A unified design allows fine-tuning of biosensor parameters and application across bacterial species

Christiane Katharina Sonntag\textsuperscript{a}, Lion Konstantin Flachbart\textsuperscript{a}, Celine Maass\textsuperscript{a}, Michael Vogt\textsuperscript{a}, Jan Marienhagen\textsuperscript{a,b,*}

\textsuperscript{a} Institute of Bio- and Geosciences, IBG-1: Biotechnology, Forschungszentrum Jülich, D-52425, Jülich, Germany
\textsuperscript{b} Institute of Biotechnology, RWTH Aachen University, Worringer Weg 3, D-52074, Aachen, Germany

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\textbf{ABSTRACT}

In recent years, transcriptional biosensors have become valuable tools in metabolic engineering as they allow semiquantitative determination of metabolites in single cells. Although being perfectly suitable tools for high-throughput screenings, application of transcriptional biosensors is often limited by the intrinsic characteristics of the individual sensor components and their interplay. In addition, biosensors often fail to work properly in heterologous host systems due to signal saturation at low intracellular metabolite concentrations, which typically limits their use in high-level producer strains at advanced engineering stages.

We here introduce a biosensor design, which allows fine-tuning of important sensor parameters and restores the sensor response in a heterologous expression host. As a key feature of our design, the regulator activity is controlled through the expression level of the respective gene by different (synthetic) constitutive promoters selected for the used expression host. In this context, we constructed biosensors responding to basic amino acids or ring-hydroxylated phenylpropanoids for applications in \textit{Corynebacterium glutamicum} and \textit{Escherichia coli}.

Detailed characterization of these biosensors in liquid cultures and during single-cell analysis using flow cytometry showed that the presented sensor design enables customization of important biosensor parameters as well as application of these sensors in relevant heterologous hosts.

1. Introduction

Metabolic engineering of microorganisms is still a very laborious task and despite detailed knowledge of the microbial metabolism, sophisticated rational engineering strategies are often flanked by traditional random mutagenesis and screening approaches. Methods for random mutagenesis of genes and genomes are well-established and very large strain libraries with a diverse genetic background can be easily generated. However, the production phenotype of the generated strain variants has to be investigated manually, which usually requires individual cultivation of each variant and costly analytical techniques (i.e. HPLC or GC) (Eggeling et al., 2015). A few years ago, transcriptional biosensors emerged as powerful high-throughput screening tools as they allow for the conversion of an intracellular metabolite concentration to a fluorescence output signal at the single-cell level (Schallmey et al., 2014). In combination with fluorescence activated cell sorting (FACS), producing cells can be directly isolated from a strain library eliminating the need for individual cultivation of every variant prior to screening (Binder et al., 2012; Siedler et al., 2014). Considering these advantages, it is not surprising that transcriptional biosensors are widely applied in several areas of research in academia and industry (Schallmey et al., 2014; Zhang et al., 2015).

Transcriptional biosensors are based on simple regulatory genetic circuits comprised of a transcriptional regulator, its cognate target promoter, and a reporter gene, e.g. coding for a fluorescent protein or a positive selection marker, which is under control of the cognate promoter (Binder et al., 2012). The transcriptional regulator specifically recognizes the inducer molecule of interest (ligand) as it binds to a dedicated ligand binding domain. This induces a conformational change of the transcriptional regulator. Depending on the regulator type, either regulator-binding to or regulator-release from its target operator site is induced. Both modes of action ultimately lead to initiation of transcription of the reporter gene (Mahr and Frunzke, 2016). A large variety of transcriptional regulator/promoter pairs have already been used for the construction of many different biosensors ranging from amino acids to more complex molecules such as antibiotics (Binder et al., 2012; Rebets

\footnote{\textsuperscript{*} Corresponding author. Institute of Bio- and Geosciences, IBG-1: Biotechnology, Forschungszentrum Jülich, D-52425, Jülich, Germany. E-mail address: j.marienhagen@fz-juelich.de (J. Marienhagen).}

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et al., 2018). Recently, constructed transcriptional biosensors illustrate the broad field of different sensor applications e.g. a BenM-based transcriptional biosensor, which allowed for selection of high cis,cis-muconic acid producer strains in yeast or a set of protocatechuate (3,4-dihydroxybenzoate) sensors based on the transcriptional regulator PcaU, which was applied to optimize screening applications in *Pseudomonas putida* (Jha et al., 2018; Snoek et al., 2018).

