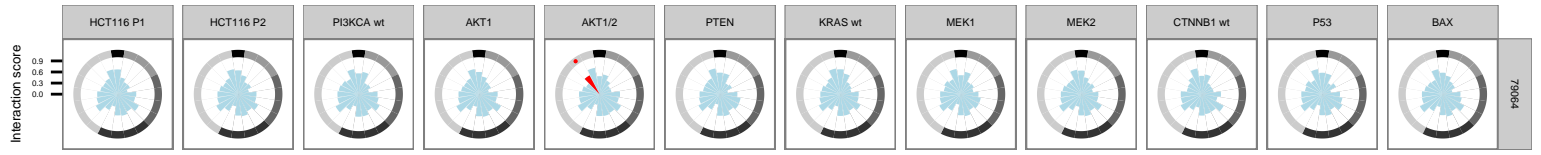
(+)-Bromocriptine methanesulfonate



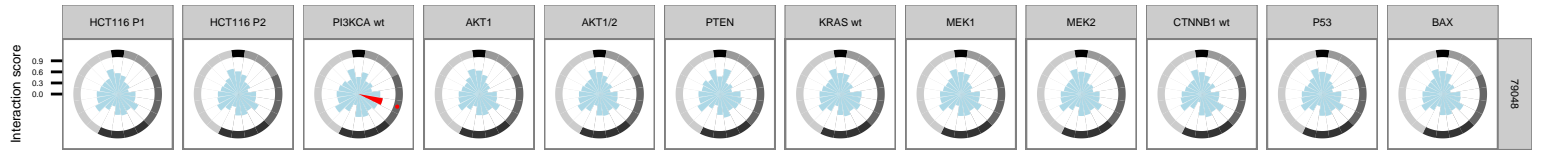
(+)-Brompheniramine maleate



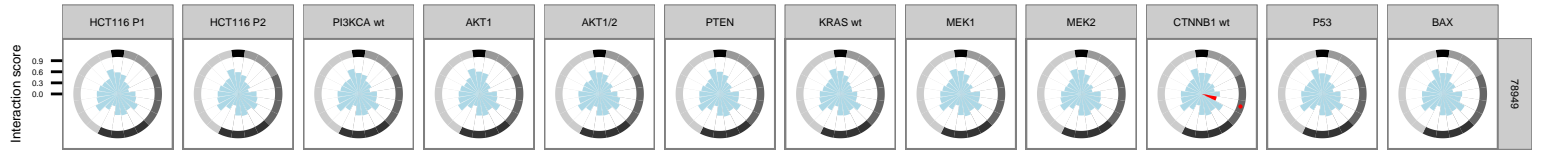
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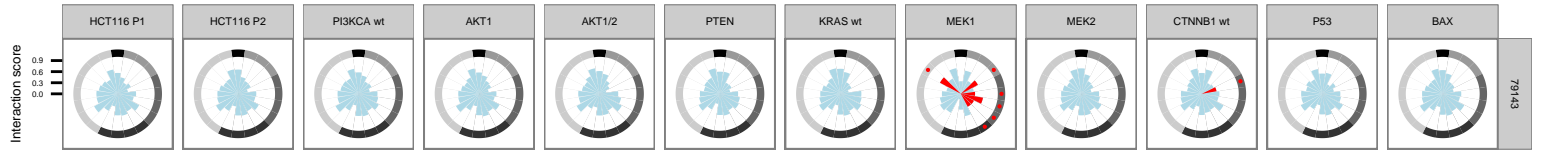
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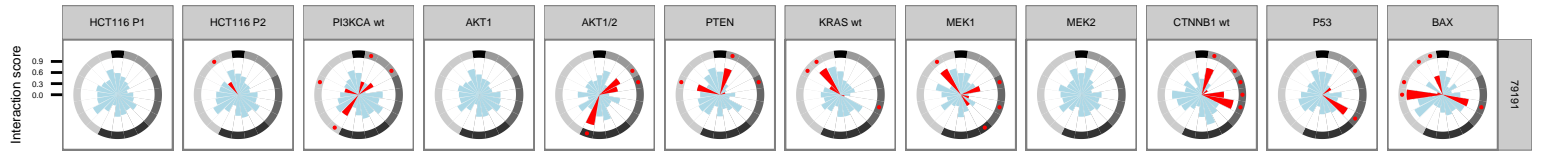
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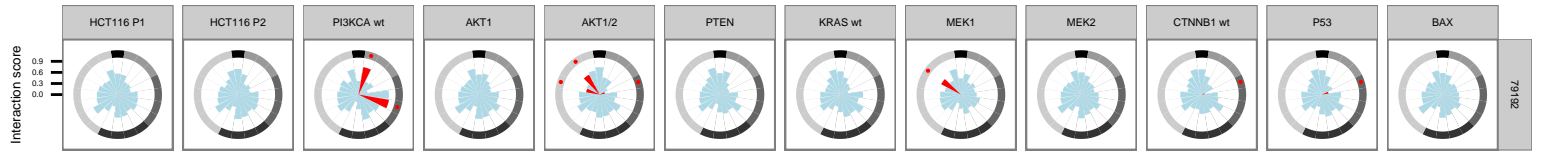
Caffeic acid phenethyl ester



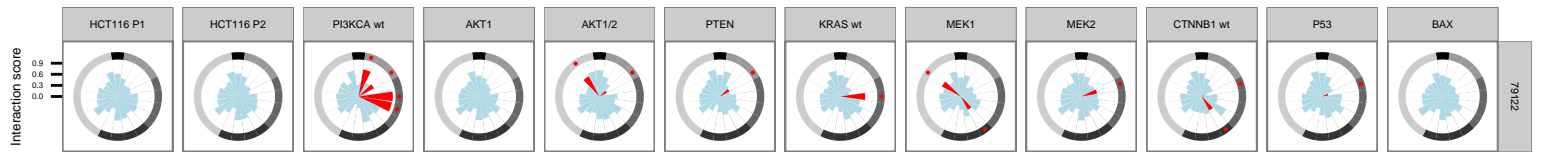
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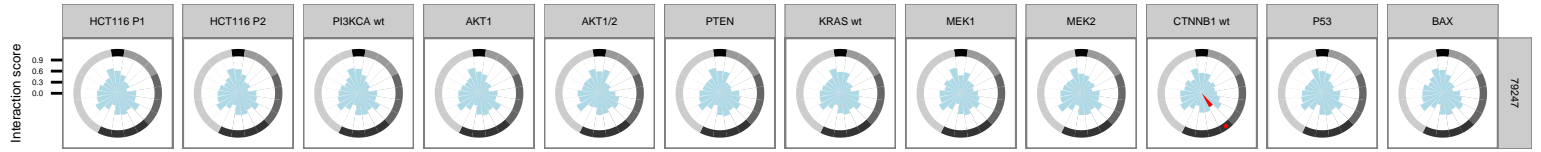
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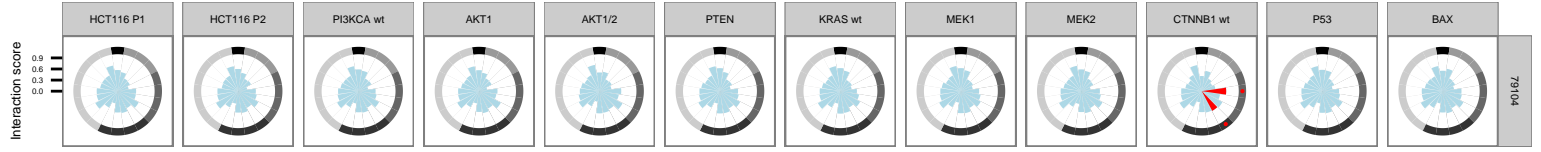
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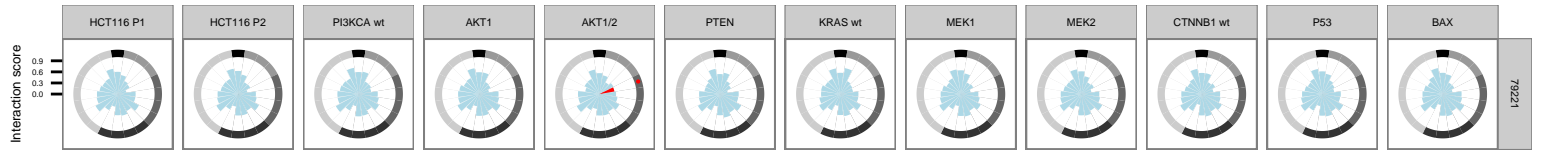
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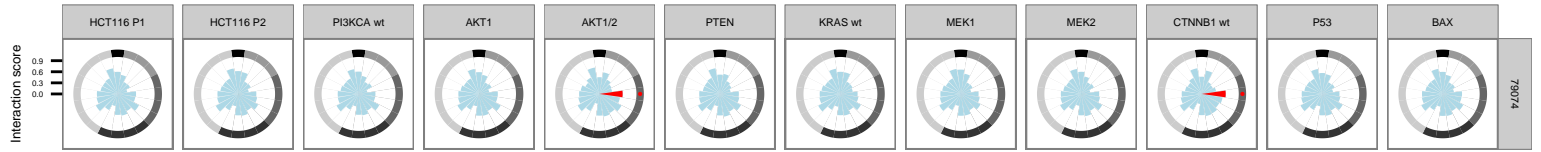
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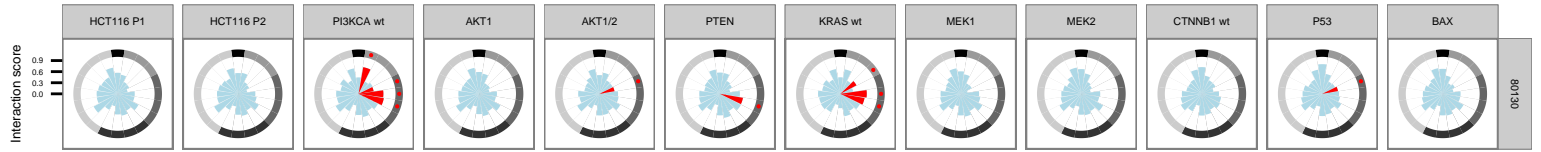
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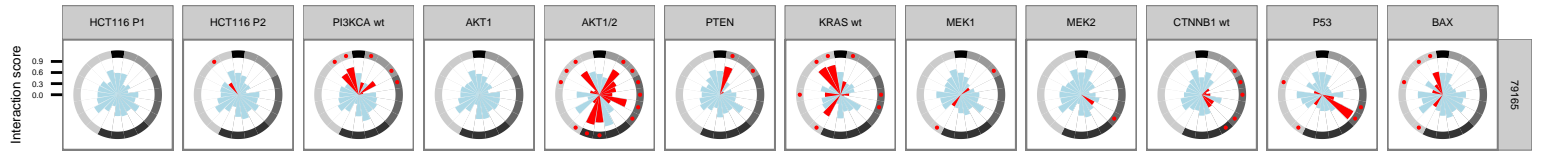
CB 1954



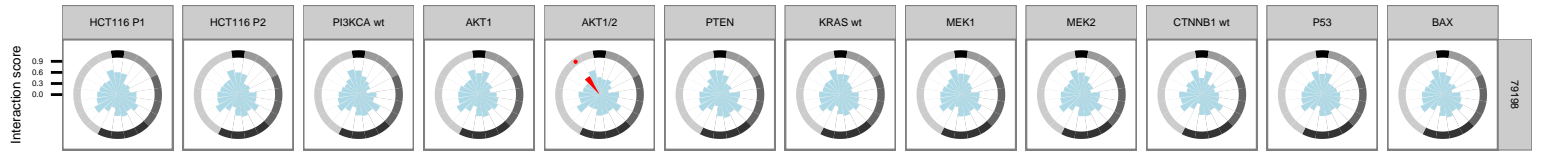
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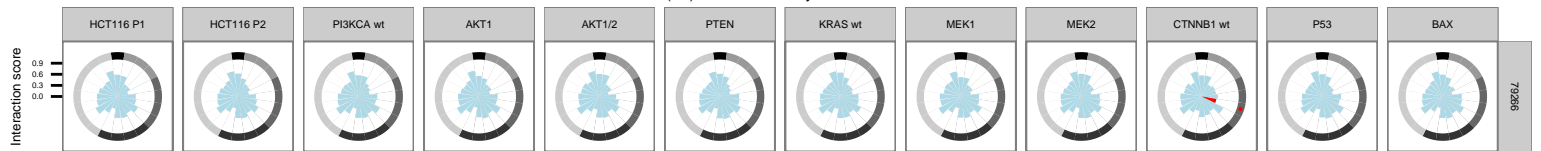
CGP-74514A hydrochloride



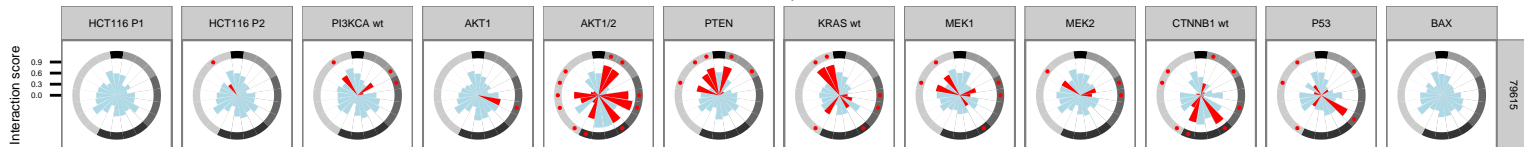
CGS-15943



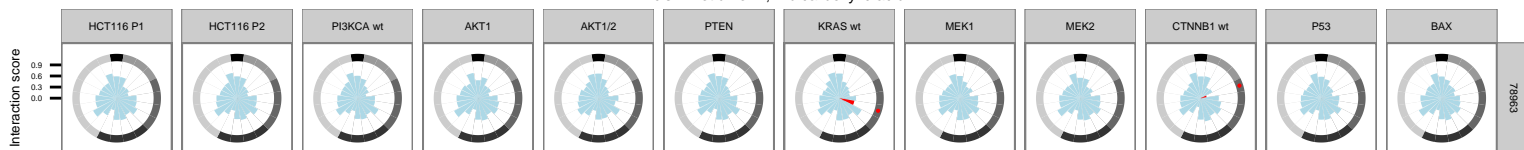
(+)-Chloro-APB hydrobromide



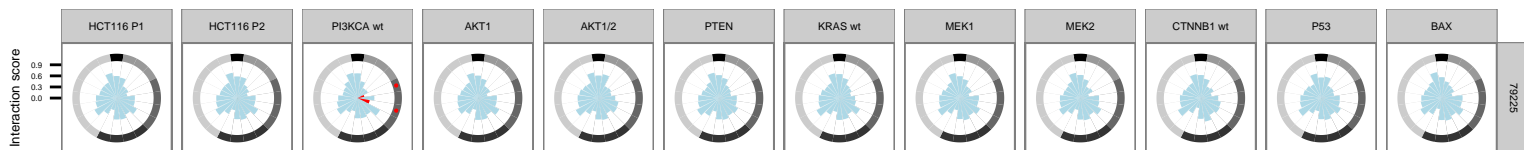
CHM-1 hydrate



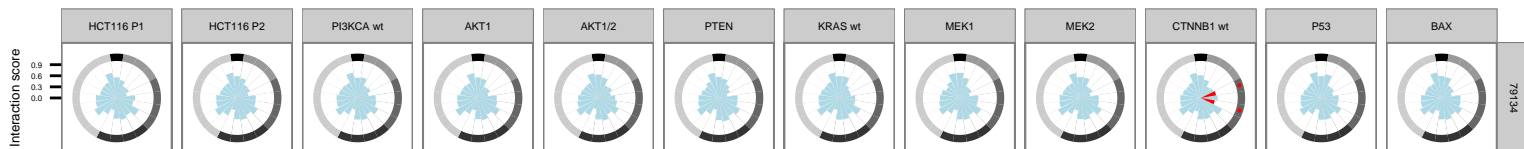
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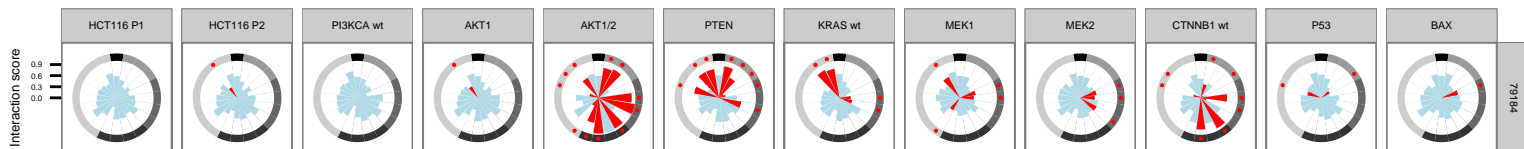
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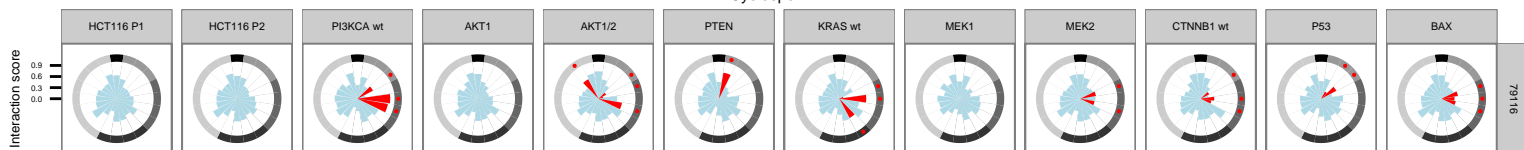
Clemastine fumarate



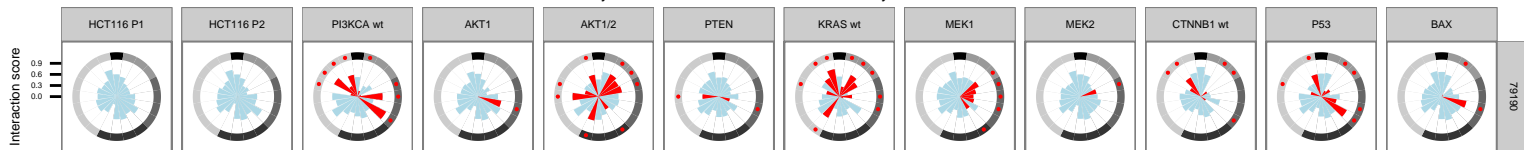
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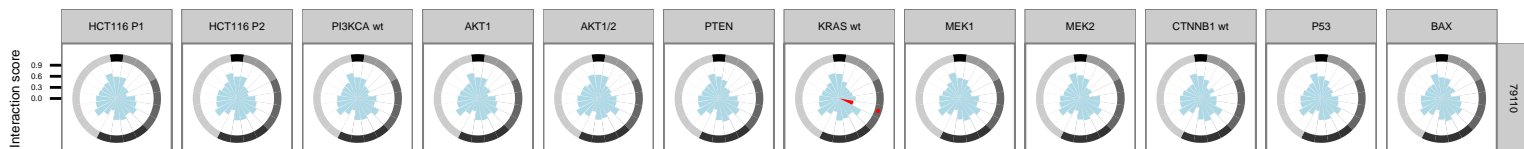
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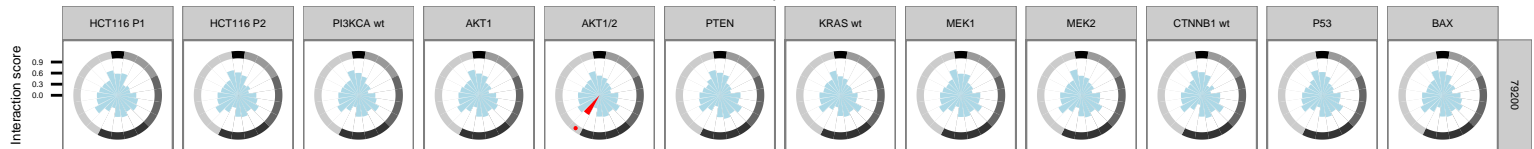
Cytosine-1-beta-D-arabinofuranoside hydrochloride



