

Bioorthogonal Approach to Identify Unsuspected Drug Targets in Live Cells**

Katherine S. Yang, Ghyslain Budin, Carlos Tassa, Olivier Kister, and Ralph Weissleder*

Small-molecule drugs often interact with more than one protein in vivo. Recent estimates indicate that multi-target engagement occurs in up to 80% of current drugs.^[1,2] A complete understanding of such binding interactions and their related kinetics (dose, time) is important for a number of reasons. First, the continued development of new drugs that are either more selective or inhibit multiple targets (poly-pharmacology) requires an understanding of binding partners in vivo. Second, although many successful drugs are in routine clinical use, their exact mechanism of action is still often poorly understood.^[3] A better understanding of targeted proteins could also lead to the development of new drug candidates or be used to reduce toxicities. The problem is further complicated in that current drug screens are often performed on isolated proteins, established cell lines, or homogeneous mouse models rather than heterogeneous cells harvested directly from patients. Third, a more thorough understanding of cognate binding partners is important in the development of companion imaging agents and diagnostic drugs.

For the majority of drugs and molecular imaging agents there does not exist a proteome-wide understanding of their behavior. This is not entirely surprising, given the technical difficulties of such analyses, the scant amounts of many proteins, and the fast decay of isotope-based imaging agents. Nevertheless, having the ability to obtain such data could provide strong clues toward mechanisms, suggest potential unrecognized actions, and/or aid in the interpretation of data. Mass-spectrometry-based methods are an ideal technique to pinpoint protein targets and off-target effects for a particular drug. Activity-based protein profiling methods typically rely on covalent linkage of the inhibitor of interest to the protein targets to identify active enzyme targets.^[4-6] However, the covalent modification could significantly alter the properties of the original drug. Alternative methods rely on secondary

target pull-down from cell lysates. Proteins from cell lysates may have altered conformation or become denatured and no longer bind to the drug of interest, thereby leading to an unintended underrepresentation of the true number of secondary targets of a drug.^[7] SILAC (stable isotope labeling with amino acids in cell culture) is another highly sensitive method to identify drug targets but it is low-throughput and expensive.^[8-10] In contrast to activity-based protein profiling, compound-centric approaches provide an unbiased method to identify protein targets, regardless of their activation status.^[2,11] These techniques have been used for a variety of clinically relevant inhibitors, such as Gefitinib and Imatinib, to assess their promiscuity.^[12] However, one potential limitation of these methods is the immobilization of the inhibitor on an agarose or sepharose matrix, which could lead to an underrepresentation of potential targets by confining the inhibitor to a particular orientation.^[2] More recent techniques have used a copper-catalyzed bioorthogonal click-chemistry reaction to label the drug and have used affinity beads for purification of secondary protein targets from live cells.^[5,13] One limitation of this technique is the use of copper-catalyzed chemistry, which can lead to cell toxicity and could affect secondary targets that are identified. Another important issue is the recovery of captured proteins on solid support after bioorthogonal ligation reactions. Efficient recovery of the target protein is often carried out under harsh and denaturing conditions, which can lead to contamination by nonspecific captured materials and the loss of protein partners, structural information, and protein function. Several cleavable linkers have been applied to circumvent this limitation.^[14] What is thus still lacking for the field is a simple method for the isolation of drug-protein adducts prior to mass spectrometry analysis.

We hypothesized that *trans*-cyclooctene-tagged drug conjugates can be used to efficiently pull down target proteins through the use of complementary tetrazine beads. Here, we describe a noncovalent protein pull-down method using a model system [Olaparib (AZD2281), a poly(ADP-ribose)-polymerase (PARP) inhibitor] to identify protein targets (Figure 1). First, Olaparib was synthesized with a *trans*-cyclooctene (TCO) moiety and incubated with live cells. Protein-bound drug was then pulled out from cell lysates by using cleavable tetrazine (Tz) beads. Released protein was then separated on a SDS-PAGE gel, excised, digested, and analyzed by using mass spectrometry (Figure 1). With this method we were able to recover not only the intended primary target of Olaparib, PARP1, but also over a dozen previously unsuspected possible secondary binding proteins.