However, when a genetic circuit (regulator and target promoter) is directly turned into a biosensor, sensor characteristics such as the operational- and dynamic range (Fig. 1B), are predetermined and cannot be adjusted individually for specific sensor applications. The defined native dynamic and operational range assigns the field of possible biosensor applications to either basic research, monitoring of environmental pollution (low inducer concentrations), or strain engineering in an industrial setting (high inducer concentrations) (Schallmey et al., 2014; Webster et al., 2014). Furthermore, application of transcriptional biosensors can also be limited by their exclusive functionality in the native microorganism from which the sensor components are derived from (Mannan et al., 2017). For example, insertion of the regulatory circuit as part of cis,cis-muconic acid biosensor from *Acinetobacter* sp. ADP1 in yeast required insertion and adaption of a constitutive yeast promoter to establish a functional phenylpropanoic acid sensor in this organism (Skjoedt et al., 2016). Similarly, a 3,4-dihydroxybenzoate biosensor, which was originally also constructed in *Acinetobacter* sp ADP1 was not functional in *E. coli* until the promoter controlling the expression of the transcriptional regulator PcaU of the biosensor was adapted to the new expression host (Jha et al., 2014).

With the aim to address these biosensor limitations and to improve the applicability of biosensors across different species, we developed a unified biosensor design, which allows for fine-tuning of important sensor parameters. As key feature, this design allows for exchanging the original promoter of the transcriptional regulator gene to different spec.

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**Fig. 1. Unified biosensor design.** (A) Schematic modular sensor architecture. Expression of the transcriptional regulator (blue arrow) is under control of a native or synthetic constitutive promoter. Upon binding of an inducer molecule, the transcriptional regulator undergoes a conformational and binds to the operator site in the cognate promoter including the first 45 nucleotides of the originally controlled gene (OCG) to promote expression of a reporter gene (green arrow). (B) Definition of operational range (green) and dynamic range (blue) based on the sensor output signal. (C) Ligands of PhdR- and LysG-based biosensors. (For interpretation of the references to color in this figure legend, the reader is referred to the Web version of this article.)
(synthetic) constitutive promoters preselected for different host systems. With this design, we successfully constructed different transcription factor-based biosensors for amino acids and phenylpropanoids, which can be directly used for applications in the industrially important microbial workhorses *C. glutamicum* and *E. coli*. Demonstrating the versatility of this concept, we included both, transcription-activator- and repressor-based biosensors, in our study.

2. Materials and methods

2.1. Plasmid and strain construction

Recombinant DNA work was performed according to standard protocols of molecular cloning such as polymerase chain reaction (PCR), DNA restriction and ligation (Sambrook and Russel, 2001). Electroporation for transformation of *C. glutamicum* strains was carried out as described previously (Eigelging and Bott, 2005). Restriction enzymes were obtained from Thermo Fisher Scientific (Waltham, MA, USA). Genes, promoter- and terminator sequences were amplified by PCR using Novagen KOD Polymerase (Merck KGaA, Darmstadt, Germany). Cloning of amplified PCR products was performed using classical DNA restriction ligation or Gibson assembly (Gibson et al., 2009). For plasmids containing more than one insert or small inserts (<500 bp), fragments were joined by overlap-extension PCR. In-frame deletion of genes in the *C. glutamicum* genome was carried out with the pk919mobsacB system by a two-step homologous recombination method (Niebisch and Bott, 2001; Schäfer et al., 1994). Both, synthesis of oligonucleotides and DNA sequencing using Sanger sequencing, was performed by Eurofins MWG Operon (Ebersberg, Germany). The sequence of all oligonucleotides used in this work are listed in Table S3.