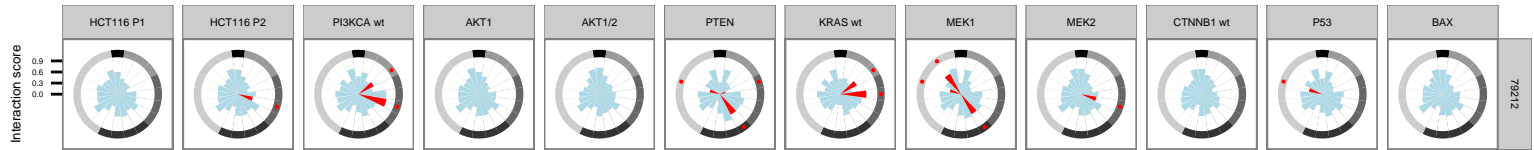
DAPH



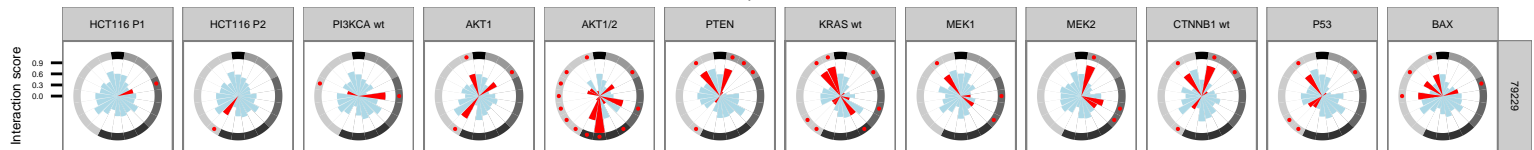
Debrisoquin sulfate



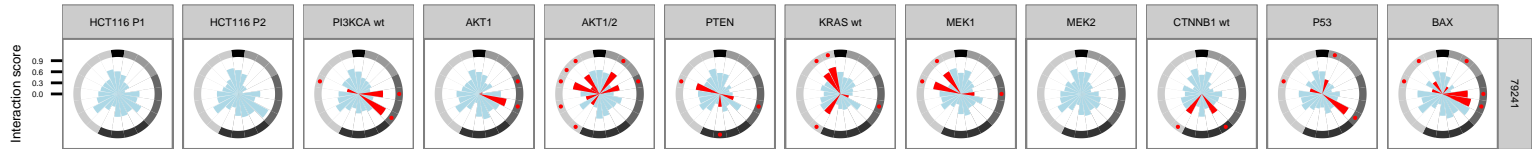
Dequalinium chloride hydrate



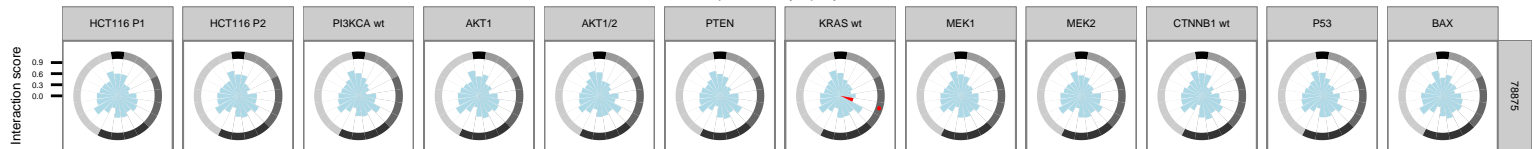
Dihydroouabain



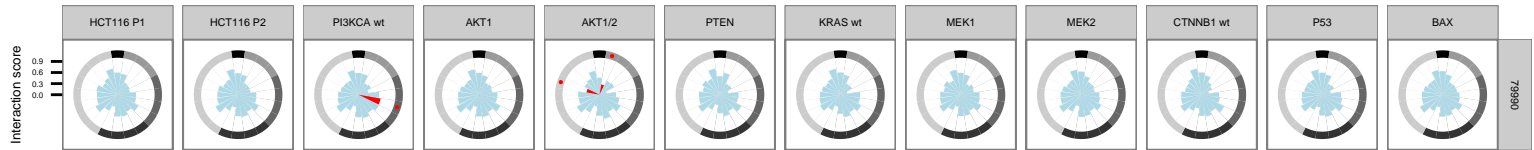
Diphenylethidium chloride



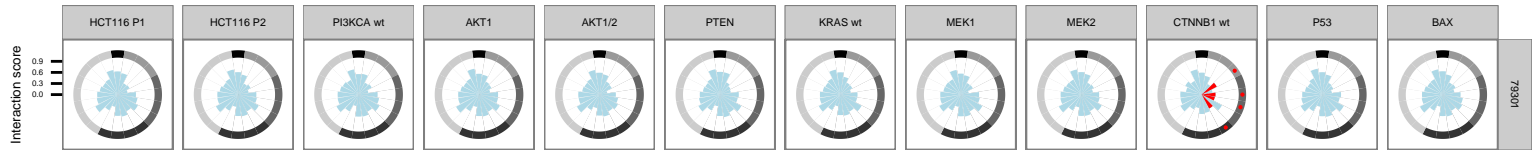
DL-alpha-Methyl-p-tyrosine



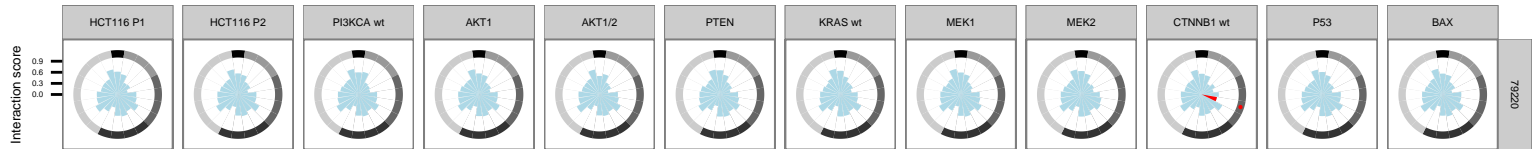
DL-Stearoylcarnitine chloride



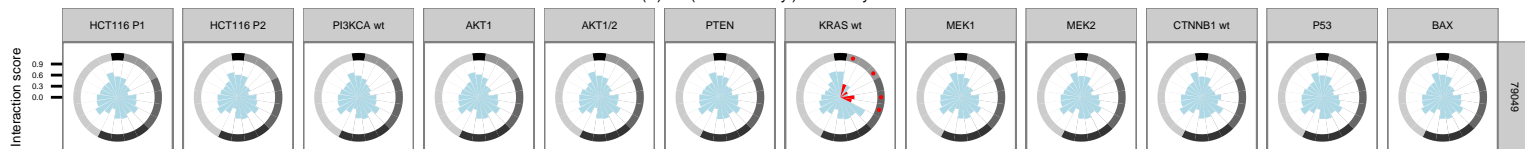
Domperidone



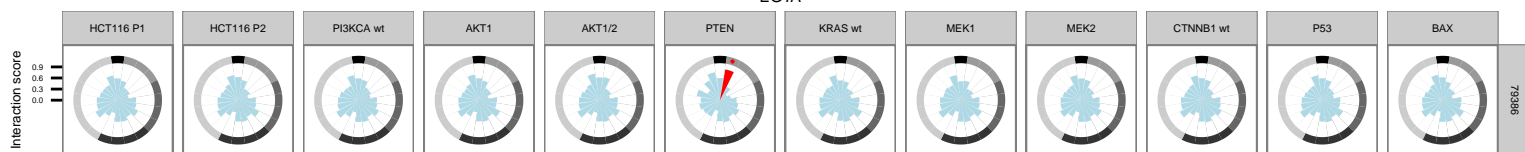
Droperidol



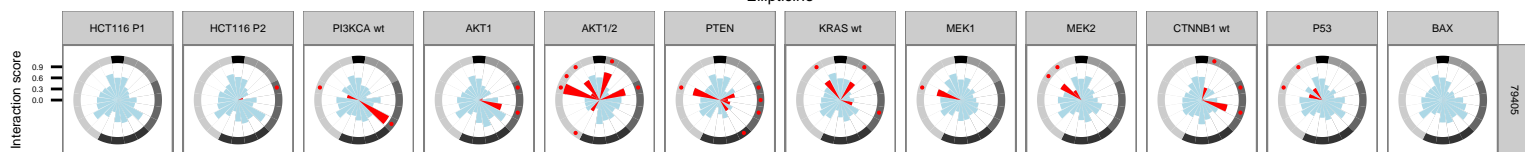
(E)-5-(2-Bromovinyl)-2'-deoxyuridine



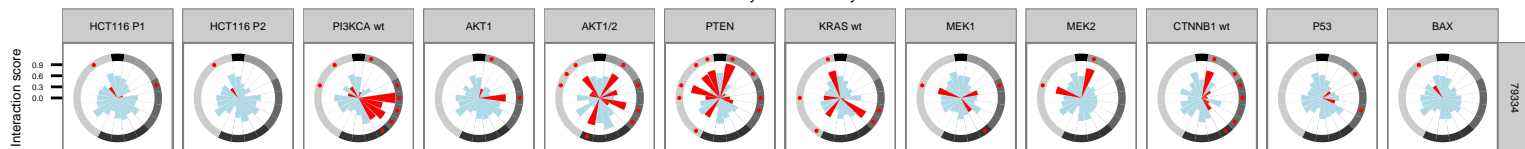
EGTA



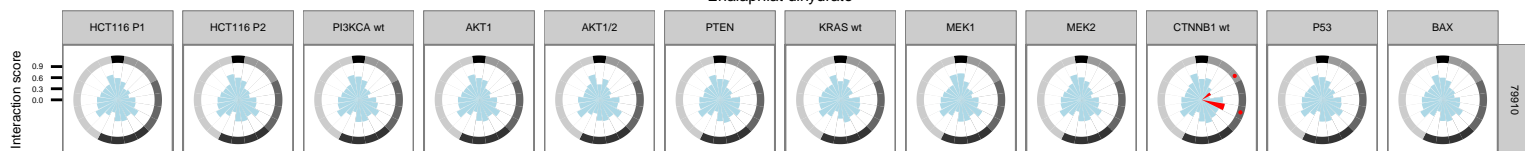
Ellipticine



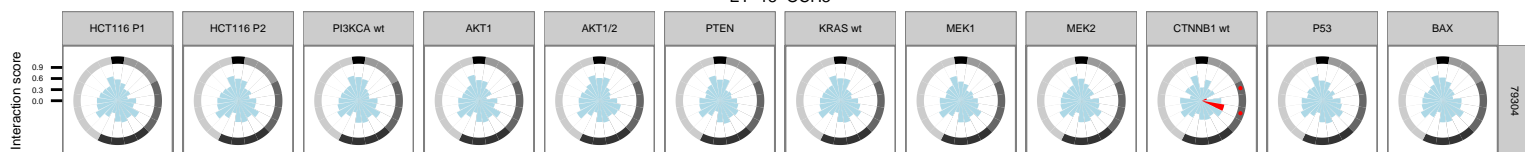
Emetine dihydrochloride hydrate



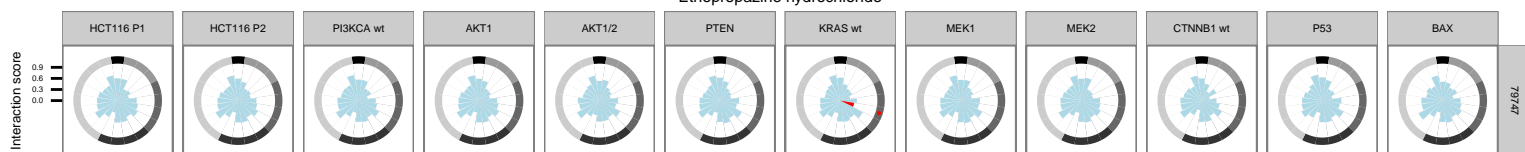
Enalaprilat dihydrate



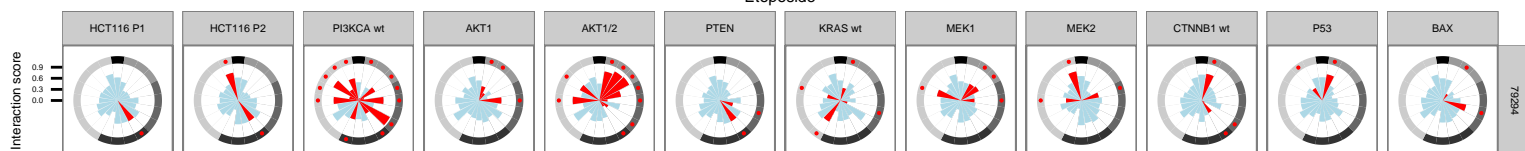
ET-18-OCH3



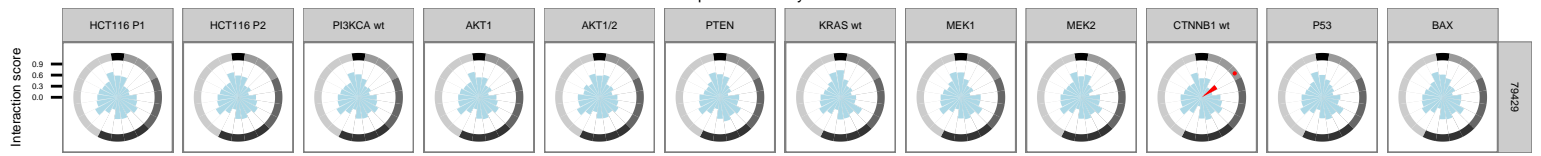
Ethopropazine hydrochloride



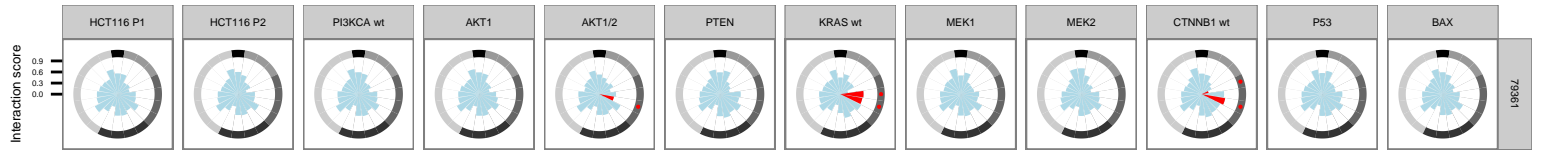
Etoposide



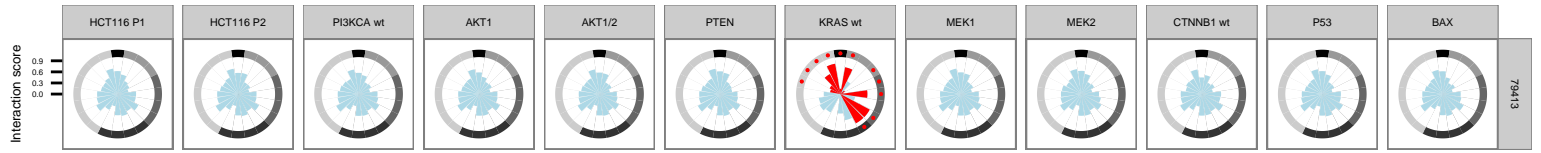
Fluphenazine dihydrochloride



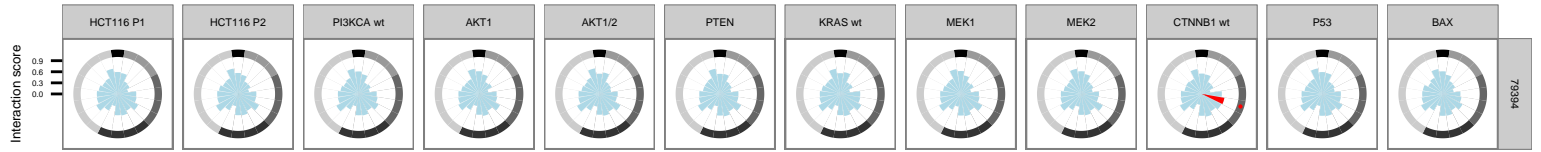
Forskolin



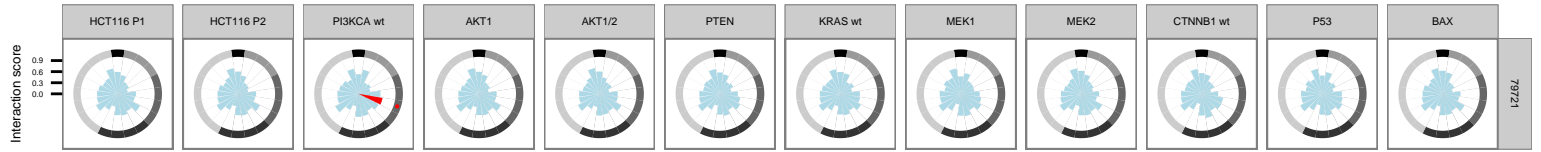
Ganciclovir



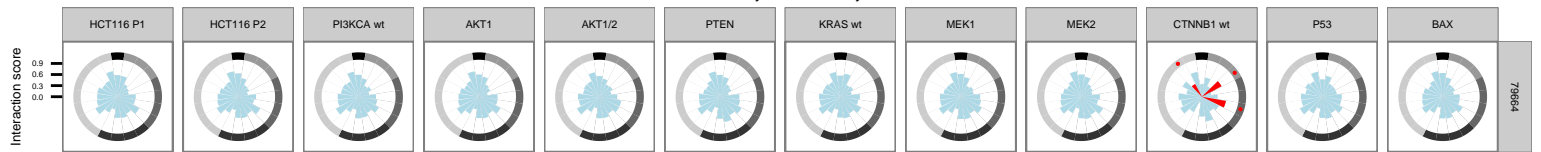
Genistein



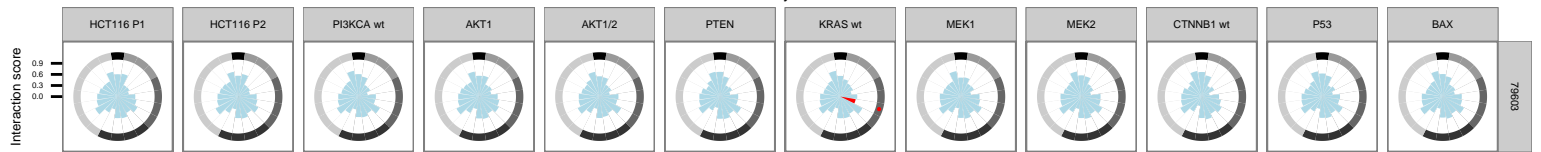
Gossypol



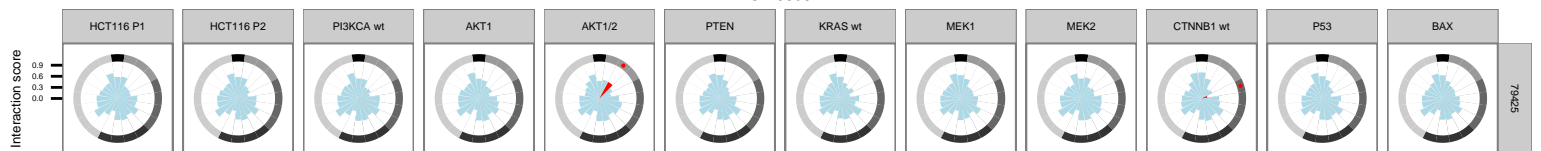
GR 127935 hydrochloride hydrate



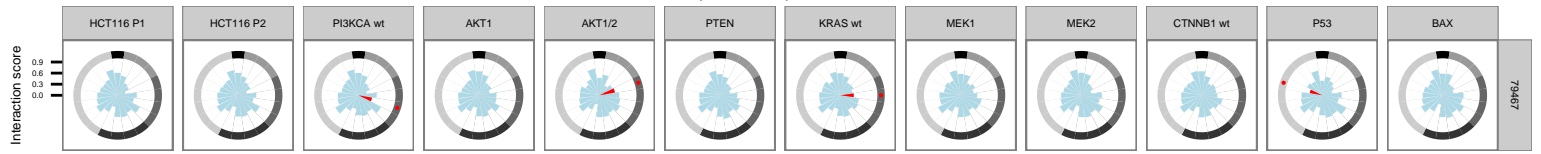
GW405833 hydrochloride



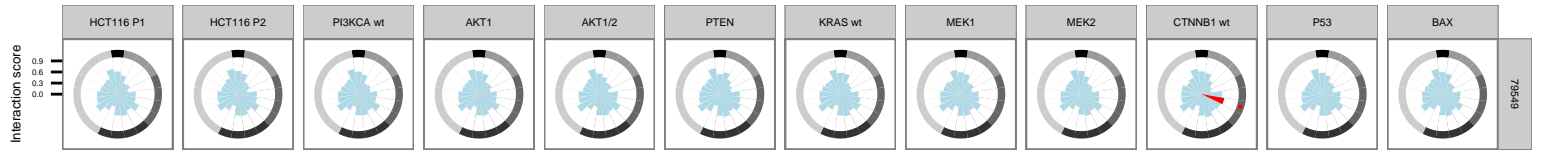
GW9508



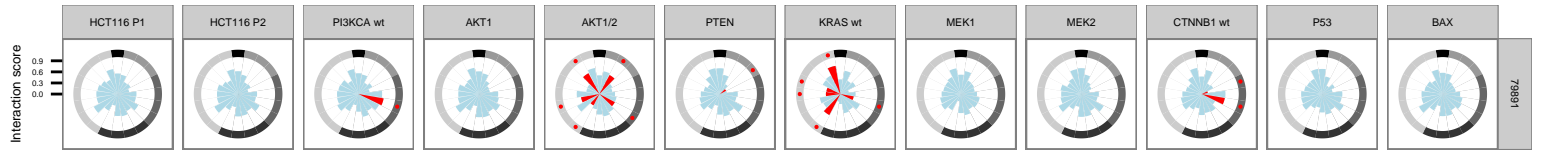
Hydralazine hydrochloride



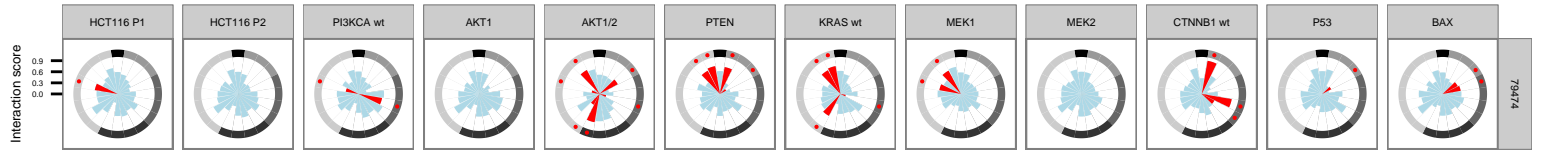
IB-MECA



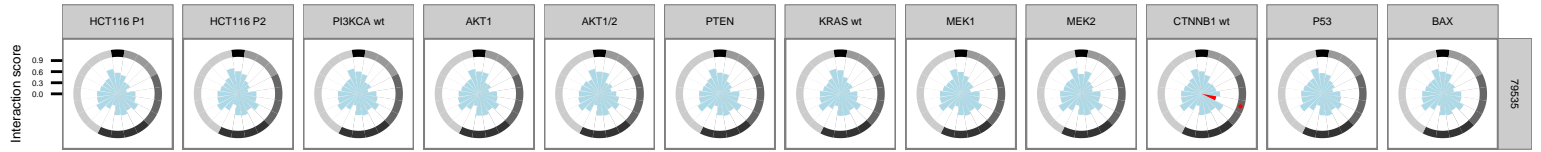
IC 261



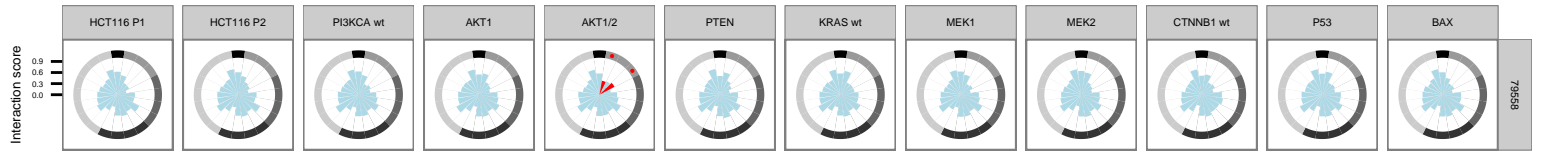
Idarubicin



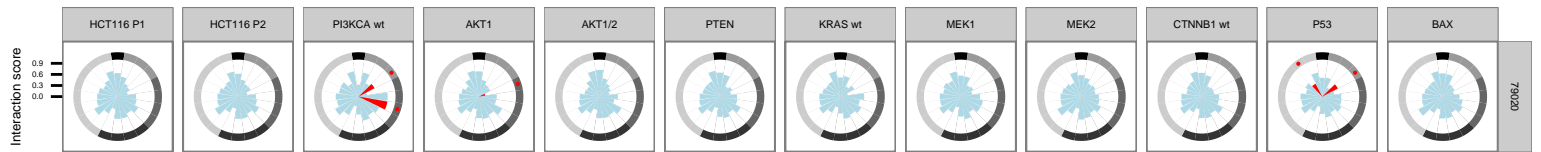
Ifenprodil tartrate