Olaparib (Scheme 1A) is an inhibitor of poly(ADP-ribose)polymerase 1 (PARP1), which is an important cellular

[*] Dr. K. S. Yang,^[†] Dr. G. Budin,^[†] Dr. C. Tassa, O. Kister, Prof. R. Weissleder
Center for Systems Biology, Massachusetts General Hospital
185 Cambridge Street, Boston, MA 02114 (USA)
E-mail: rweissleder@mgh.harvard.edu

Prof. R. Weissleder
Harvard Medical School
200 Longwood Avenue, Boston, MA 02115 (USA)

[†] These authors contributed equally to this work.

[**] This work was supported by the National Institutes of Health (NIH) grant number RO1CA164448 and P50CA86355, K.Y. was supported by an NIH grant T32-CA79443.

Supporting information for this article is available on the WWW under <http://dx.doi.org/10.1002/anie.201304096>.

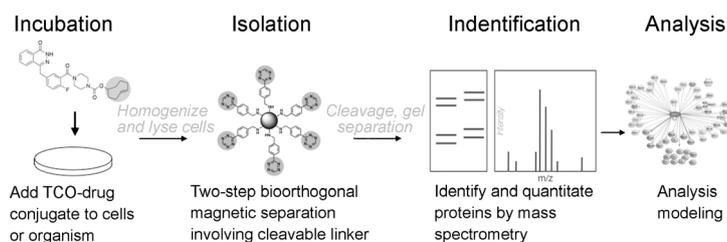
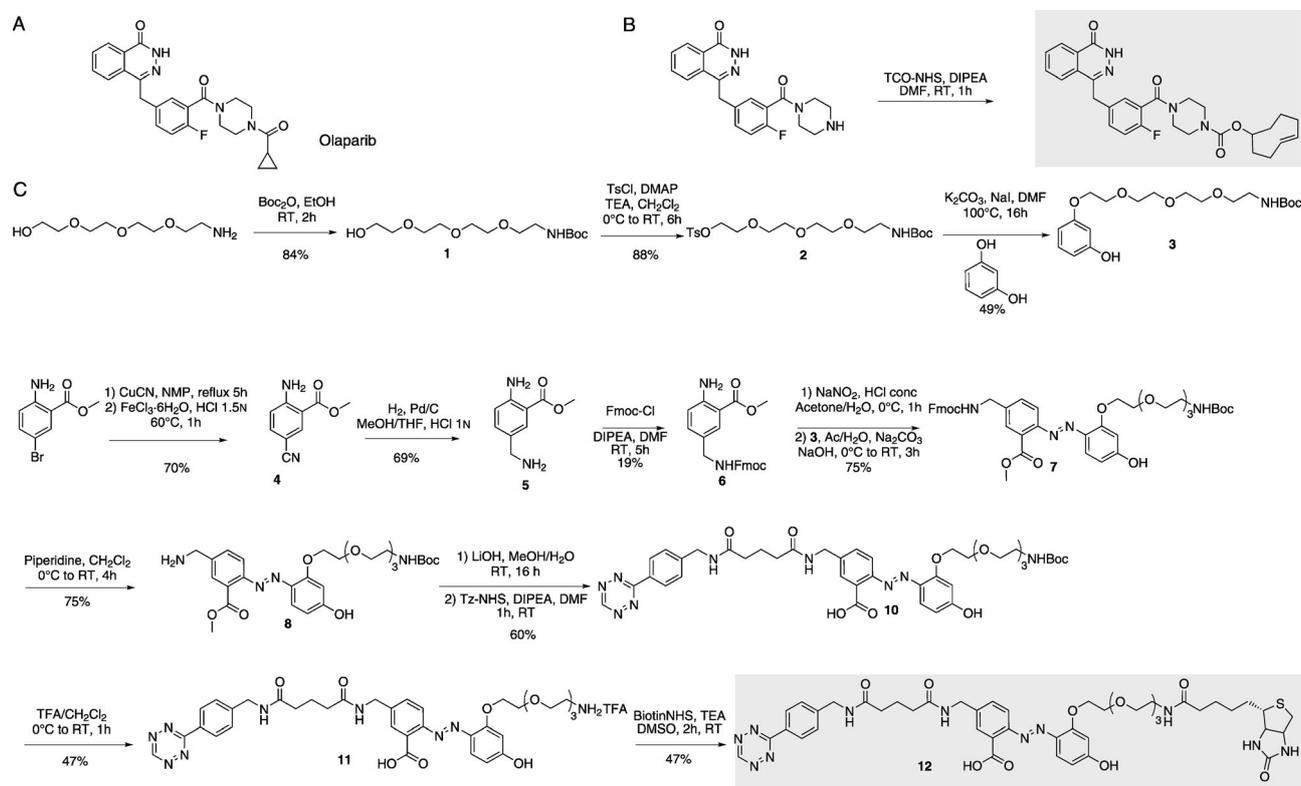