2.2. Bacterial strains, media and growth conditions

All bacterial strains and plasmids used in this study and their relevant characteristics are listed in Tables S1 and S2, respectively. *E. coli* DH5α was used for plasmid constructions and was cultivated in Luria-Bertani (LB) medium at 37 °C (Bertani, 1951). Where appropriate, kanamycin (25 μg/mL) or spectinomycin (100 μg/mL) was added to the medium. Bacterial growth was followed by measuring the optical density at 600 nm (OD₆₀₀). *E. coli* DH10B-based strains were cultivated at 37 °C in LB medium or yeast nitrogen base (YNB) medium (Merck KGaA, Darmstadt, Germany) containing kanamycin (15–25 μg/mL) and spectinomycin (100 μg/mL). For the preparation of 1 L of YNB medium, 100 mL of 10XYNB, containing 5.1% (v/v) glycerol was added to 900 mL YNB base solution. YNB base solution contained 6 g/L K₂HPO₄, 3 g/L KH₂PO₄ and 10 g/L 3-(N-morpholino)propanesulfonic acid (MOPS), pH 7. Due to ω-1-αuxotrophy of *E. coli* DH10B, ω-1-leucine was supplemented to a final concentration of 2 mM to YNB medium (Duerre et al., 2008). The *C. glutamicum* ATCC 13032 wild type (American Type Culture Collection) and derived strains were cultivated at 30 °C in brain heart infusion (BHI) medium (Difco Laboratories, Detroit, MI, USA) or defined CGXII medium with 2% (w/v) glucose as sole carbon and energy source (Abe et al., 1967; Keilhauer et al., 1993). For plasmid maintenance in the respective strains, kanamycin (25 μg/mL) was supplemented.

Constructed strains harboring LysG- or PhdR-based biosensors were characterized with respect to their biomass and fluorescence response using the BioLector cultivation system (m2p-labs GmbH, Baesweiler, Germany) (Funk et al., 2009; Kcna et al., 2009). For this purpose, *E. coli*- and *C. glutamicum* sensor strains, were grown on a rotary shaker at 170 rpm for 6–8 h in reaction tubes with 5 mL rich medium (either LB (*E. coli*) or BHI (*C. glutamicum*)), which was supplemented with antibiotics where appropriate. Precultures were used to inoculate 15 mL defined medium (YNB (*E. coli*) or CGXII (*C. glutamicum*)) in 50 mL baffled flasks, which were subsequently cultivated overnight on a rotary shaker at 120 rpm. Main cultures, cultivated in 48-well microtiter FlowerPlates (MFPs) using the BioLector cultivation system in YNB or CGXII medium were inoculated to an OD₆₀₀ of 0.1 and 1.0 for *E. coli* and *C. glutamicum*, respectively. In PhdR-based sensor strains, heterologous expression of the 4-coumarate: CoA ligase (4CL)-encoding gene was induced using 1 mM isopropyl β-D-thiogalactopyranoside (IPTG) in *C. glutamicum* DelAro™ΔpdrR or 0.002%–0.02% L-arabinose in *E. coli* DH10B immediately after inoculation (Kallischuer et al., 2016b). The operational range of all biosensors was investigated with various inducers, basic amino acids for LysG-based biosensors (either ω-histidine, ω-lysine or ω-arginine for *E. coli* or the respective alanine dipeptides in *C. glutamicum*) and ring-hydroxylated phenylpropanoids for PhdR-based biosensors (either ω-coumaric acid, caffeic acid or ferulic acid dissolved in dimethyl sulfoxide (DMSO)). These molecules of interest were supplemented at different final concentrations in the cultivation medium in the flower plates before inoculation of the main cultures. Cell growth was measured by backscatter light intensity (wavelength 620 nm; signal gain of 25 (*E. coli*) or 10 (*C. glutamicum*)). The fluorescence signal of the enhanced yellow fluorescence protein (eYFP) was measured as fluorescence emission at a wavelength of 532 nm (signal gain factor of 30) after excitation at 510 nm. Specific fluorescence was calculated as ratio of 532 nm fluorescence to 620 nm backscatter using BioLecion software version 2.2.0.6 (m2p-labs GmbH, Baesweiler, Germany). Engineered biosensors were assessed by the sensor response given as fold-induction of the specific eYFP fluorescence. The basal specific fluorescence signal in cultures, corresponding to the sensor output signal at an uninduced state, was used to normalize the specific fluorescence response at different inducer concentrations.