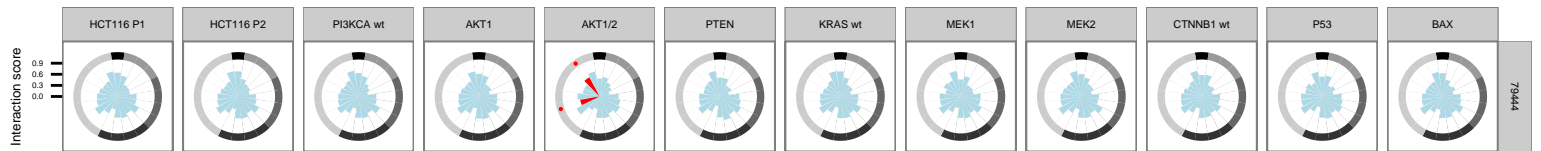
Indatraline hydrochloride



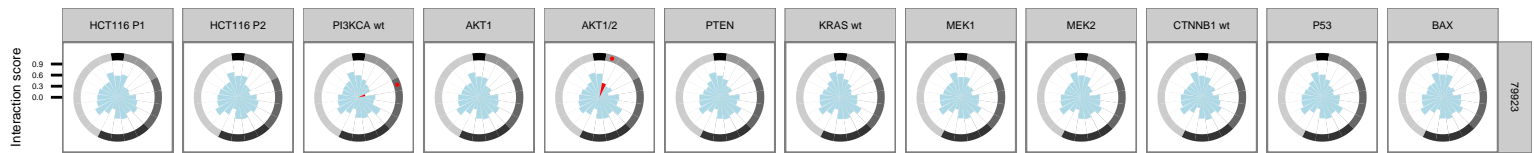
Indirubin-3'-oxime



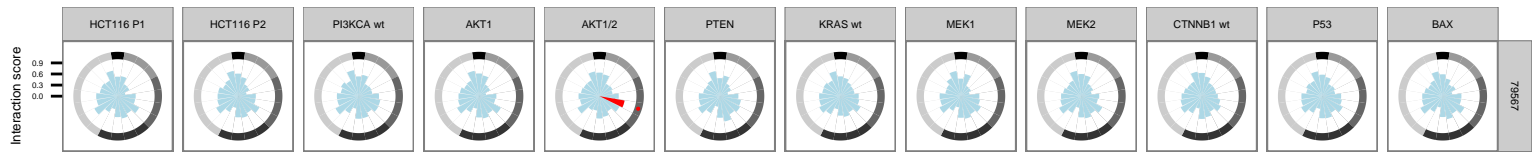
Iodoacetamide



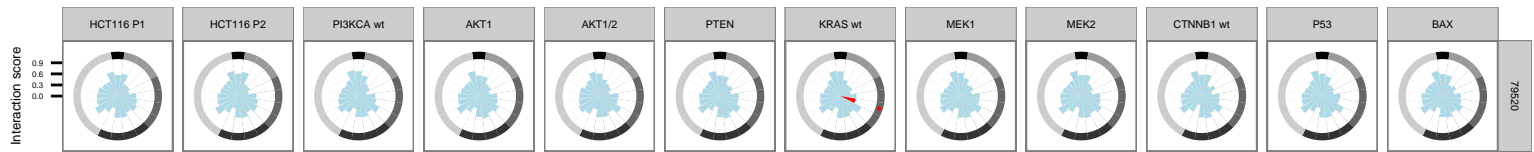
IRAK-1/4 Inhibitor I



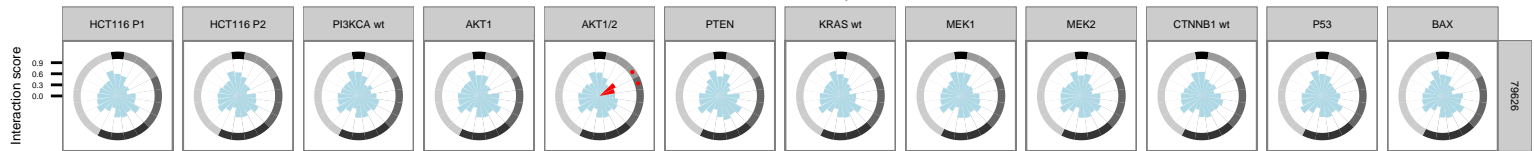
Ivermectin



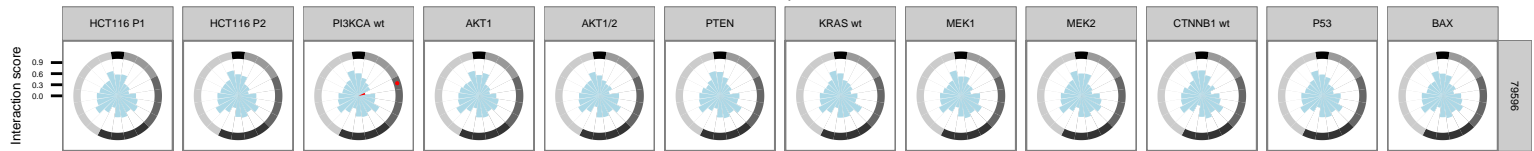
JL-18



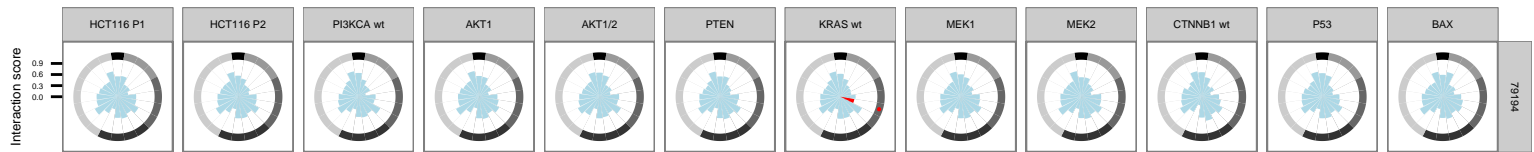
L-703,606 oxalate salt hydrate



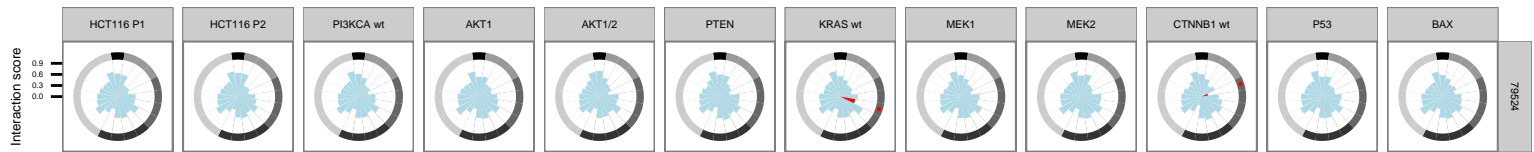
L-750,667 trihydrochloride



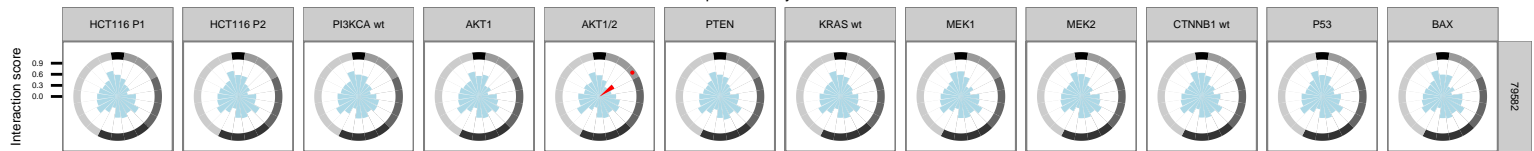
L-Canavanine sulfate



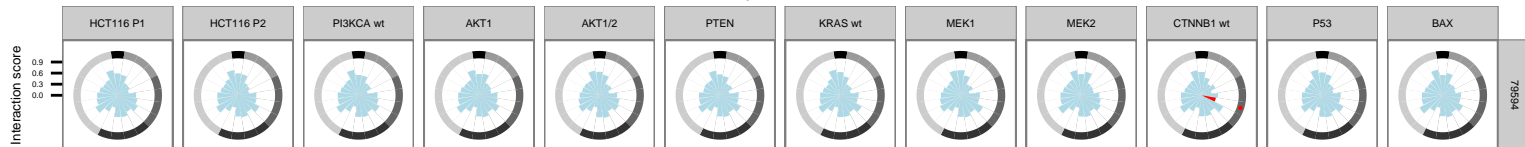
LFM-A13



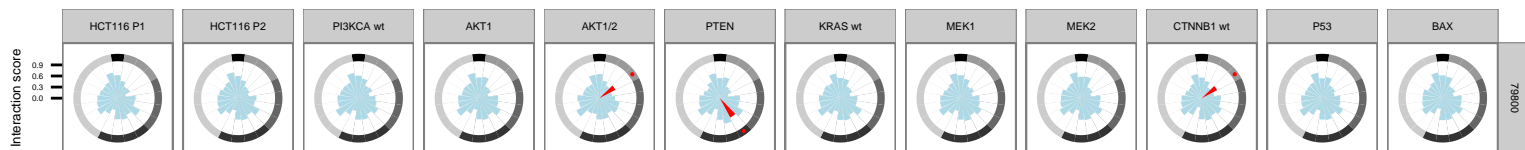
Loperamide hydrochloride



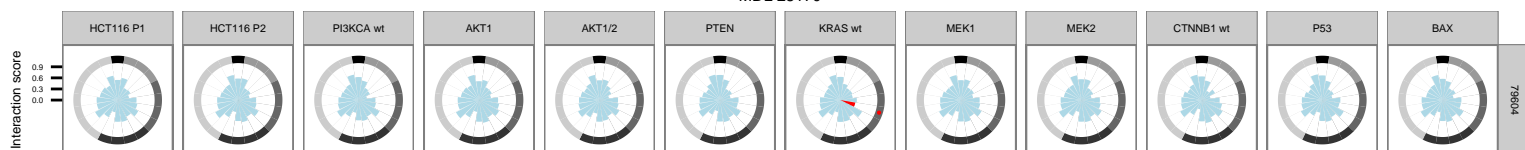
Loxapine succinate



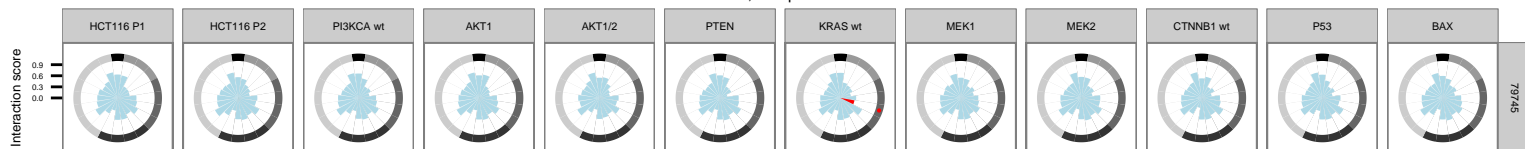
LP44



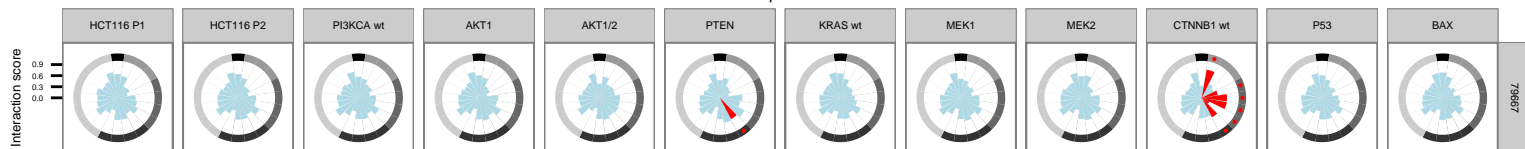
MDL 28170



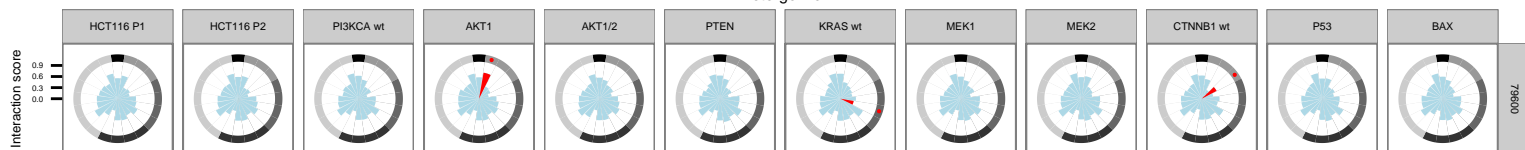
Me-3,4-dephostatin



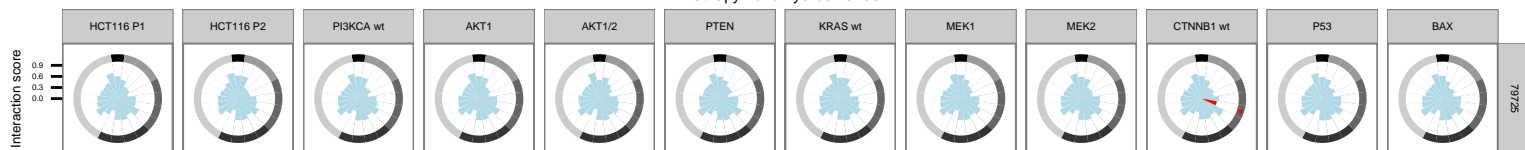
Melphalan



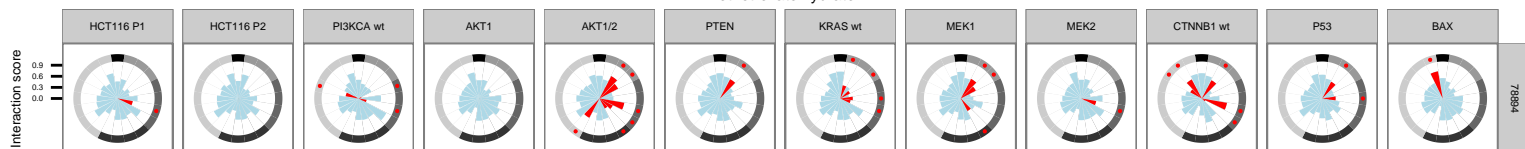
Metergoline



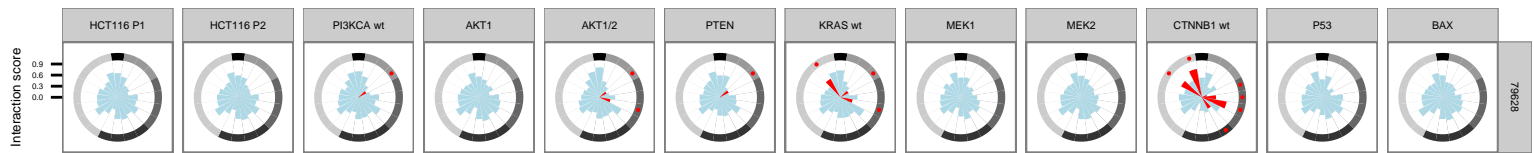
Methapyrilene hydrochloride



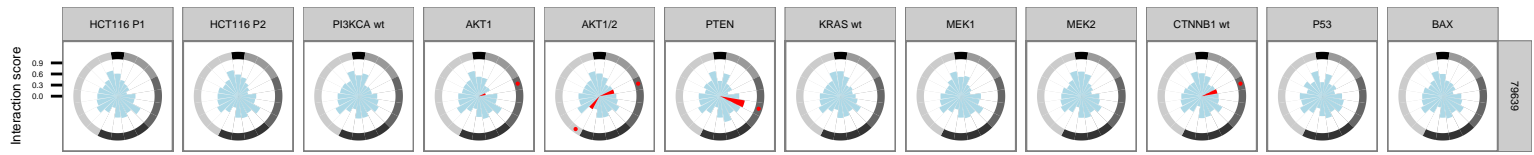
Methotrexate hydrate



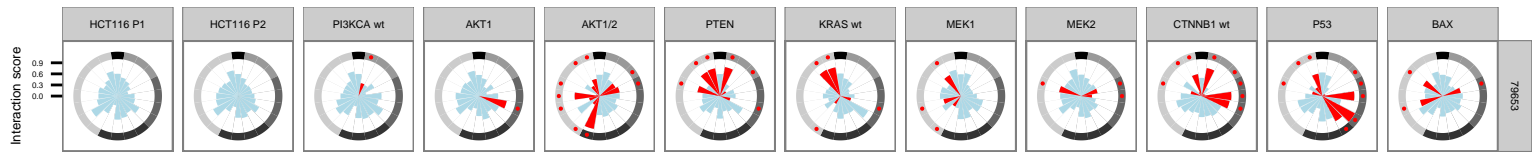
Mevastatin



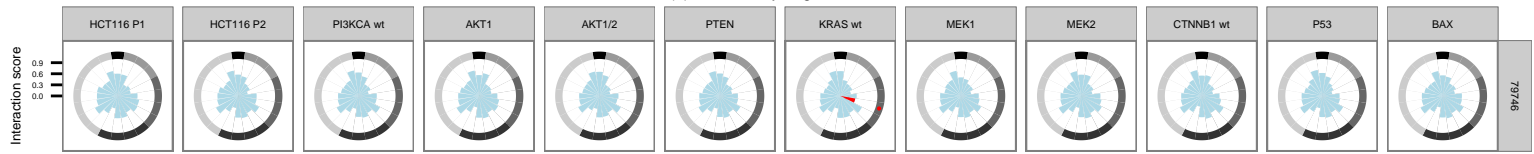
MG 624



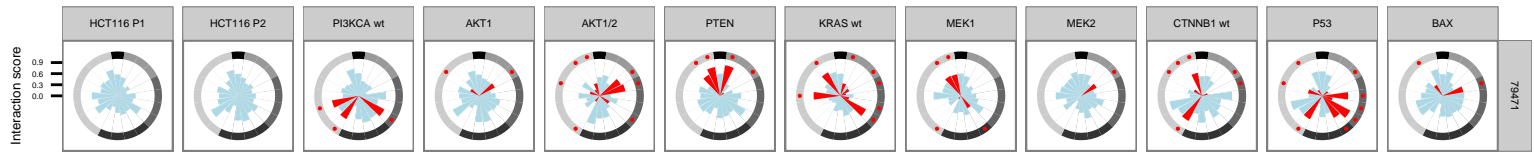
Mitoxantrone



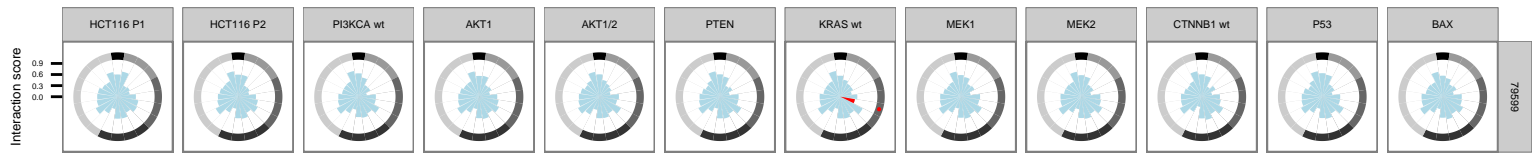
(+)-MK-801 hydrogen maleate



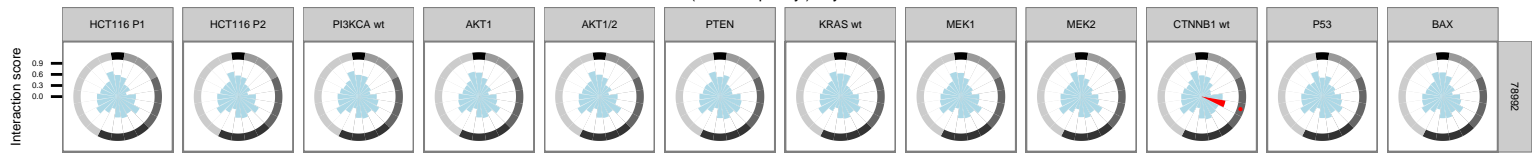
MNS



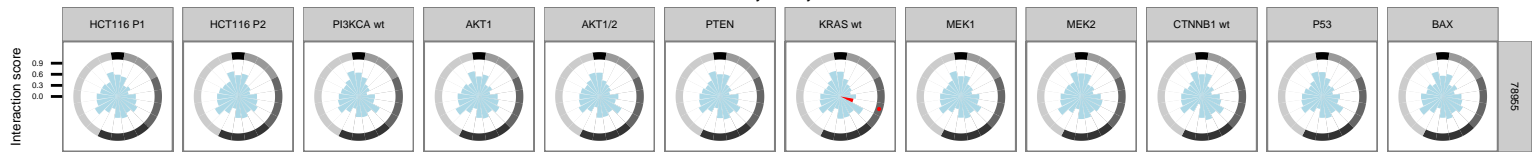
Molsidomine



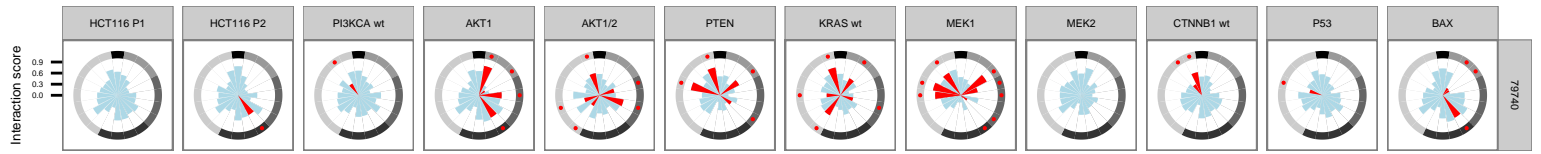
N6-2-(4-Aminophenyl)ethyladenosine



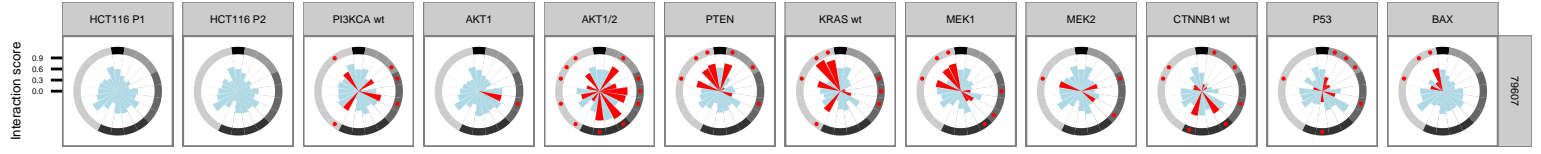
N-Acetyl-L-Cysteine



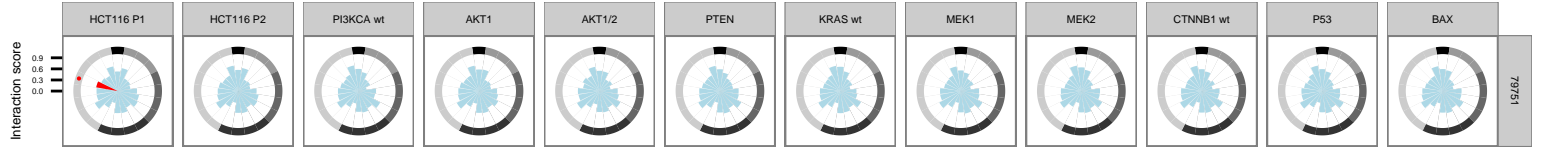
Niclosamide



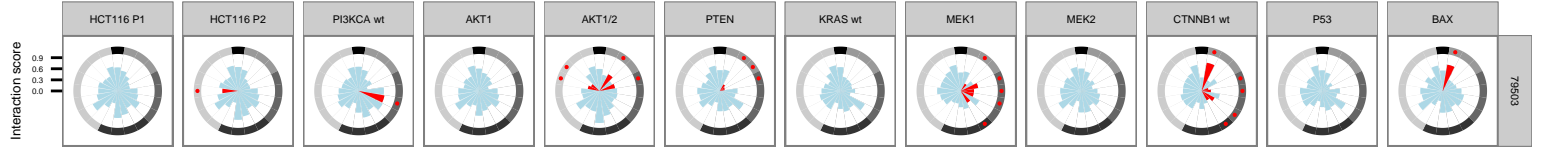
Nocodazole



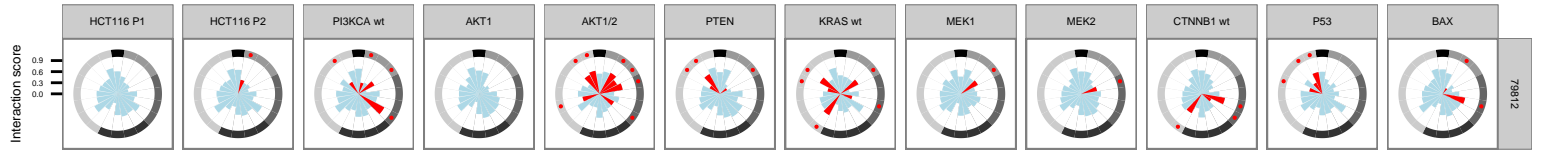
Nordihydroguaiaretic acid from Larrea divaricata (creosote bush)