Figure 1. Overview of steps from drug administration to analysis involved in bioorthogonal proteomics. Live cells are incubated with a TCO-drug conjugate. Cell lysates are then prepared and the TCO-drug conjugate bound to the target protein is isolated using a Tz-labeled cleavable linker decorated on streptavidin magnetic beads. The protein is then run on an SDS-PAGE gel, and the desired bands are isolated and submitted for mass spectrometry analysis.

protein that senses DNA damage and initiates the base excision repair pathway.^[15] It has been shown that the 4-*N*-piperazine of Olaparib can be modified without significantly decreasing PARP1 binding affinity.^[16] We therefore synthesized the 4-*N*-piperazine of Olaparib as described previously, with minor modification.^[17] The TCO moiety was conjugated to the 4-*N*-piperazine position to generate Olaparib-TCO (Scheme 1 B). To confirm that the modification of Olaparib with TCO does not significantly alter the binding of the drug to PARP1, the inhibitory effect of Olaparib-TCO was evaluated against recombinant PARP1. Treatment with Olaparib-TCO resulted in an IC₅₀ value of 35.8 nM, which is still in the nanomolar range but higher than the 7 nM IC₅₀ obtained with unmodified Olaparib (Figure S1 A and

Table S1 in the Supporting Information). To further confirm the specificity of the TCO-modified drug, we took advantage of the bioorthogonal chemistry and utilized carboxyfluorescein diacetate-tetrazine (CFDA-Tz) for localization of the drug by imaging. Olaparib-TCO, imaged with CFDA-Tz, localized to the nucleus (known location of PARP1) in MHH-ES1 Ewing's sarcoma cells (Figure S1 B in the Supporting Information). In addition, an antibody against PARP1 showed similar nuclear localization (Figure S1 B in the Supporting Information). Additionally, Olaparib-TCO localized to some extent to the cytoplasm of these cells, thereby indicating potential interaction with secondary Olaparib targets.

To use bioorthogonal TCO/Tz chemistry for pull-down experiments, we designed and synthesized a cleavable enrichment linker **12** that contains a biotin affinity tag for enrichment on one end. The other end contained a Tz moiety for convenient scavenging of various TCO-labeled drugs by using bioorthogonal chemistry. Between the two ends we incorporated a 2-(4'-hydroxy-2'-alkoxy phenylazo)benzoic acid as a cleavable site. This cleavable linker had previously been validated for protein pull-down/release under very mild conditions.^[18] For cleavage efficiency, the linker has a tetraethylene glycol spacer to increase water solubility and a free *ortho*-carboxylic acid and free *para*-phenol group for reactivity (Scheme 1 C). To synthesize the cleavable linker, a convergent approach was used to make the protected azoarene **7** by a diazonium coupling between aniline **6** and



Scheme 1. Synthetic scheme of Olaparib-TCO and the cleavable linker. A) Olaparib for comparison, B) Olaparib-TCO conjugate, and C) cleavable linker. Key components shaded in gray.