Based on the resulting fold-induction at different inducer concentrations, important sensor parameters such as operational- and dynamic range were assessed. The operational range is defined as the range of inducer concentrations for which a change in fluorescent output signal is given until a plateau or maximum is reached. The dynamic range refers to the maximal fluorescence response signal of the biosensor in relation to the basal fluorescence response in an uninduced state. Dynamic range and the operational range of all tested sensors were determined on the basis of sensor response functions obtained from dose-response experiments. The dynamic range is given by maximal fold-induction reached. The operational range was determined in accordance with the fold-induction signal. As bottom value the concentration was used where 2 fold-induction was exceeded. The concentration at which the highest fold-induction was reached was used as top value.

2.3. Flow cytometry and data analysis

The specific fluorescence was followed during cultivations in 48-well plates using the BioLector cultivation system. After a global maximum or plateau was reached for the highest inducer concentration, the cultivation was paused to collect samples from all cultures containing the respective inducer to analyze the biosensor fluorescence response on a single-cell level by flow cytometry. Such experiments were performed using a BD FACSAria II cell sorter (BD Biosciences, Franklin Lakes, NJ, USA) equipped with a 70 μm nozzle run with a sheath pressure of 70 psi. A 488 nm blue solid laser was used for excitation. Front scatter (FSC) was recorded as small-angle (axial) scatter and side-scatter (SSC) was recorded as perpendicular scatter of the 488-nm laser beam. Detection of emitted eYFP fluorescence from the SSC signal was achieved by combining a 502 nm long-pass and 530/30 nm band-pass filter. Acquisition of fluorescence data was always performed following a two-step gating strategy: By using a FSC-H versus SSC-H plot, a first population was gated to exclude signals from cell debris and electronic noise. From the resulting population, the FSC-H signal was plotted against FSC-W to perform singlet discrimination. The gated singlet population was used for fluorescence acquisition in all experiments. The afore mentioned gating strategy for fluorescence measurement of single cells was used for both, *E. coli* and *C. glutamicum*. For each biosensor variant bearing strain, the fluorescence signal of 100,000 events at different inducer concentrations was routinely recorded. The total event rate during measurements never
Key to modulating the response of a transcriptional biosensor is the gradual and constitutive expression of the gene of the transcriptional regulator (Lin et al., 2018; Rogers et al., 2015; Skjoedt et al., 2016; Zhang et al., 2017). Hence, a unified sensor design was established to control the expression level of the transcriptional regulator in a direct manner to influence the dynamic- and operational range of the transcriptional biosensor (Fig. 1B and S1). The overall sensor architecture can be separated into two modules: The regulatory module which encompasses the expression of the transcriptional regulator, and the sensing module in which the expression of the reporter gene is under control of a regulated promoter (Fig. 1A). In the regulatory module, a small selection of constitutive promoters from a previously characterized promoter library was used to compare effects of different transcriptional regulator levels on the sensor response. Since the biosensor design is evaluated in both, E. coli and C. glutamicum, two constitutive promoter libraries were chosen for the two host organisms. The well-characterized PLtetO1 promoter library was selected for E. coli, as this library was used previously for the successful construction of an arsenite-responsive biosensor (Alper et al., 2006; Merulla et al., 2013). In C. glutamicum, no such experience could be drawn on, as no studies have been carried out on changes in sensor architecture and the resulting sensor response, yet. Therefore, a well-characterized library of different constitutive dapA promoter variants was used to fine-tune the expression level of the regulator gene. Originally, these promoter variants were constructed during characterization of the –10 region of the promoter of the dapA gene, which encodes for dihydroadipicollinate synthase in C. glutamicum (Bonnassie et al., 1990; Vašíčková et al., 1999). In this context, chloramphenicol acetyltransferase (CAT) assays were performed to quantify and compare the promoter activity of more than 20 mutated promoter variants. The results showed that the promoter activity covers a range from 5 to 500% when compared to the wild-type dapA promoter. Noteworthy, variants of this dapA promoter library were successfully used to down-regulate the expression of the citrate synthase gene gta in the context of l-lysine production with C. glutamicum (van Ooyen et al., 2012).