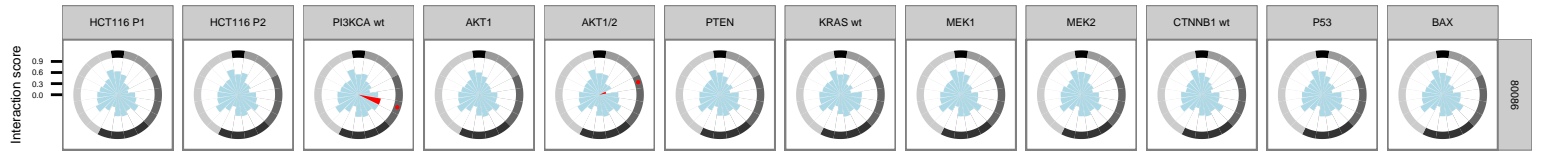
NSC 95397



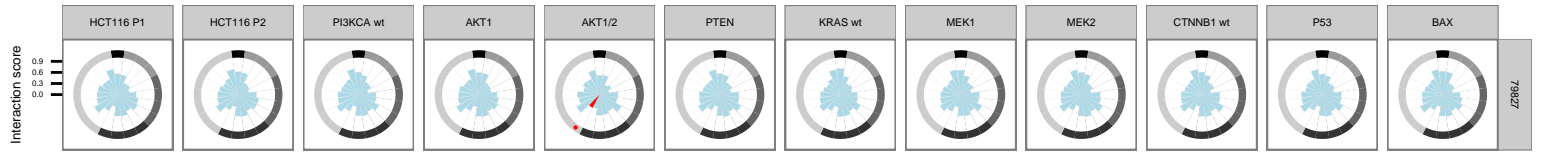
NU2058



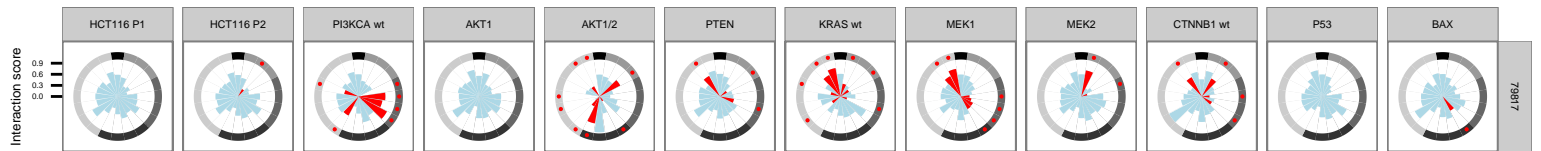
NU6027



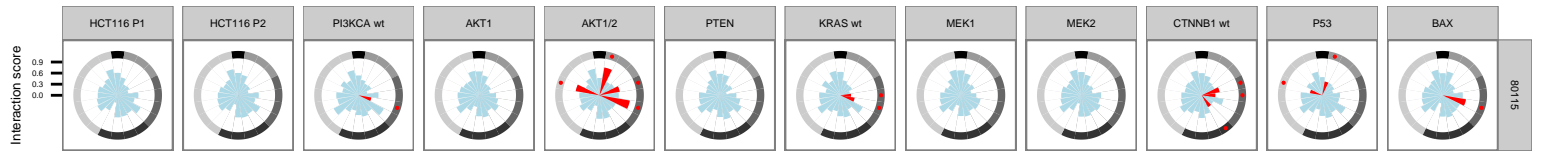
ODQ



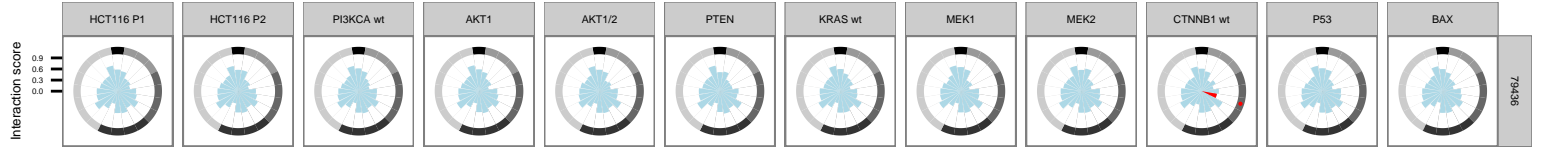
Ouabain



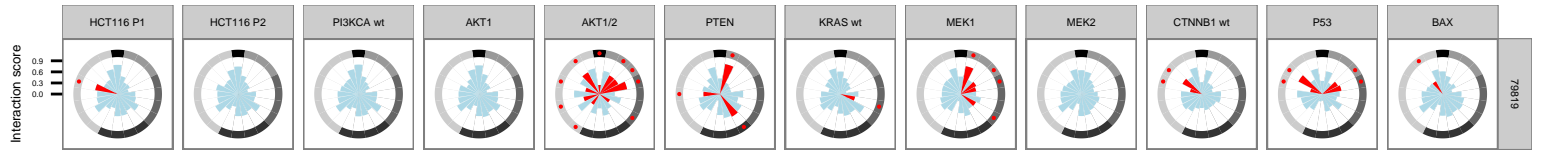
PAC-1



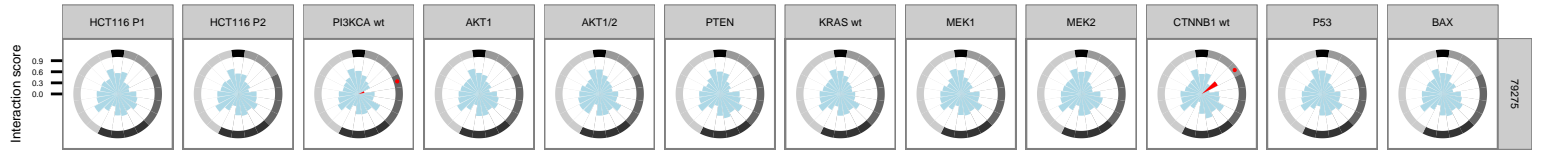
Paliperidone



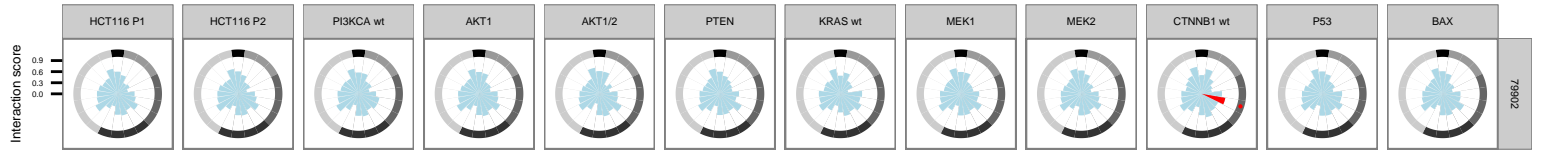
Parthenolide



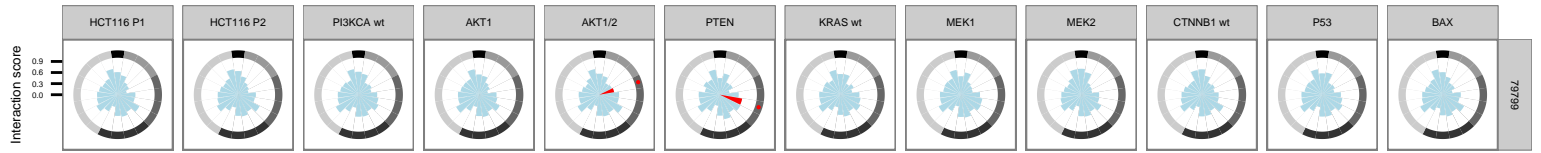
PD 169316



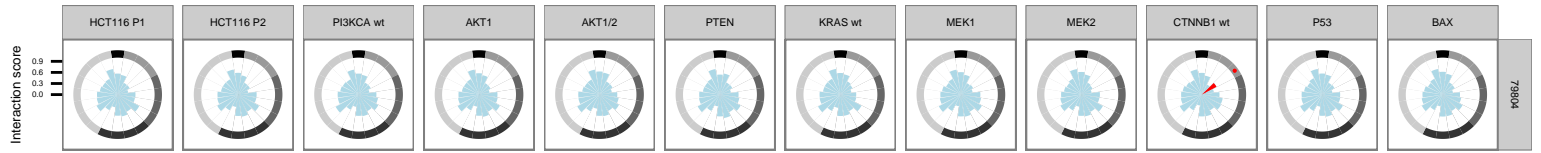
PD 98,059



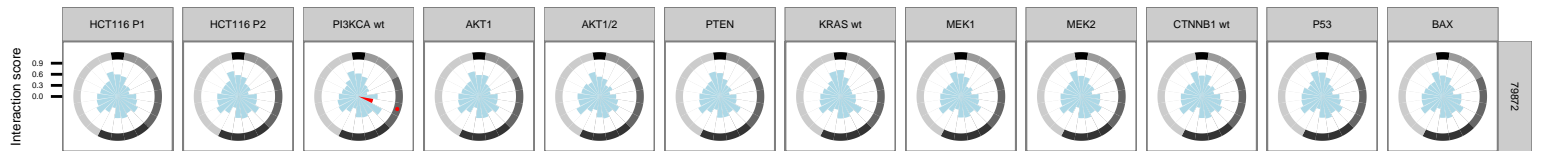
Pentamidine isethionate



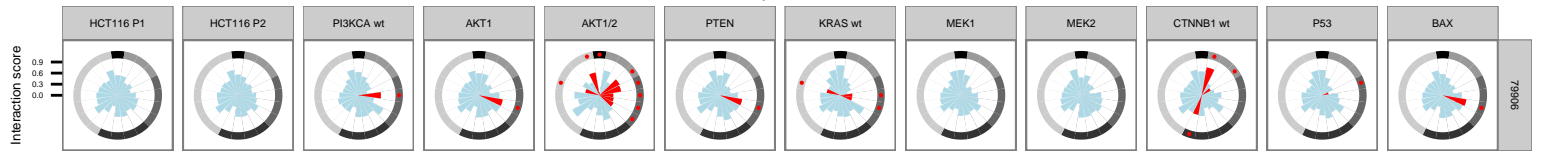
Perphenazine



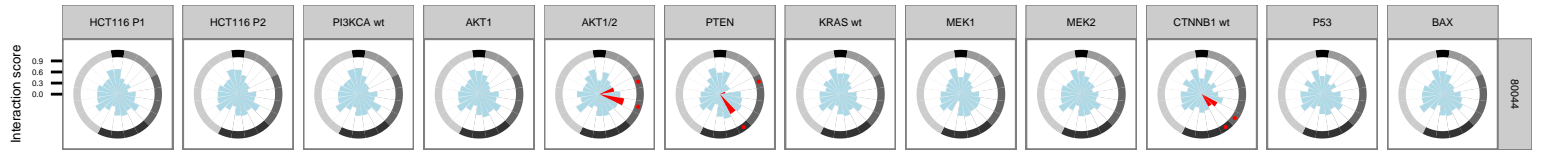
Phenamyl methanesulfonate



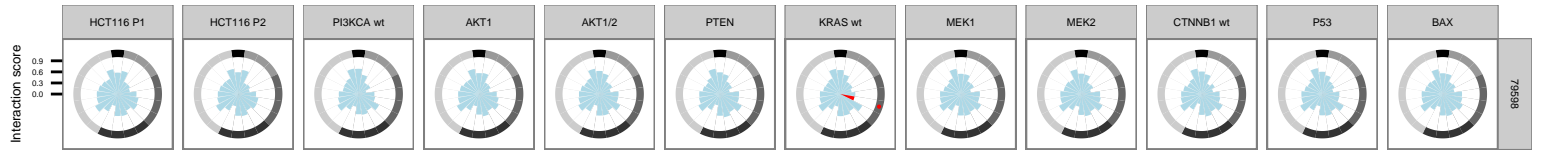
Phorbol 12-myristate 13-acetate



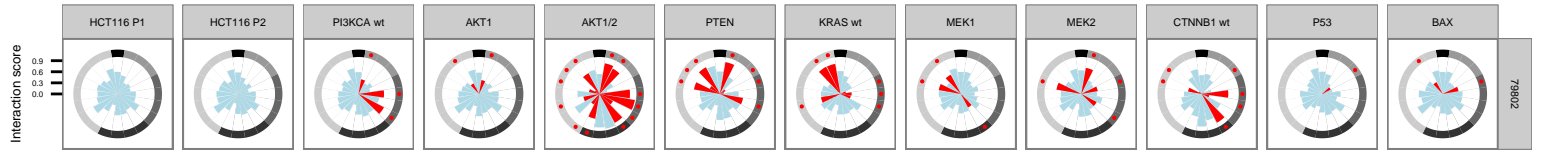
Pifithrin- μ



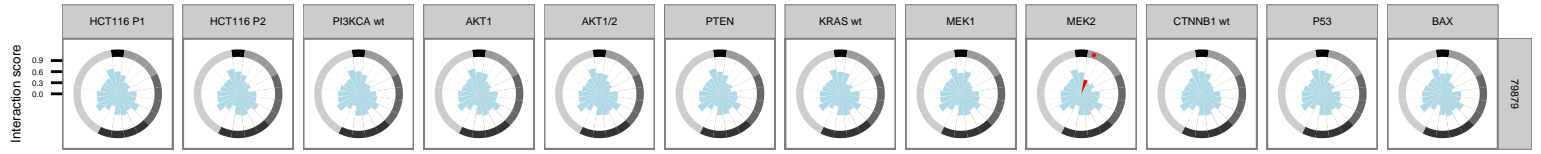
p-MPPI hydrochloride



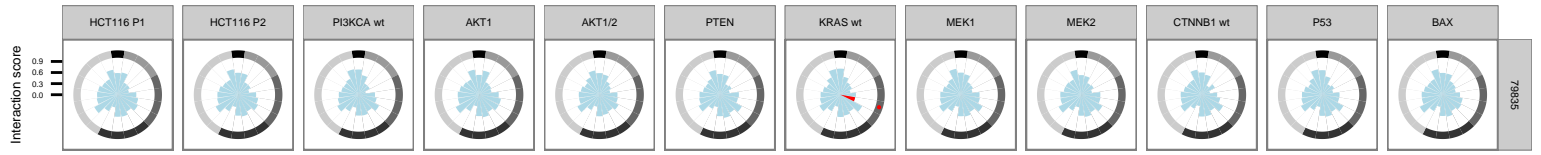
Podophyllotoxin



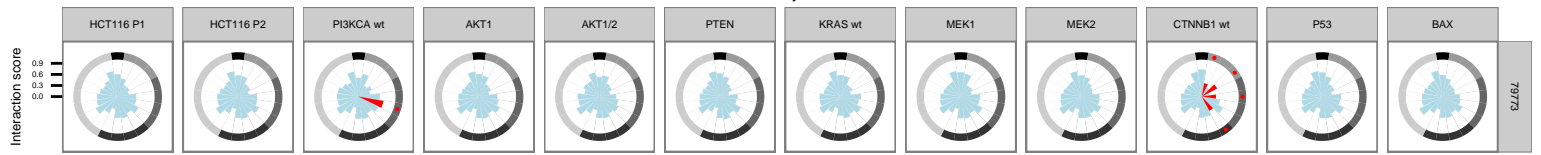
Prilocaine hydrochloride



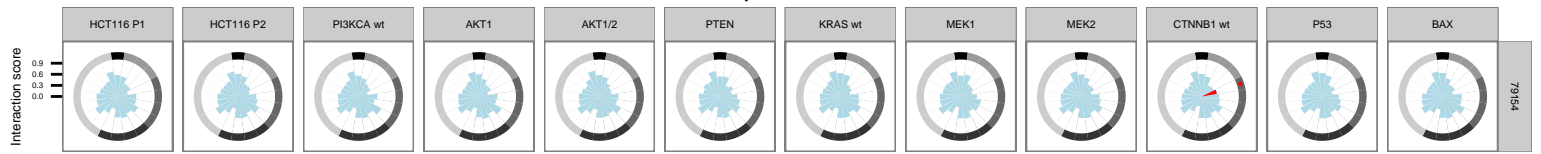
Promazine hydrochloride



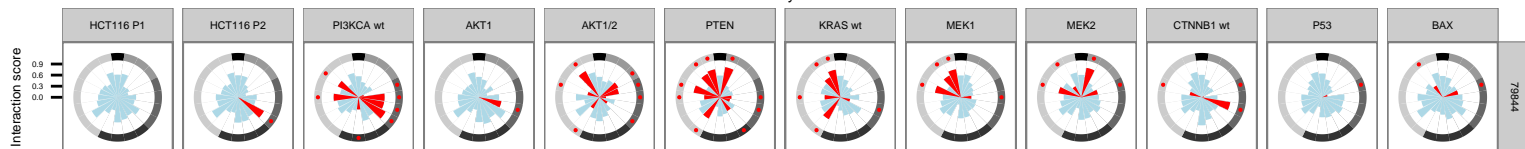
Promethazine hydrochloride



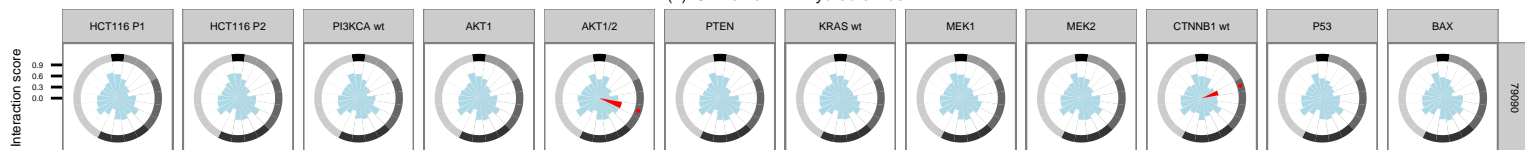
Pyrocatechol



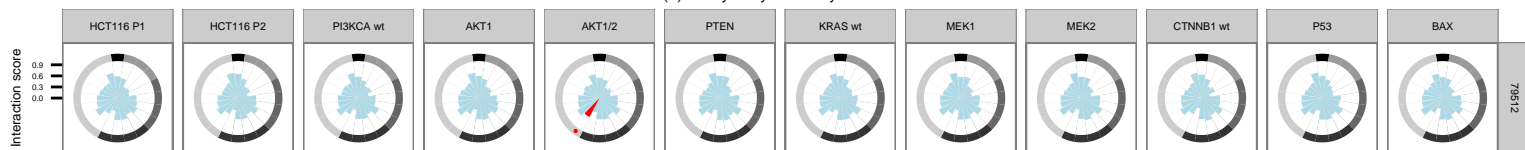
Quinacrine dihydrochloride



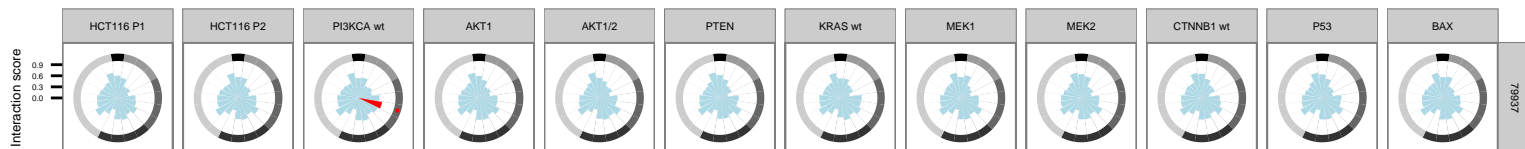
R(+)-6-Bromo-APB hydrobromide