resorcinol **3**. The amine derivative **6** was obtained from the commercially available methyl 2-amino-5-bromo-benzoate. The bromoarene was first exchanged with a cyano group under reflux followed by hydrogenation, yielding the primary amine **5**, which was then protected with an Fmoc group furnishing compound **6** in three steps. The Boc-protected resorcinol derivative **3** was prepared by coupling the resorcinol with a tetraethylene glycol spacer **2** synthesized from the commercially available tetraethylene glycol monoamine. Diazotation of aniline **6** and reaction with phenol **3** gave the orthogonally protected linker **7** with 75% yield. The tetrazine reactive group was then introduced on one side by removing the Fmoc group using piperidine treatment, followed by ester hydrolysis and coupling of tetrazine-NHS on the free primary amine **9**. Finally, the biotin enrichment tag was introduced on the other side by deprotecting the Boc-protected amino group, which was further coupled with biotin-NHS affording compound **12** in eleven steps. The cleavage kinetics of the final linker **12** was monitored by UV spectroscopy at 463 nm, which showed a half-life $\ll 1$ s and a total cleavage time of 20 s with 1 mM dithionite solution. Under these conditions, no side products were observed and the total cleavage was confirmed by mass spectrometry (Figure S2 in the Supporting Information).

To test the utility of the Olaparib-TCO/Tz cleavable linker for protein pull-down, we used MHH-ES1 Ewing's sarcoma cells that are sensitive to Olaparib and A2780 ovarian cancer cells that express high levels of PARP1. Live MHH-ES1 and A2780 cells were treated with Olaparib-TCO for one hour to allow for drug internalization and binding to its cellular primary and secondary targets. Negative control pull-down experiments were done on the same cell lines treated with DMSO. Cells were then washed with media to remove unbound drug, followed by cell lysis with a gentle lysis buffer. Lysates containing proteins labeled with Olaparib-TCO were treated with streptavidin magnetic beads decorated with the cleavable linker **12** (see the Supporting Information). After one hour, small-molecule captured proteins were released from the beads by treatment with sodium dithionite (DT), leaving the nonspecifically bound proteins on the solid support. Analysis of nonspecific cleavage was done by replacing the dithionite with buffer alone. Pull-down samples were then separated by SDS-PAGE followed by silver staining. Proteins specifically released by dithionite were excised from the gel, trypsinized, and analyzed by LC/MS-MS for identification (Figure 2 and Figure S3 in the Supporting Information). We curated data by selecting hits that were 1) repeatable during protein pull-down and 2) appeared in both tested cells lines (A2780 and MHH-ES1). We thus obtained a list of approximately a dozen proteins (Table 1). As expected, PARP1 was one of the top proteins that were identified in all experiments.

Beyond PARP1, little overlap was found when comparing the hits from the ovarian versus the Ewing's sarcoma cell lines, which may arise from the differences in origina and protein expression between the two cell lines. Interestingly, neither cell line expresses PARP2, one of the other known PARPs targeted by Olaparib^[19] (Figure S4 in the Supporting Information). We also identified several proteins predicted to

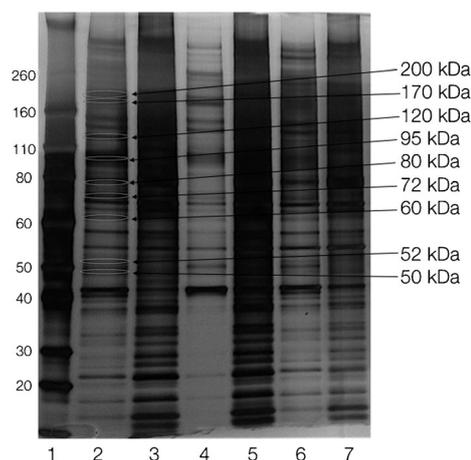


Figure 2. Silver-stained SDS-PAGE gel of the proteomics pull down in A2780 cells. Lanes: 1) marker, 2) Olaparib-TCO, cleaved with 25 mM DT, 3) protein left on beads from (2), 4) Olaparib-TCO, cleaved without DT, 5) protein left on beads from (4), 6) DMSO, cleaved with 25 mM DT, 7) protein left on beads from (6). Sizes on the right indicate bands that were isolated for mass spectrometry analysis.

interact with PARP1 based on previous work. For example XRCC5 and TOP2B were identified from the screen.^[20,21]

The remaining identified protein targets were grouped into categories based on the cellular function. The largest group of proteins were involved in maintaining cell structure (vimentin, LAP2A, TBA1C, TPM1, CLH1, and CLAP1), while others were involved in the formation of signaling complexes (GBLP). Several proteins were involved in cellular metabolism (ATPB, GRP78, ENOA, and MDHM), which could affect tumor cell growth when inhibited by Olaparib. Finally, several proteins were involved in aspects of DNA or RNA binding (TOP2A, G3BP1, RL4, and RL5), which is where we began examining the identified secondary targets.