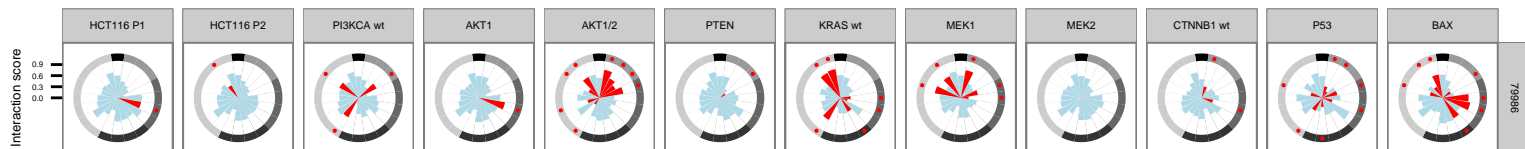
R-(+)-8-Hydroxy-DPAT hydrobromide



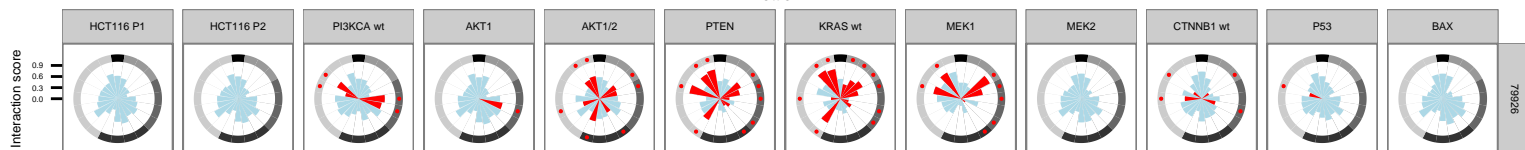
Ribavirin



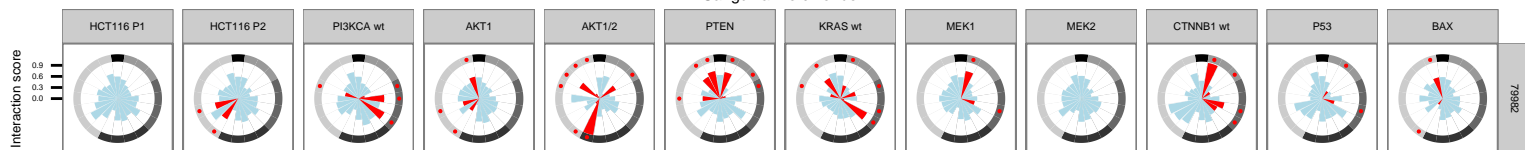
Rotenone



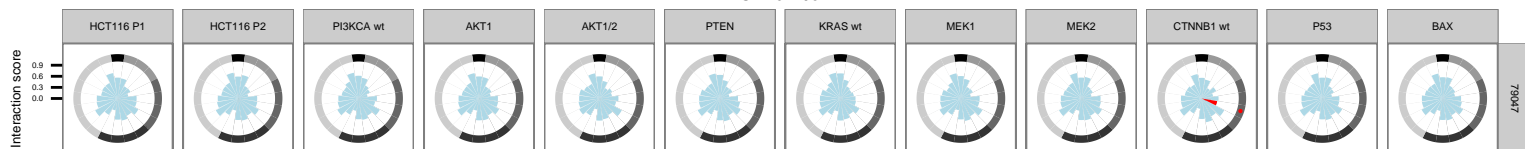
Rottlerin



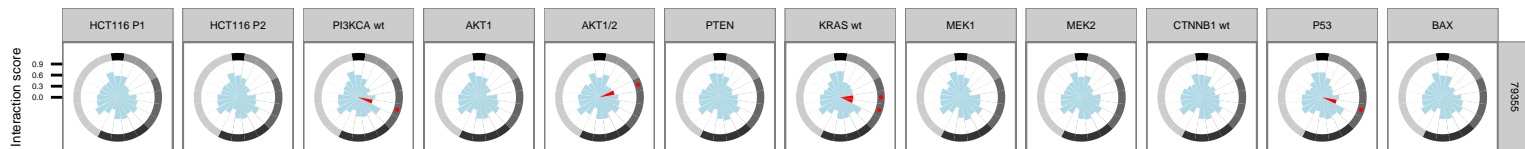
Sanguinarine chloride



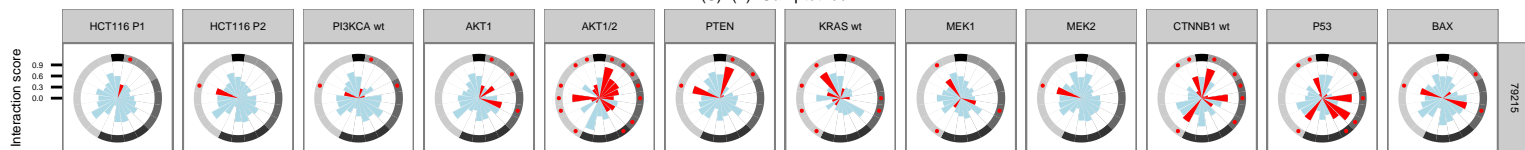
SB 202190



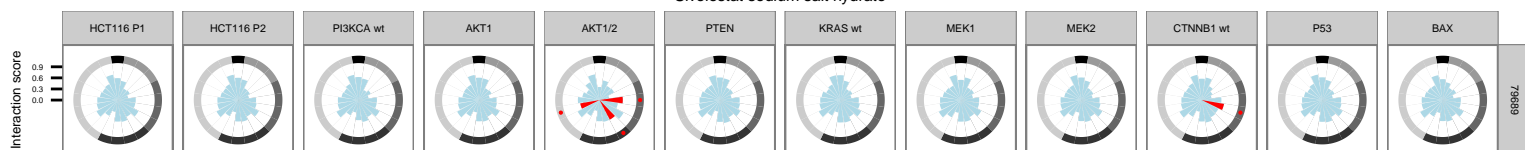
SB 415286



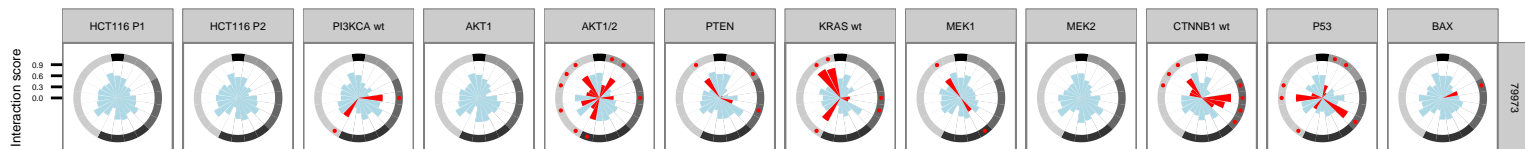
(S)-(+)-Camptothecin



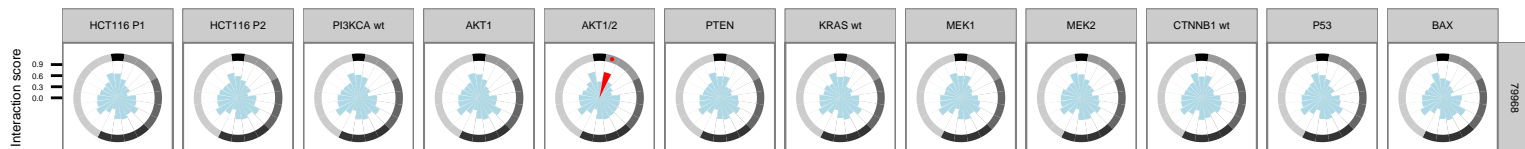
Sivelestat sodium salt hydrate



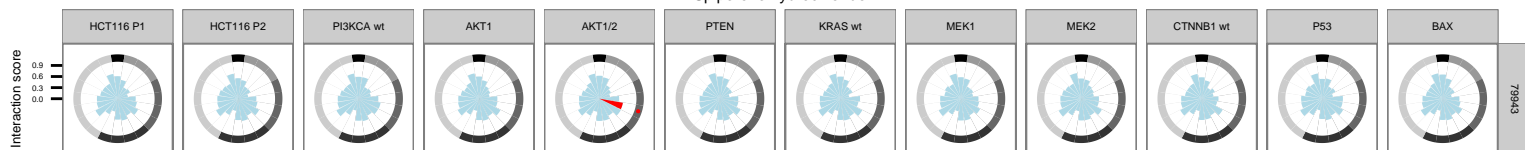
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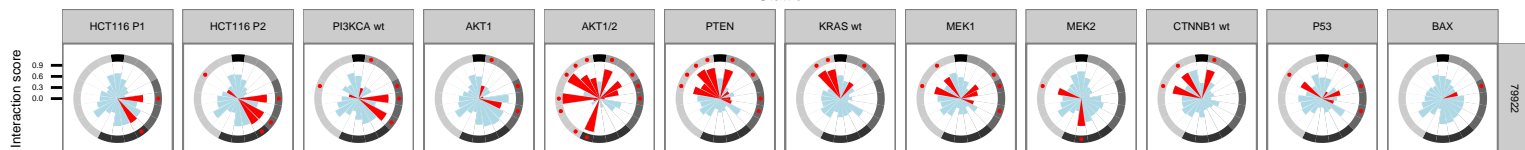
Sobuzoxane



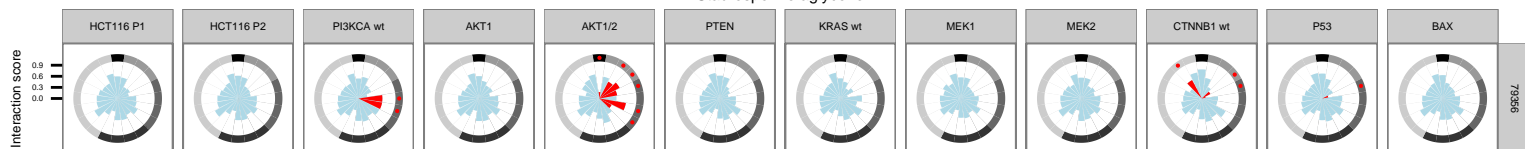
Siperone hydrochloride



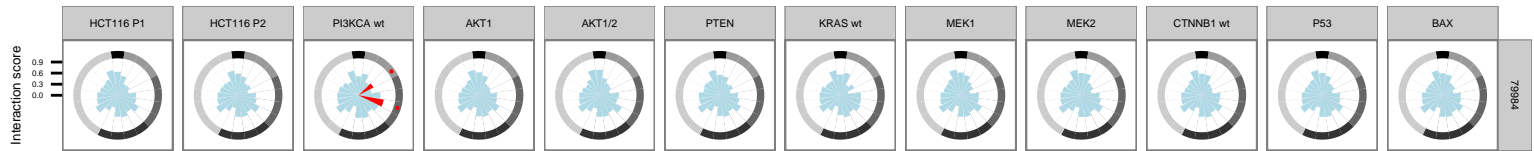
Stattic



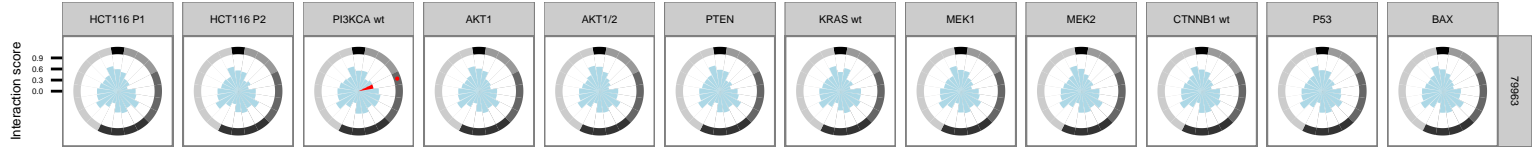
Staurosporine aglycone



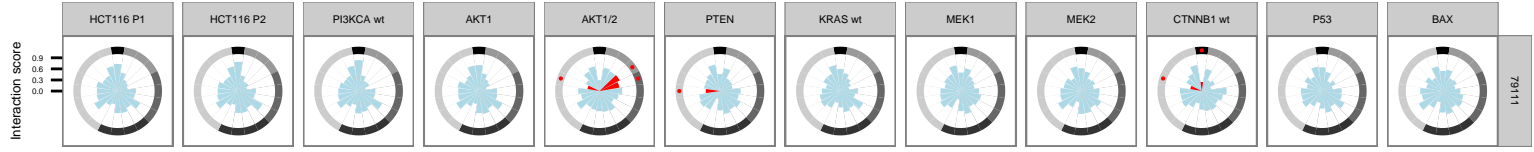
SU 5416



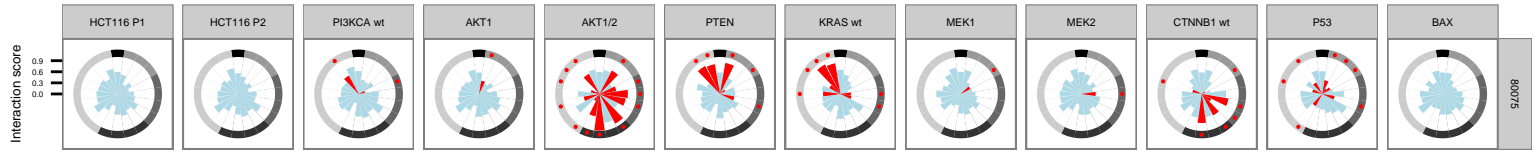
(-)-Sulpiride



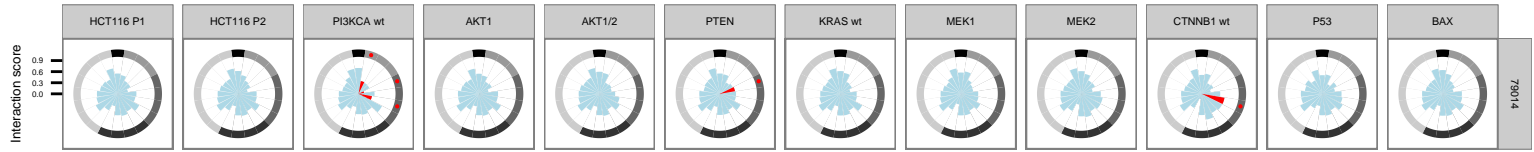
Supercinnamaldehyde



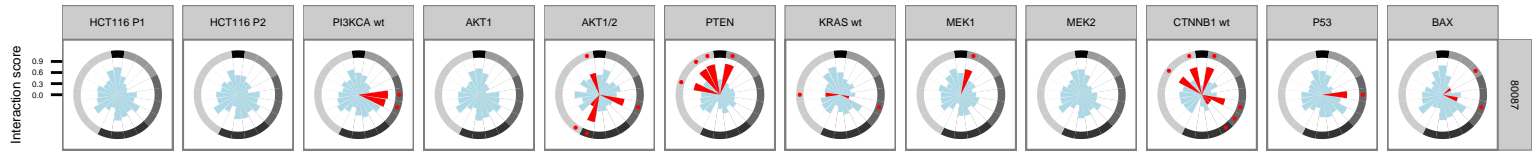
Taxol



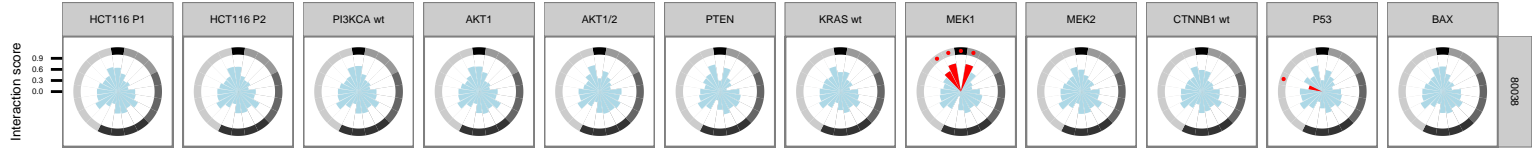
TBBz



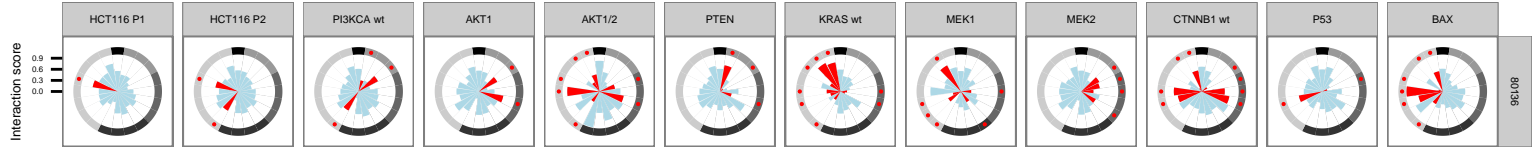
Terfenadine



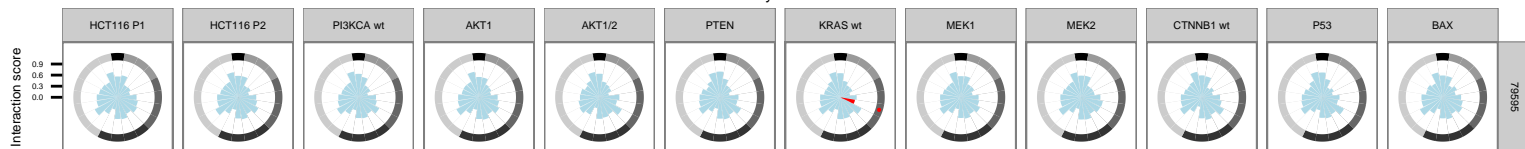
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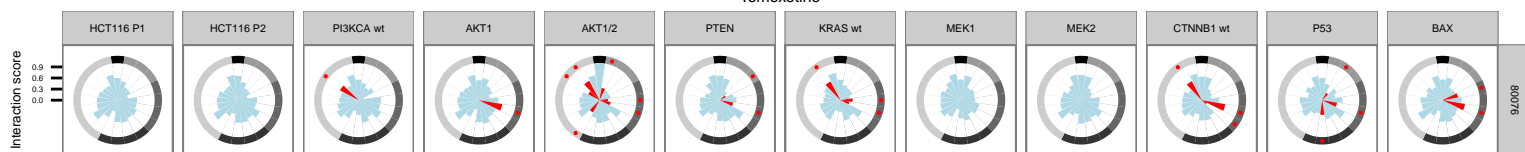
Thapsigargin



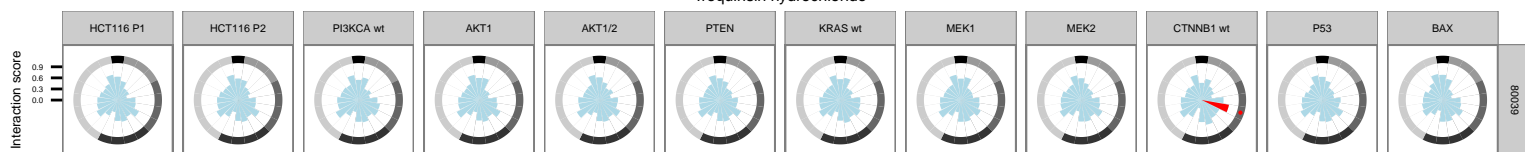
TMPH hydrochloride



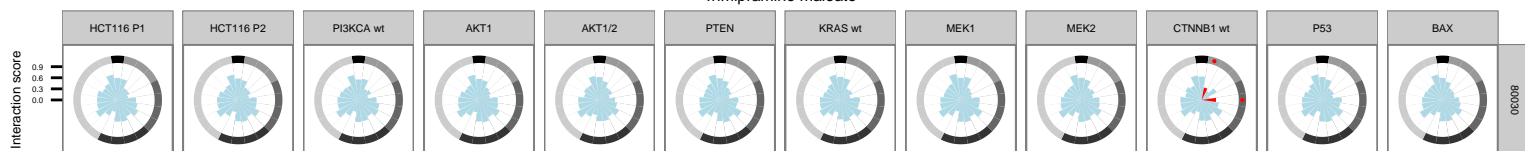
Tomoxetine



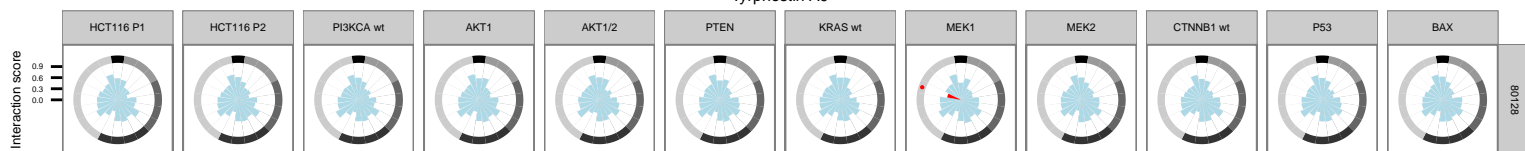
Trequinsin hydrochloride



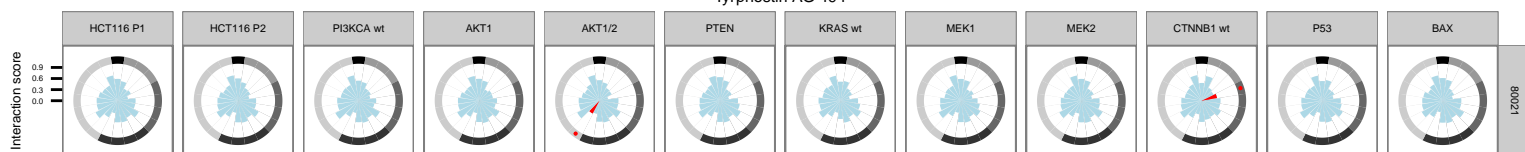
Trimipramine maleate



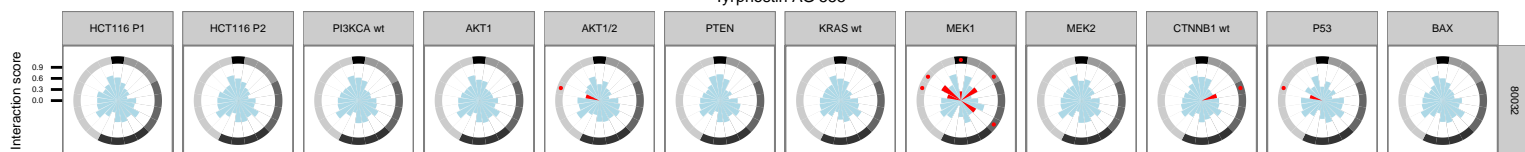
Tyrphostin A9



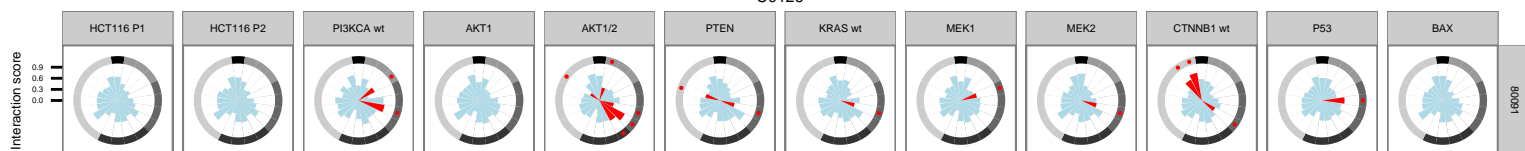
Tyrphostin AG 494



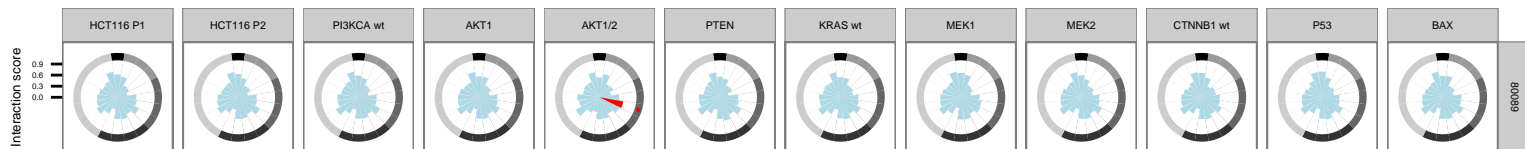
Tyrphostin AG 555



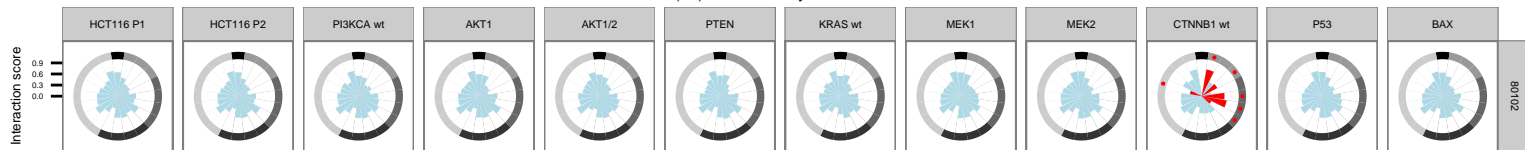
U0126



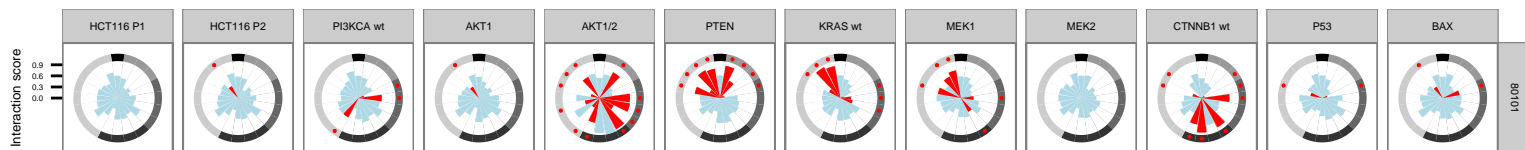
U-74389G maleate



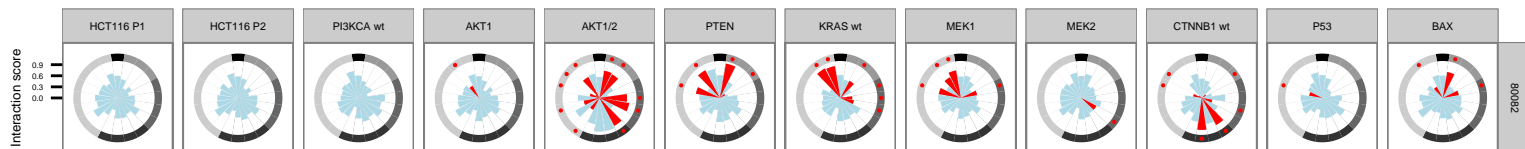
(+)-Vesamicol hydrochloride



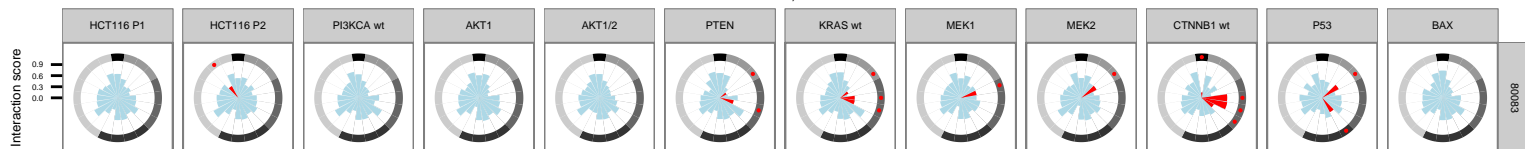
Vinblastine sulfate salt



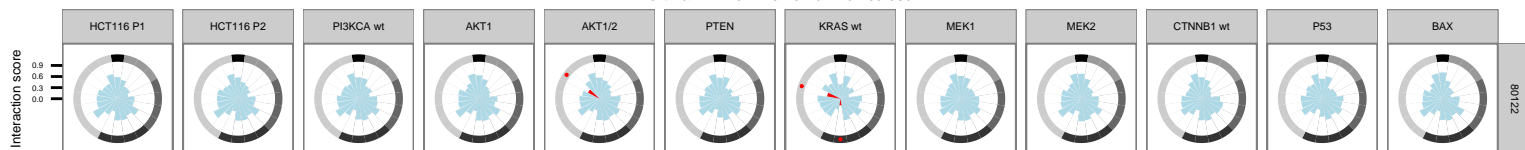
Vincristine sulfate



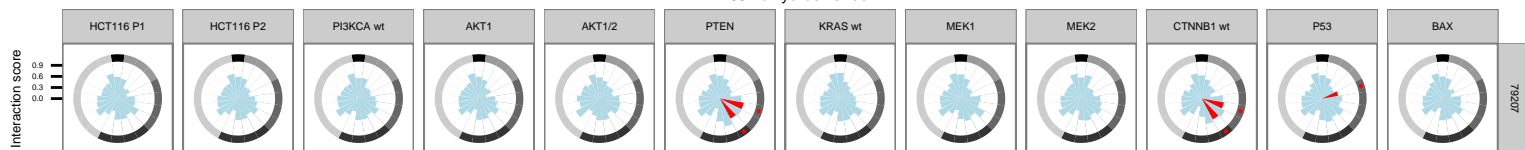
WIN 62,577



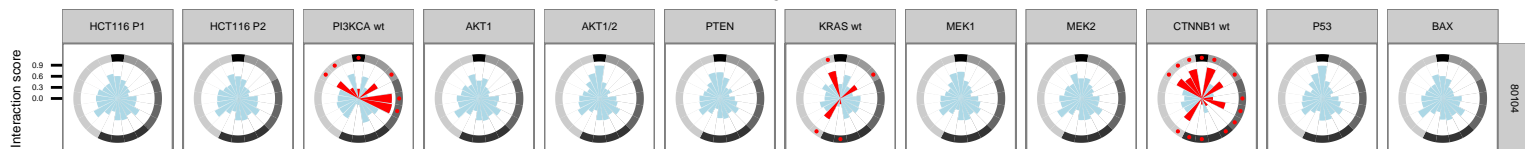
Wortmannin from Penicillium funiculosum

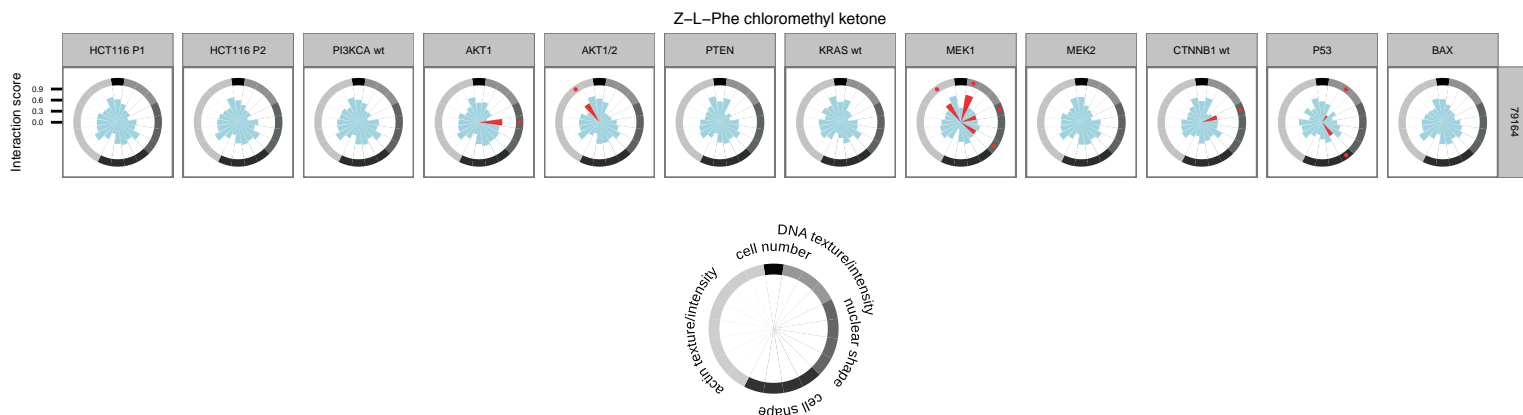


Y-27632 dihydrochloride



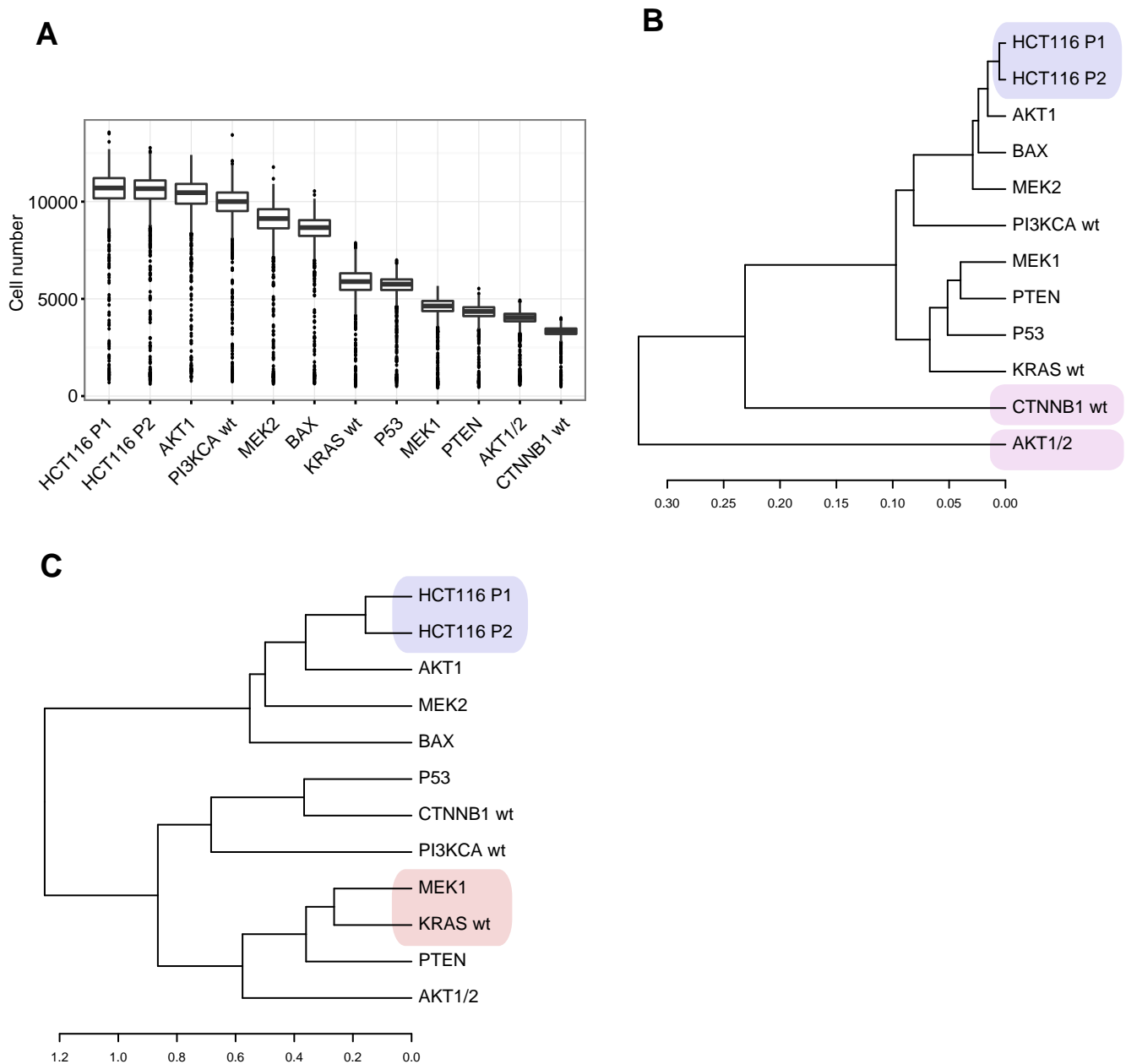
YC-1





Appendix Figure S4. Significant multiparametric chemical-genetic interactions.

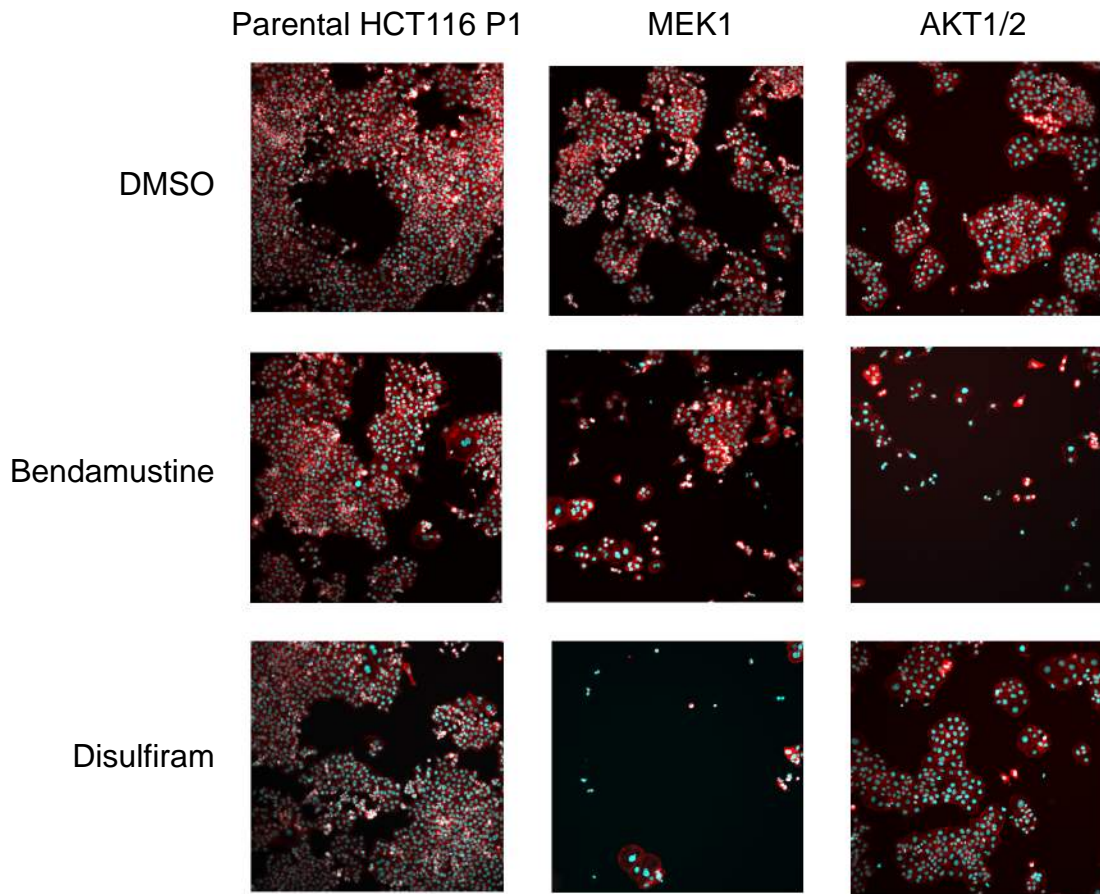
Chemical-genetic interactions were calculated for all 20 phenotypic features as described. A total of 193 compounds revealed significant interactions and their respective interaction spectra are plotted alphabetically. Interactions are scaled from 0-1. * FDR < 0.01, highlighted in red.



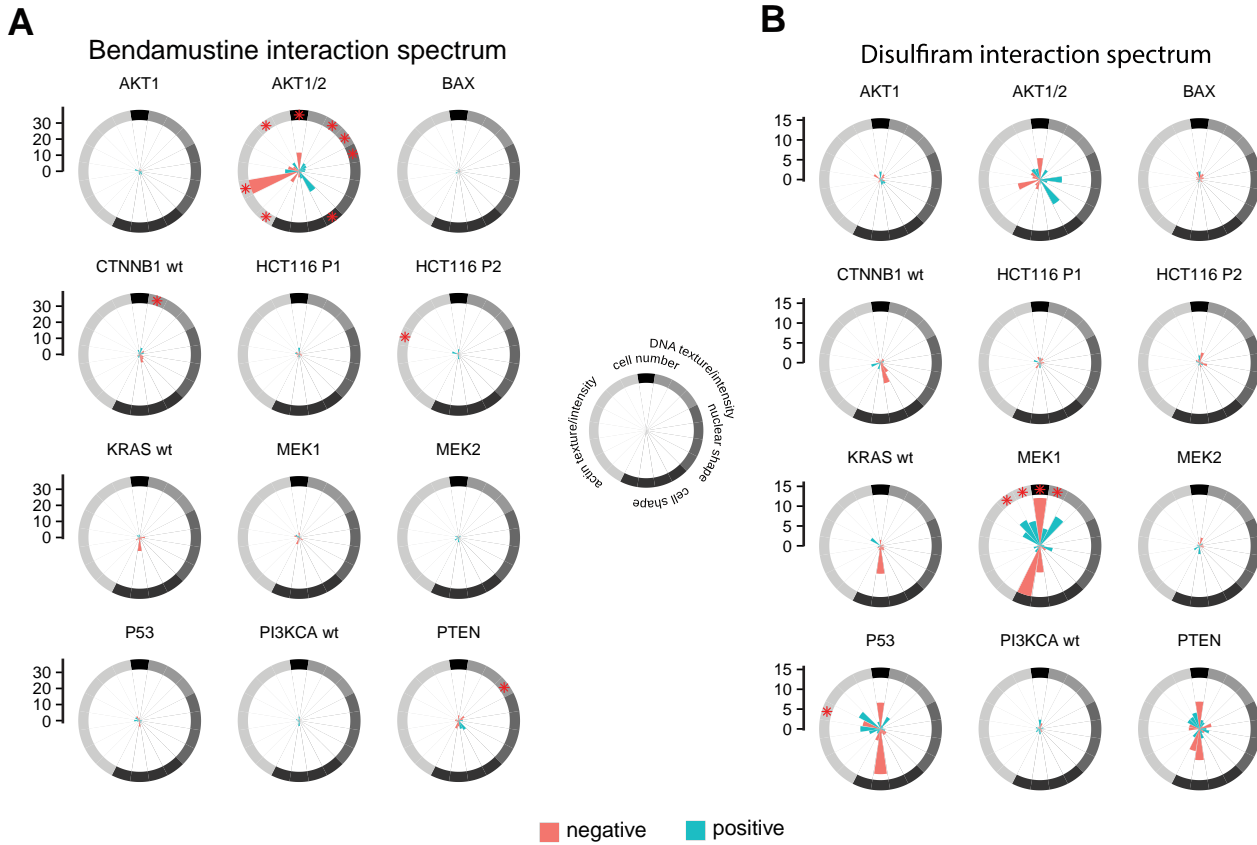
Appendix Figure S5. Strong main effects of gene KO and associations of isogenic cell lines. A Cell number for each isogenic cell line tested after 48h growth under control conditions (DMSO treatment). Particular isogenic cell lines display a pronounced phenotypic effect, i.e. impaired proliferation as compared to parental HCT116 cells.

B Unsupervised clustering of isogenic cell lines based on their 20-feature phenotype signature reveals that the parental HCT116 cell lines from two different sources cluster tightly together. CTNNB1 wt cells and AKT1/2 KO cells cluster apart from the other cell lines, indicating that the KO of respective genes induces strong phenotypic main effects.

C Unsupervised clustering of the phenotypic chemical-genetic interaction profiles for all drugs on all 20 phenotypic features reveals that the parental HCT116 cell lines from two different sources cluster tightly together. KRAS wt cluster together with MEK1 KO and not with MEK2 KO cells, indicating the key role of MEK1 in KRAS signaling.



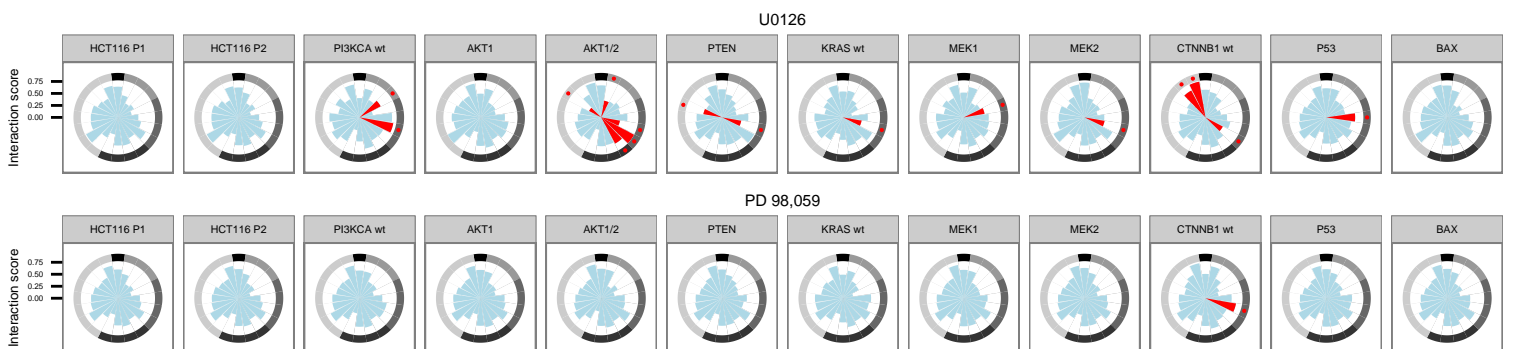
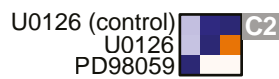
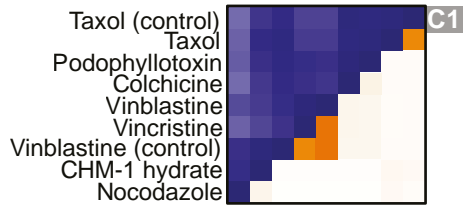
Appendix Figure S6. Synthetic lethal pharmacogenetic interactions. Bendamustine specifically impaired the growth of AKT1/2 KO cells. Disulfiram specifically impaired the growth of MEK1 KO cells. Actin = red, DNA = cyan.





Appendix Figure S7. Bendamustine and disulfiram interaction spectrum.

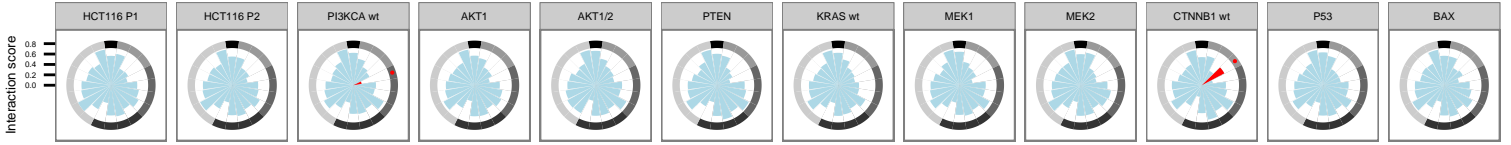
A Bendamustine interaction spectrum. Bendamustine revealed chemical-genetic interactions across multiple phenotypic features including cell number in AKT1/2 double KO cells (highlighted in red).

B Disulfiram interaction spectrum. Disulfiram revealed chemical-genetic interactions across multiple phenotypic features, including cell number in MEK1 KO cells (highlighted in red). Phenotypic chemo-genomic interactions are shown unscaled which reveals that interactions are rare. Interactions are further categorized in positive and negative interactions according to the sign of interaction terms. * adjusted p-value < 0.01.