Validation of the identified targets requires biochemical analyses such as co-immunoprecipitation (to determine whether drugs are pulled out because of association with a protein complex), specific inhibitor assays, or analyses in knock-in and knock-out models. For example, XRCC5 co-immunoprecipitated with PARP1 both in the absence and presence of Olaparib, thereby suggesting that XRCC5 and PARP1 are present in a complex in A2780 cells, regardless of

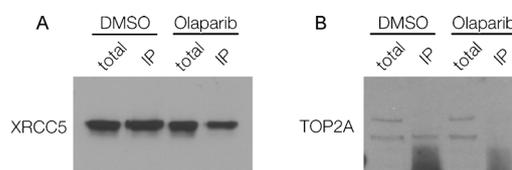


Figure 3. Co-immunoprecipitation (co-IP) in A2780 cells treated with 0.1% DMSO or 7 μ M Olaparib for 1 h. Cells were washed twice and incubated for 30 min to remove excess inhibitor. Cells were then lysed and incubated with PARP1 antibody and subsequently with protein A magnetic beads. After washing, protein complexes were eluted from the beads, boiled, and run on a gel. Western blotting was done on 0.1% XRCC5 and 1% TOP2A total lysate or on the IP protein using antibodies against XRCC5 (A) or TOP2A (B).

Table 1: List of proteins identified in A2780 ovarian cancer cells (OV) and MHH-ES1 Ewing's sarcoma cells (ES).

Protein	Symbol	Confidence	Known target	PARP1 complex	Cells		Molecular function
					OV	ES	
PARP1	PARP1	very high	yes	N/A	yes	yes	DNA binding/DNA damage repair
X-ray repair protein	XRCC5	very high	no	yes	yes	no	ATP/DNA/RNA-binding proteins (with PARP)
DNA topoisomerase 2	TOP2B	very high	no	yes	yes	no	DNA topological change
DNA topoisomerase 2	TOP2A	very high	no	no	yes	no	DNA topological change
AP2 complex	AP2A1	very high	no	no	yes	yes	transport protein (vesicles)
terminal uridylyltransferase	TUT4	very high	no	no	no	yes	miRNA biogenesis suppressor
YTH domain family protein	YTHD2	very high	no	no	yes	no	signal transduction?
tubulin	TBA1C	very high	no	no	yes	no	GTPase activity
Ras-GTP-ase	G3BP1	high	no	no	yes	no	ATP/DNA/RNA-binding proteins
clip-associated protein	CLAP1	high	no	no	yes	no	kinetochore binding
clathrin heavy chain	CLH1	high	no	no	yes	no	structural molecule activity
60S ribosomal protein	RL4	high	no	no	yes	yes	RNA binding, constituent of ribosome
60S ribosomal protein	RL5	high	no	no	no	yes	RNA binding, constituent of ribosome
vimentin	VIME	high	no	no	yes	no	structural component of cytoskeleton
ATP synthase	ATPB	high	no	no	yes	no	ATP synthesis
78 kDa glucose reg protein	GRP78	high	no	no	yes	no	ATPase activity, ATP binding, ribosome binding
lamina-associated polypeptide	LAP2A	high	no	no	no	yes	structural organization of the nucleus
guanine nucleotide-binding protein	GBLP	high	no	no	no	yes	assembly and regulation of signaling molecules
tropomyosin α -1	TPM1	high	no	no	no	yes	cytoskeleton
α -enolase	ENOA	high	no	no	no	yes	glycolytic enzyme
malate dehydrogenase, mito	MDHM	high	no	no	no	yes	citric acid cycle