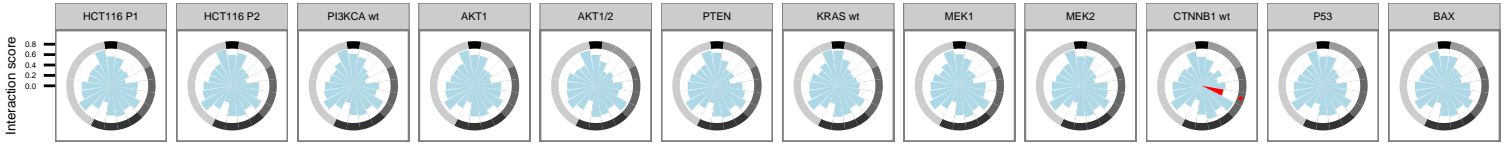




PD 169316 
SB 202190 

PD 169316

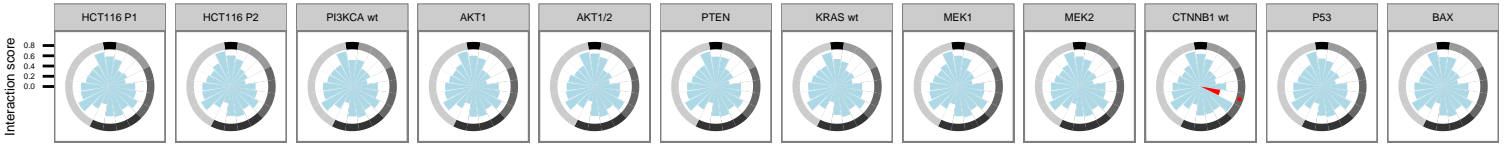


SB 202190

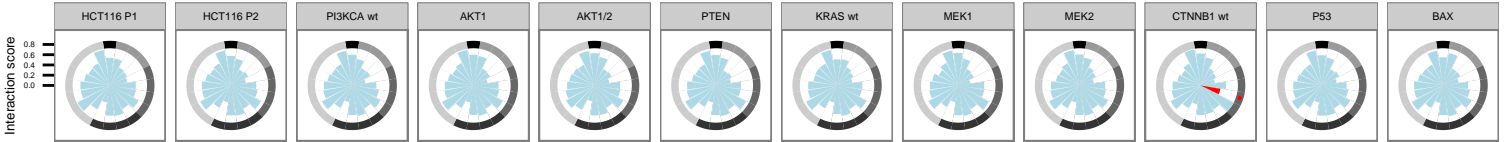


Betamethasone 
Beclomethasone 

Betamethasone

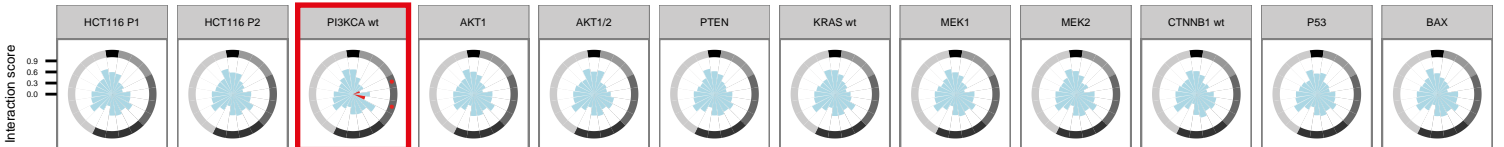


Beclomethasone

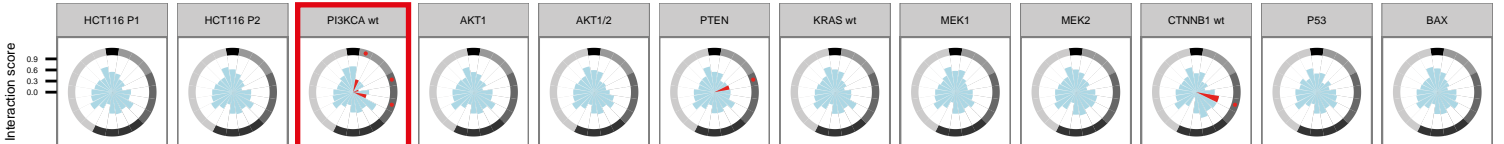


DMAT 
TBBz 

DMAT (CK2 Inhibitor 2)

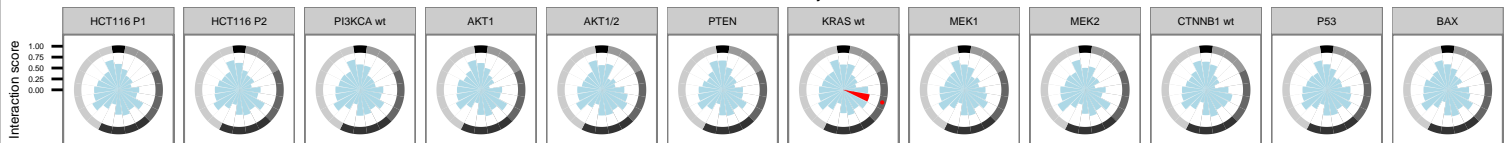


TBBz

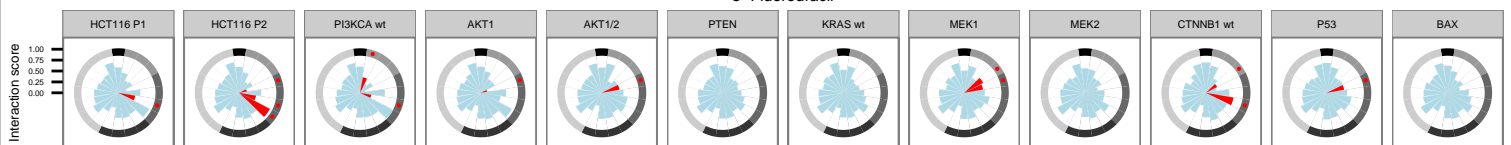


5'dFurd 
5-FU 

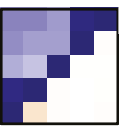
5-fluoro-5'-deoxyuridine



5-Fluorouracil



Etoposide
Amsacrine
NU2058
Ara-C
Cyclo-C



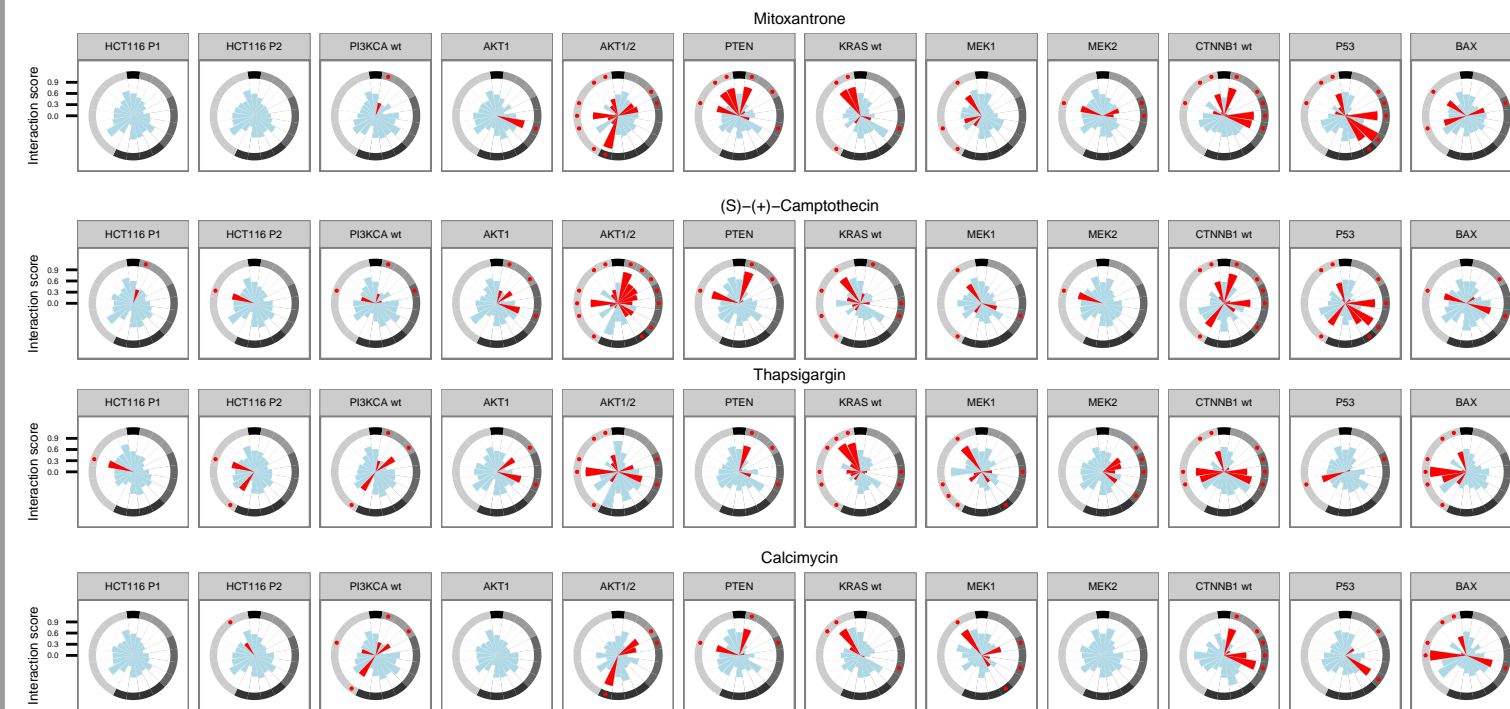
C7



Mitoxantrone
Camptothecin
Thapsigargin
Calcimycin

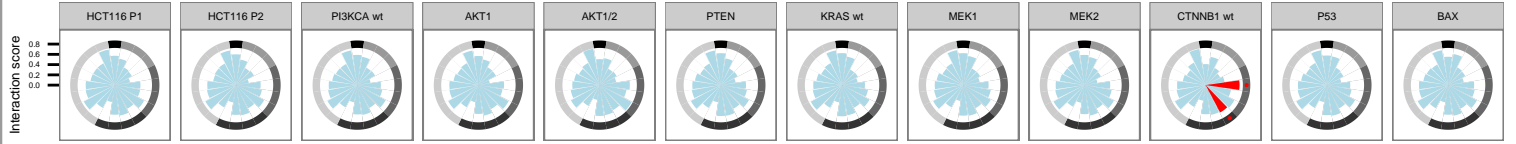


C8

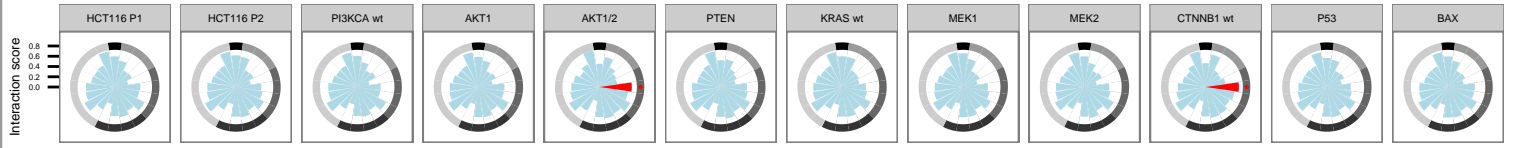


Carboplatin
CB 1954

Carboplatin



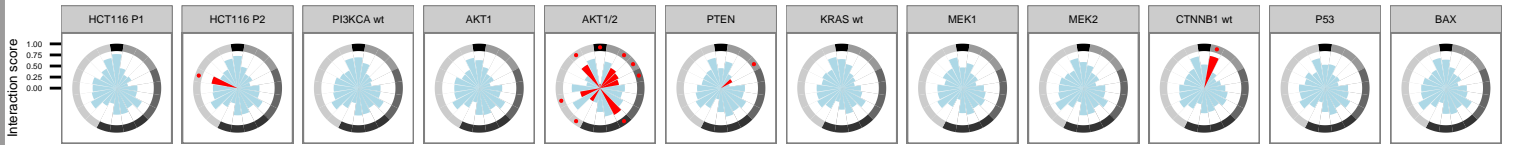
CB 1954



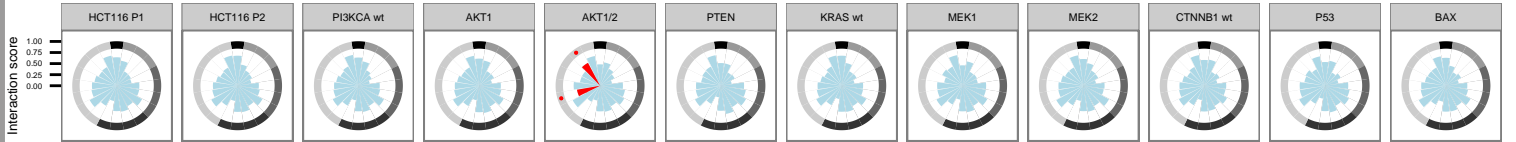
Bendamustine
Iodoacetamide
Pifithrin- μ
Parthenolide
Supercinnamaldehyde