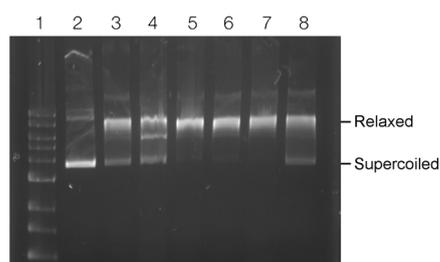


Figure 4. TOP2A DNA relaxation assay. TOP2A was incubated with pAcGFP1 DNA for 30 min at 37°C. The reaction was stopped using SDS and protein was digested by proteinase K. Lanes: 1) 1kb DNA ladder; 2) pAcGFP1 DNA; 3) DNA incubated with TOP2A; 4–8) DNA incubated with TOP2A and 4) 100 μ M Etoposide; 5) 500 nM Olaparib, 6) 1 μ M Olaparib; 7) 10 μ M Olaparib; 8) 100 μ M Olaparib.

Olaparib treatment (Figure 3A). To further analyze one of the hits, we investigated topoisomerase (DNA) II α (TOP2A), an enzyme that controls and alters the topologic states of DNA during transcription. Immunoprecipitation experiments showed that the functional form of TOP2A (top band, Figure 3B) is not in a complex with PARP1 and thus may be a true secondary target of Olaparib (Figure 3B).^[22] However, additional experiments with a DNA relaxation assay^[23] did not show any effects of Olaparib on the DNA unwinding enzymatic activity of TOP2A, as compared to the control (Figure 4). It is thus possible that Olaparib is bound to TOP2A, but does not alter its DNA unwinding activity. To explore this possibility, we performed surface plasmon resonance (SPR)^[24] binding experiments with TOP2A (and PARP1 as a control) to determine the K_d of Olaparib-TCO binding. Using this method, we found that Olaparib-TCO does bind TOP2A, with an estimated K_d of 3.7 nM (PARP1 K_d is 22 nM, Figure S5 in the Supporting Information). These

experiments demonstrate that targets can be individually analyzed through classical biochemical assays. In the case of Olaparib, many of the identified targets do not yet have such functional assays firmly established (Table 1).

The described method has a number of advantages. It is fast, sensitive, and relatively inexpensive to perform, since it does not use radioactivity or stable isotope labeling. It can be readily applied to live cells or whole organism,^[33] because the adducts are cell membrane permeable. While not specifically addressed here, work from others has shown that live cell compatibility of the bioorthogonal components may be important in certain cases when the inhibitor-binding ability of the target protein is different between live cells and cell lysates.^[7] Previous work has also shown that the TCO reacts very rapidly and specifically with Tz, thus making bioorthogonal chemistry a suitable choice for proteomic pull-down assays.^[30]

The mild conditions used for pull-down and protein release in this method allow for capture of protein complexes, thus avoiding the use of photoaffinity-labeling methods and reducing nonspecific labeling of proteins. While the precise K_d values required for this method are not known to date, comparing this method with covalent-labeling methods in the future may provide an even more complete picture of the extremely weak to extremely tight binding secondary targets. Because of the simplicity of this method, it is easy to change variables (e.g. cell lines, doses, timing, modified compounds) to derive important biological data. Unlike drug screens against purified proteins, this method allows unbiased screens and focuses on proteins relevant in certain cells.

We anticipate that the described technique has a number of future applications. While cell-based screens can result in a detailed picture of protein interaction in a clean model system (constant TCO source), it will be equally interesting to

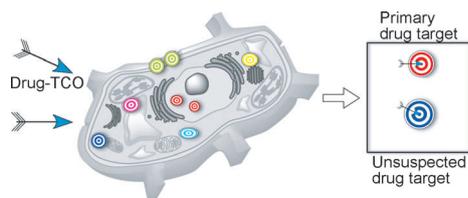
Communications



Proteomics

K. S. Yang, G. Budin, C. Tassa, O. Kister,
R. Weissleder* ————— ■■■■-■■■■

Bioorthogonal Approach to Identify
Unsuspected Drug Targets in Live Cells



A **proteomics method** to pull down secondary drug targets from live cells is described. The drug of interest is modified with *trans*-cyclooctene (TCO) and incubated with live cells. Upon cell lysis, the modified drug bound to the protein is

pulled down using magnetic beads decorated with a cleavable tetrazine-modified linker. Samples are then run on an SDS-PAGE gel and isolated bands are submitted for mass spectrometry analysis to identify drug targets.