C10

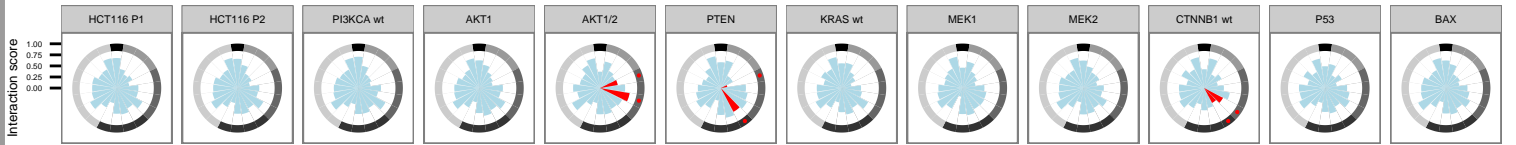
Bendamustine hydrochloride



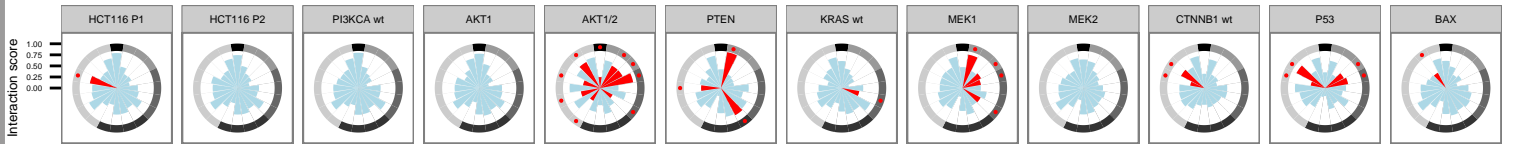
Iodoacetamide



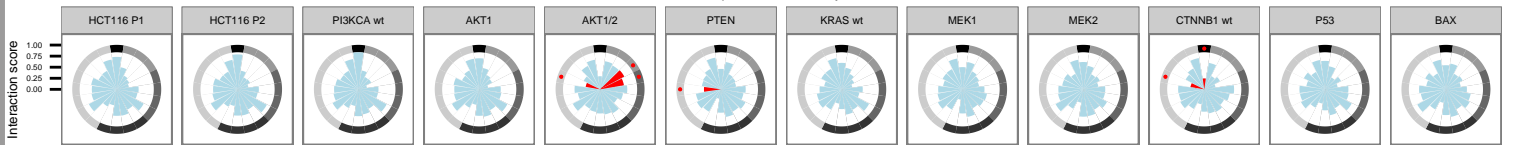
Pifithrin- μ



Parthenolide

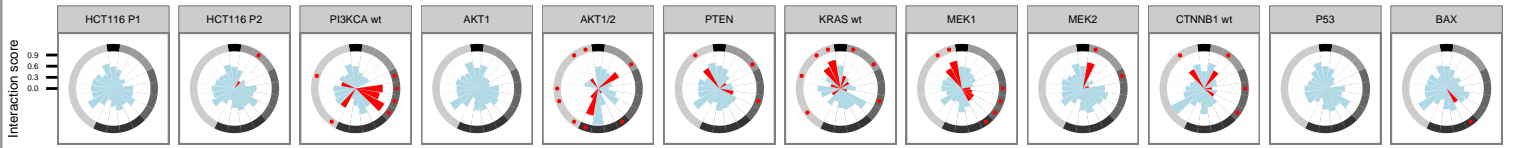


Supercinnamaldehyde

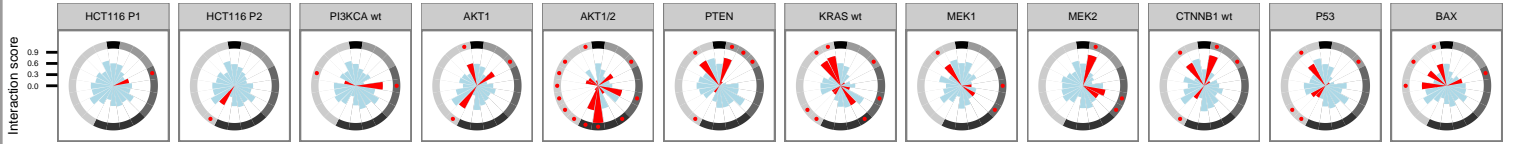


Ouabain
Dihydro-Ouabain
Brefeldin A 

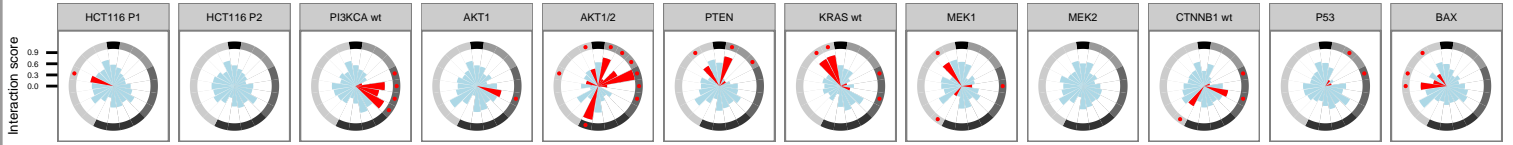
Ouabain



Dihydroouabain

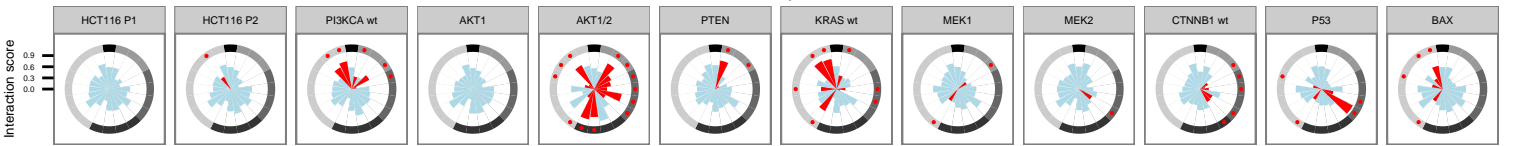


Brefeldin A from *Penicillium brefeldianum*

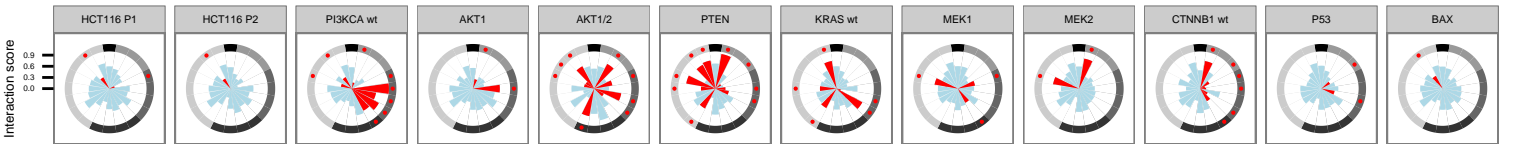


CGP-74514A
Emetine
NSC95397 

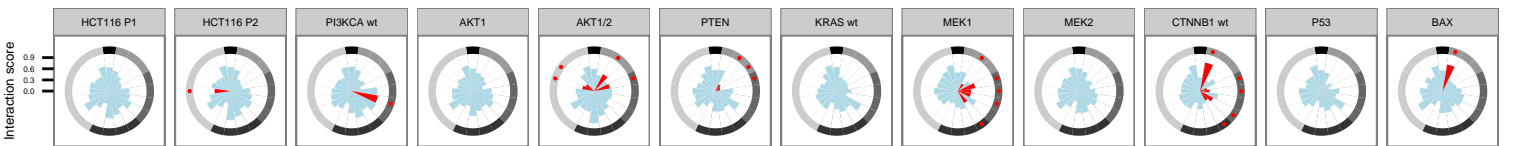
CGP-74514A hydrochloride



Emetine dihydrochloride hydrate

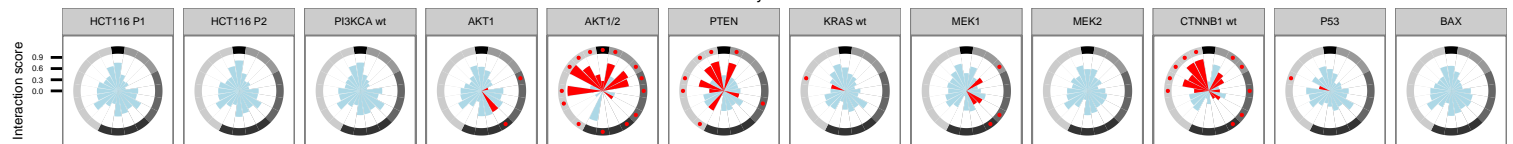


NSC 95397

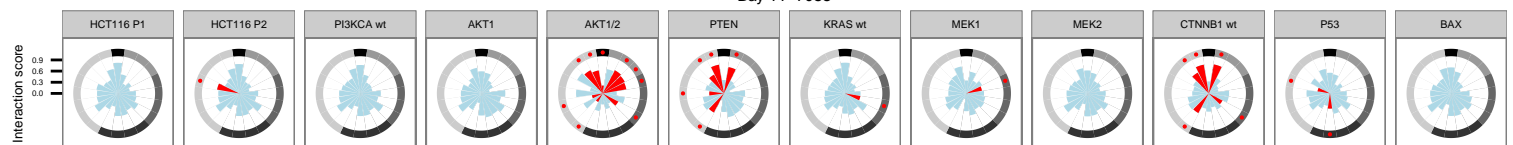


BAY 11-7082
BAY 11-7085
STATTIC 

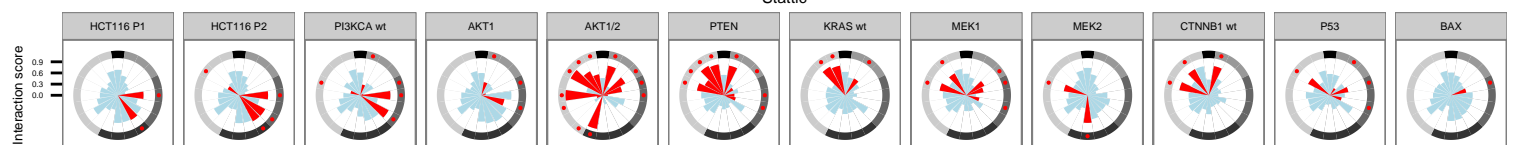
Bay 11-7082



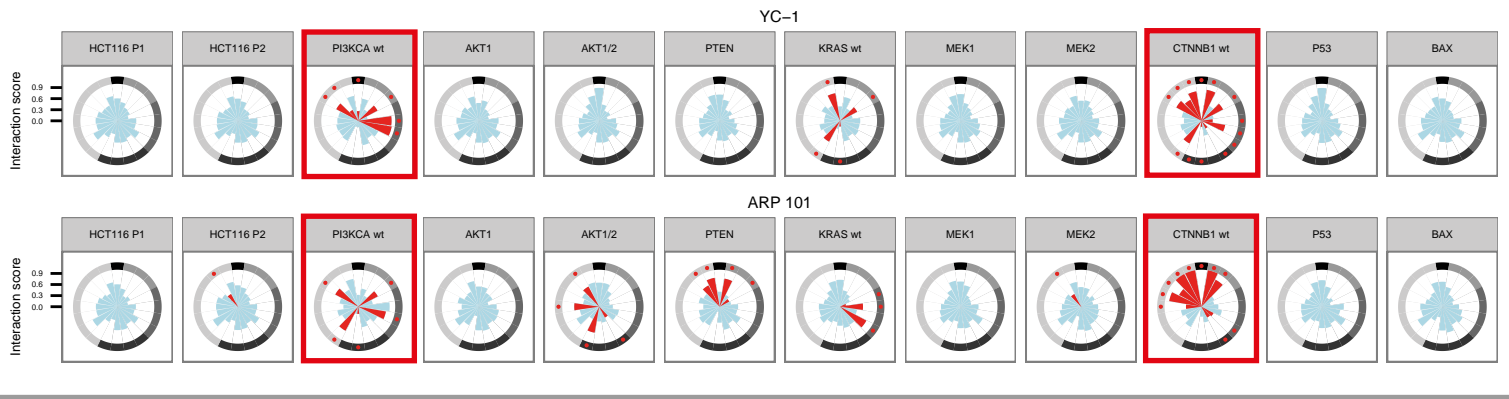
Bay 11-7085



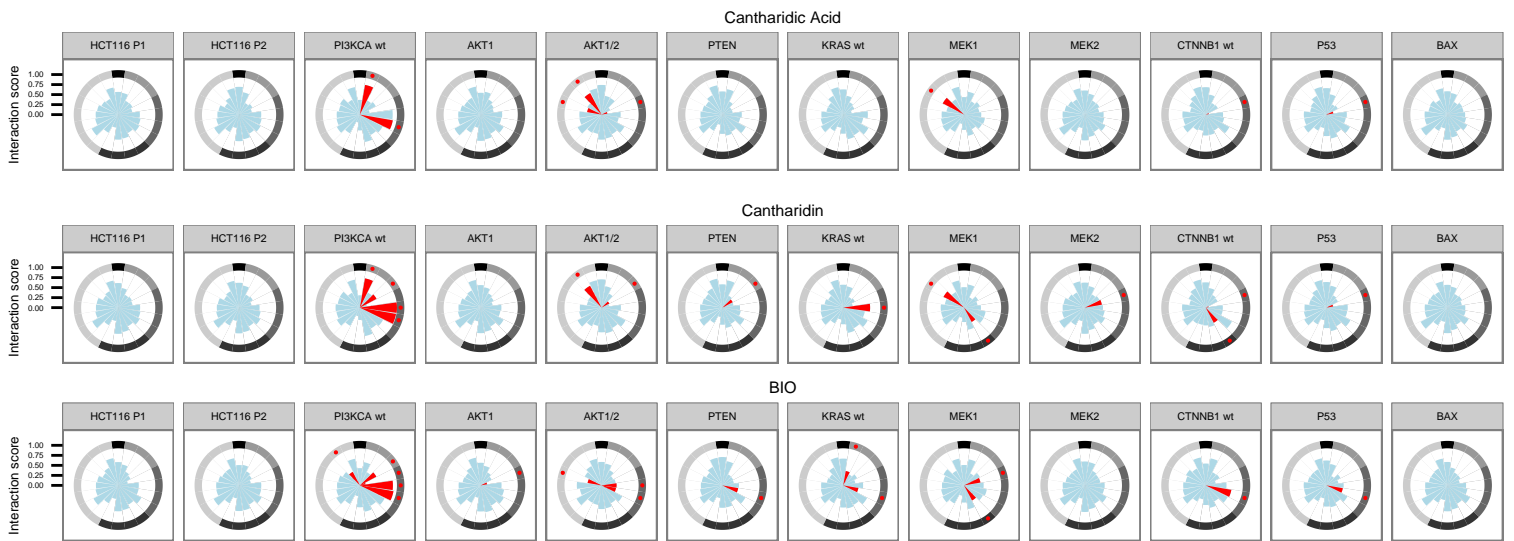
Static



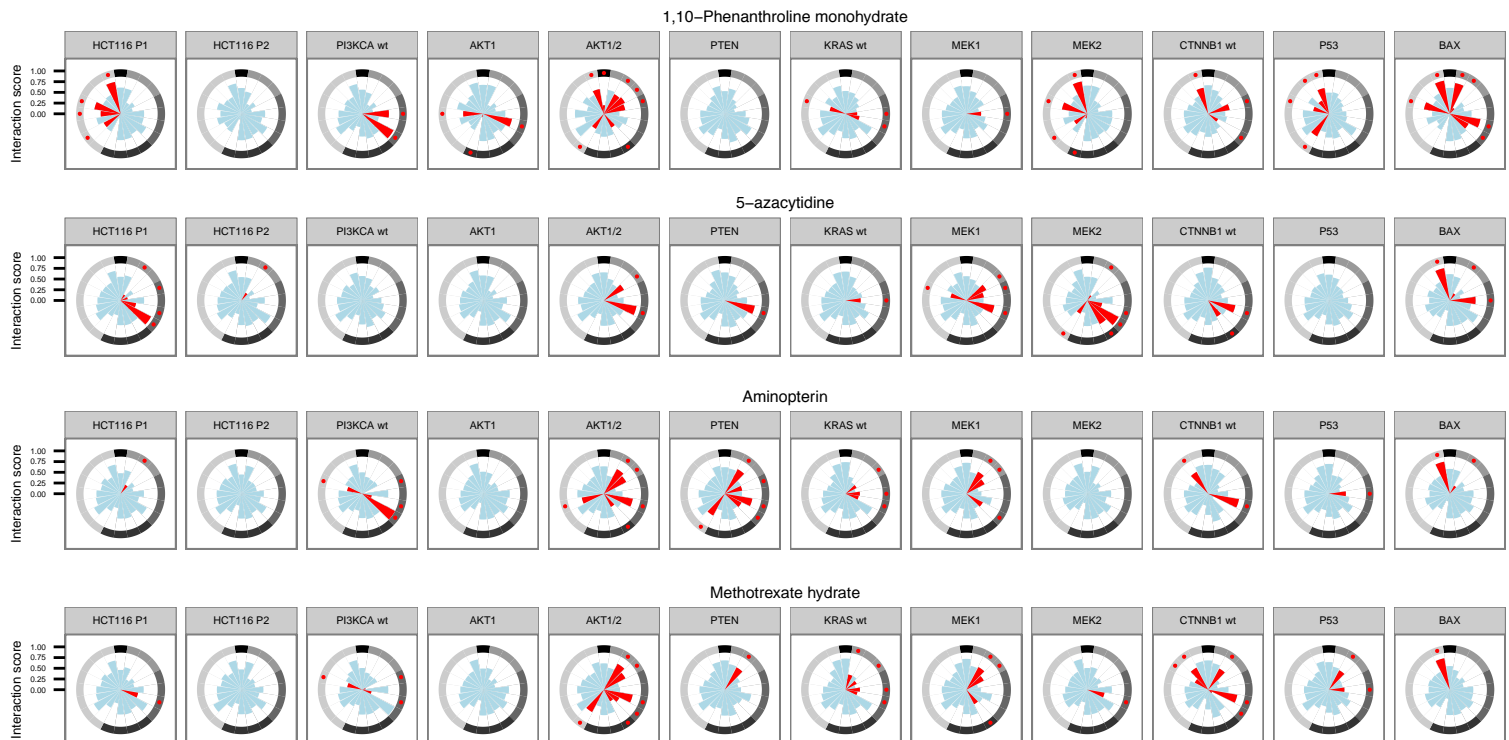
YC-1  C14
 ARP 101 



Cantharidic acid  C15
 Cantharidin  BIO

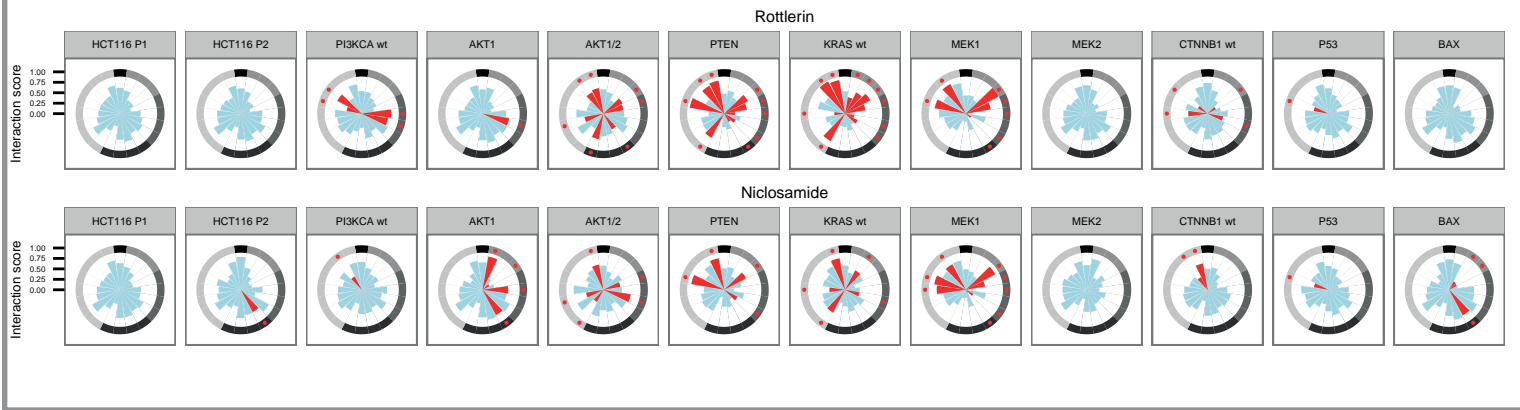


Phenanthroline  C16
 5-Azacytidine  BIO
 Aminopterin  BIO
 Methotrexate 



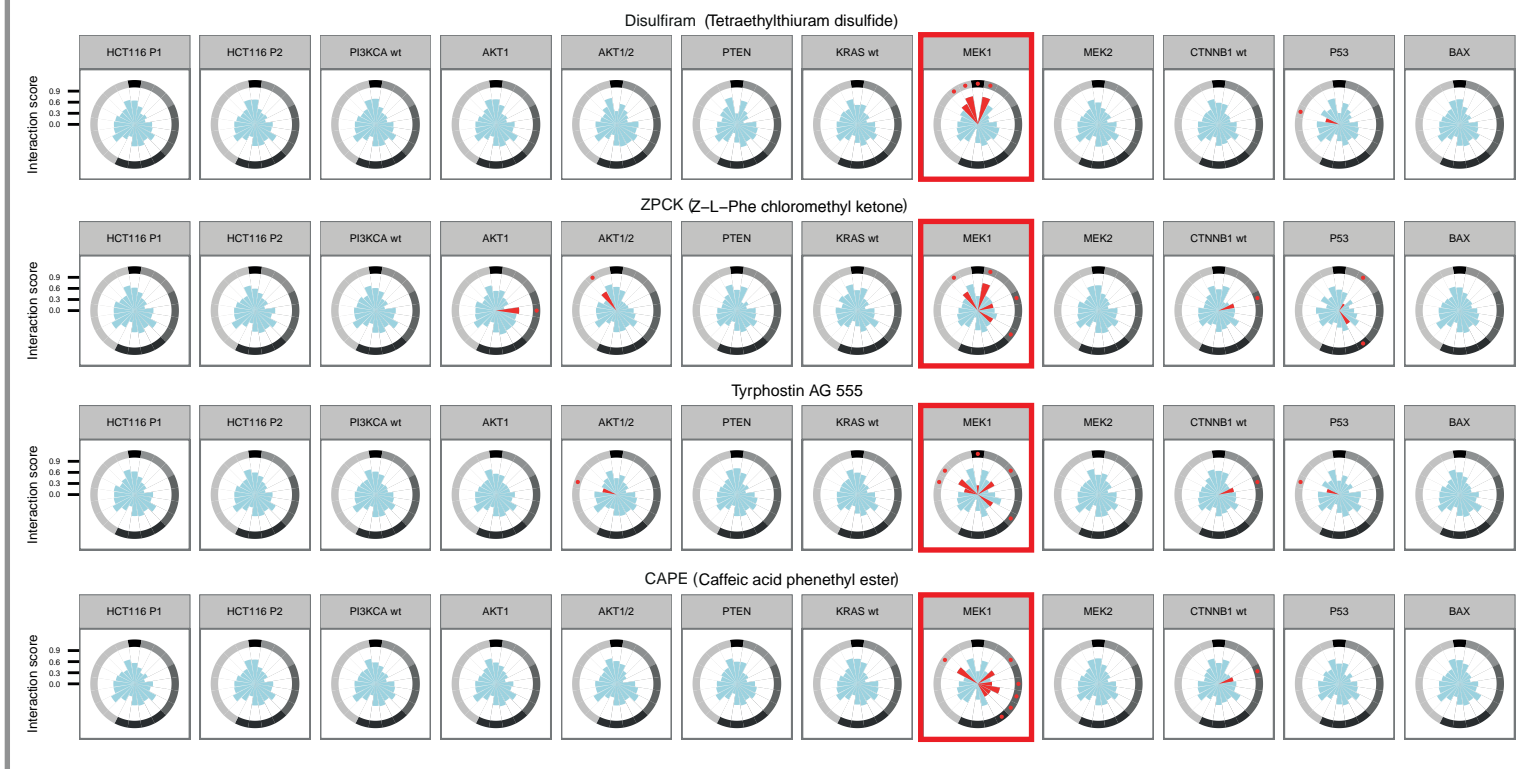
Rottlerin
Niclosamide

C17



Disulfiram
ZPCK
Tyrphostin AG 555
CAPE

C18



Appendix Figure S9. Association between clustering of compounds as shown in Fig 5A and respective interaction spectra for drugs within clusters.

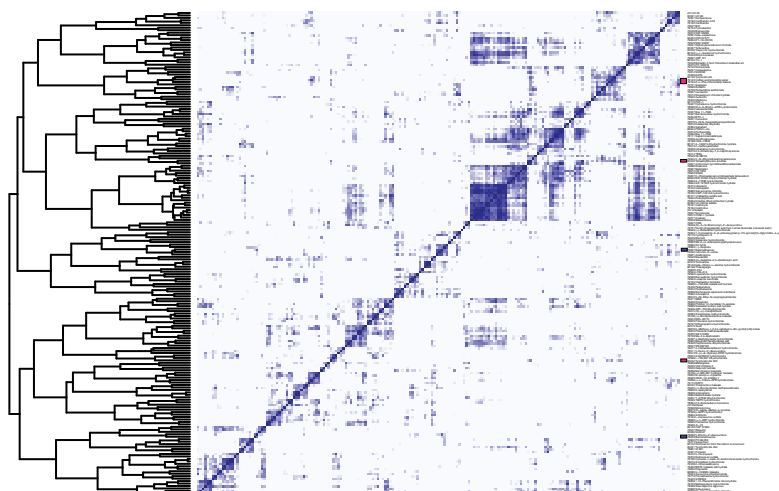
While in some instances the similarity of drug profiles was a result of coordinated subtle covariation across multiple cell lines and phenotypes, in other cases it was driven by the similarity of distinctive phenotypes of individual cell lines.

For example, the CK2 inhibitors DMAT and TBBz (cluster C5) affected nuclear shape features specifically in cells with only the wildtype copy of PI3KCA (HCT116 PI3KCA wt +/- mt -).

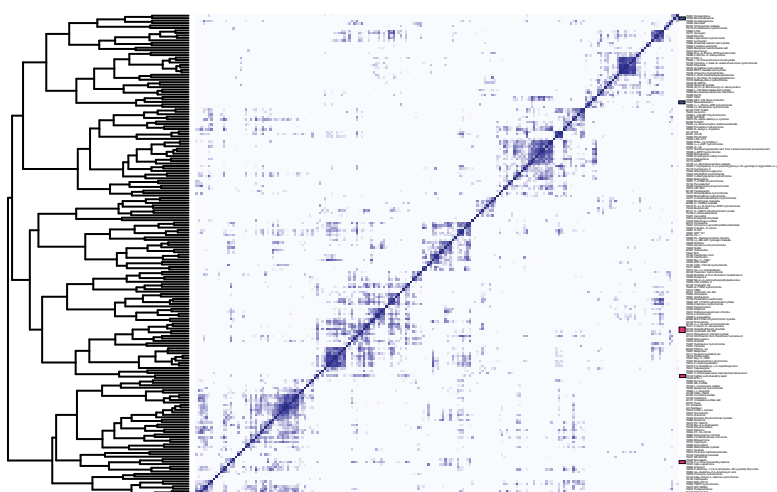
The clustering of the compounds ARP101 and YC-1 in C15 was driven by their distinct phenotypes in cells with only the wildtype copies of CTNNB1 (HCT116 CTNNB1 wt +/- mt -) and PI3KCA (HCT116 PI3KCA wt +/- mt -).

The clustering of compounds in C18 was driven by distinctive interactions with MEK1 KO cells.

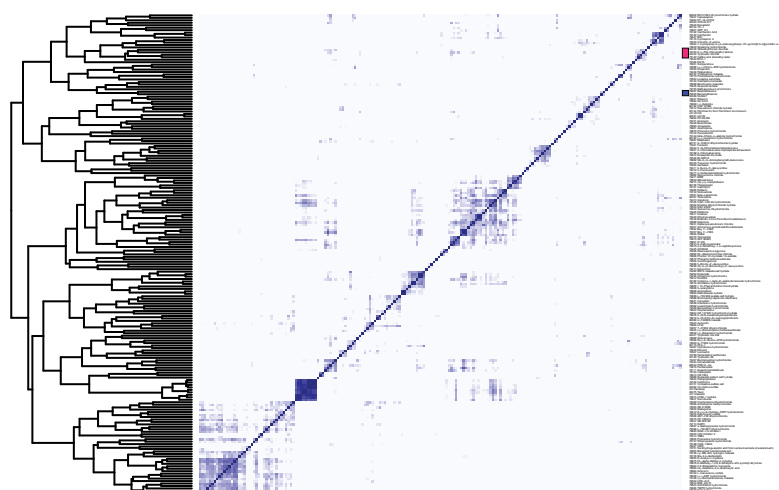
Genotypes



Multiparametric phenotypes

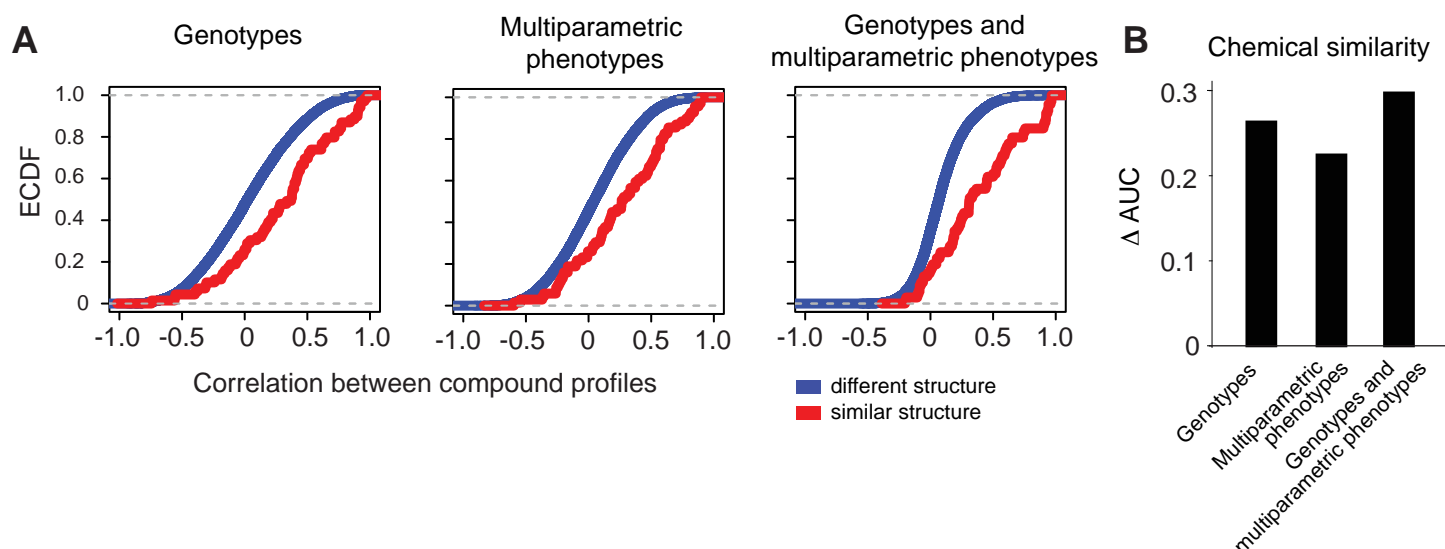


Genotypes and multiparametric phenotypes

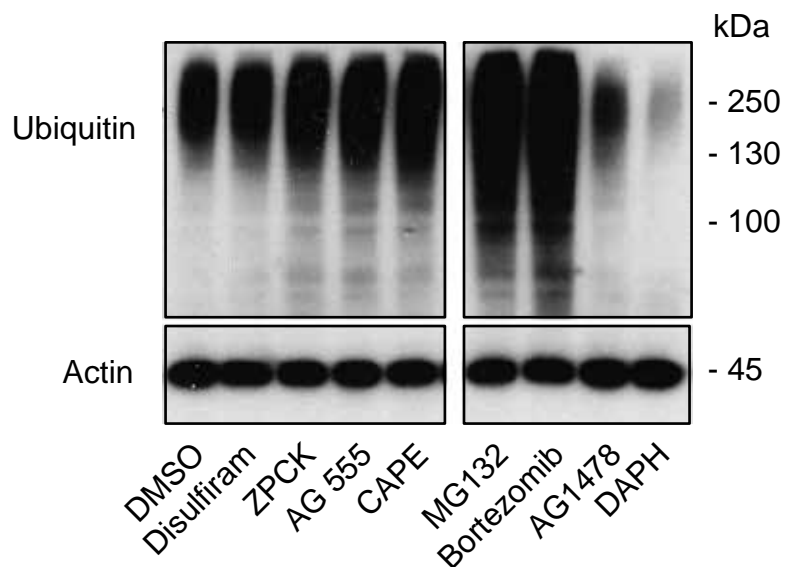


Appendix Figure S10. Integration of phenotypic profiling and chemical-genetic interaction mapping improves resolution.

Unsupervised clustering based on profile correlation using data only on cell number for all twelve genetic backgrounds screened (Genotype), using data from image-based phenotypes of one genetic background (parental HCT116; P2) (Multiparametric phenotypes), or using interaction profiles derived from both genetic backgrounds and image-based phenotypes (Genotypes and multiparametric phenotypes). Each heatmap is ordered based on individual clustering of respective datasets. Blue squares indicate compounds in cluster C4, red squares indicate compounds in cluster C18 (see Fig 5A). In contrast to the low-resolution obtained for genotype or multiparametric phenotype analysis, the combination of phenotypic profiling with chemical-genetic interaction mapping provides distinct high-resolution clusters.



Appendix Figure S11. Image-based chemical-genetic interaction analyses outperforms other methods. A Compounds that share chemical similarity have a higher correlation of interaction profiles as compared to drugs that do not share chemical similarity, as indicated by the shift of the empirical cumulative density function (ECDF) for shared structures (red curve) compared to non-shared structures (blue curve). Genotype: data only on cell number using 12 genetic backgrounds; Multiparametric phenotypes: data using image-based phenotypes of one genetic background (parental HCT116; P2); Genotypes and multiparametric phenotypes: interaction profiles derived from both genetic backgrounds and image-based phenotypes. B Resolution index (Δ AUC) which displays the performance with which each strategy separated drugs that share/do not chemical similarity is shown for aforementioned approaches (see methods for details).



Appendix Figure S12. The EGFR inhibitor tyrphostin AG555 impairs proteasome function. Tyrphostin AG555 increases Ubiquitin abundance. Western blots of total ubiquitin levels after 24 h treatment with compounds at a concentration of 5 μ M in HCT116 cells. Tyrphostin AG555 increases the abundance of Ubiquitin, which indicates proteasome inhibition. The proteasome inhibitors MG132 and bortezomib served as positive controls. EGFR inhibitors AG1478 and DAPH did not increase the abundance of ubiquitin. Representative example of 4 independent experiments is shown.