From both libraries, strong (S), moderate (M) and weak (W) constitutive promoters were selected to examine the effects of promoter strength on the fluorescence response (Table S4). In the sensing module, the regulated promoter and the first 45 nucleotides of the open reading frame of the regulated gene in the original genetic circuit were always included in order to not impair the stability of any mRNA folding, which could have a negative effect on translation initiation (Fig. 1A) (Kudla et al., 2009). Hence, this sequence was always inserted upstream of the reporter gene followed by a stop codon and an additional ribosome binding site (RBS) (AAAGAG-N67) in front of the reporter gene start codon (Fig. 1A). By adding this RBS sequence, insufficient promoter activity can be circumvented as it has been described in the context of previous biosensor studies in C. glutamicum (Binder et al., 2012). In addition, the often divergently oriented promoter architecture of a cognate promoter might cause an undesired transcriptional read-through leading to uncontrolled expression of the regulator gene (Maddocks and Oyston, 2008). These effects can be minimized or averted by insertion of a terminator sequence between regulated and constitutive promoter (De Paepe et al., 2018; Rogers et al., 2015). Eventually, the sensing and regulatory module was integrated in divergent orientation in medium-copy vector backbones: pJC1 in case of C. glutamicum, and pBR322 in case of E. coli. Both vector backbones were selected as they represent a low metabolic burden for the respective host organism (Wu et al., 2016).

3.2. Construction of PhdR-based transcriptional biosensors in C. glutamicum

As first example, a set of transcriptional biosensors using the repressor PhdR and its regulated promoter PhdB were constructed. In C. glutamicum, PhdR naturally represses the expression of genes involved in phenylpropanoid degradation in absence of any phenylpropanoids, which can be readily taken up and utilized as sole carbon and energy source by this bacterium (Kallscheuer et al., 2016a). PhdR derepression is specifically initiated by CoA-activated ring-hydroxylated phenylpropanoids such as p-coumaryl-CoA. The proposed mode of action of PhdR is typical for MarR-type regulators (Otani et al., 2016). Upon binding of a CoA-activated phenylpropanoid, PhdR undergoes a conformational change and is unable to bind to its operator site, which in turn promotes binding of the RNA polymerase to PhdB (Scheuer et al., 2016a). The promoter PhdB and the region covering PhdR and 45 nucleotides of the PhdB coding sequence were amplified from the genome of C. glutamicum. As the exact position of promoter elements in the intergenic region is not known, the information was deduced from the homologous region coding for the MarR-type regulator CouR and the CouR-controlled catabolic genes in Rhodopseudomonas palustris and Rhodococcus jostii RHA1 (Hirakawa et al., 2012; Otani et al., 2016). The resulting plasmid pSenPhdR was used to compare the sensor response of the native regulatory circuit to the biosensors constructed according to the unified biosensor design. These included derivatives of pSenPhdR, in which the expression of PhdB is under control of either a weak (W), moderate (M) or strong (S) constitutive promoter (pSC45-PhdR-W, pSC45-PhdB-M, pSC45-PhdB-S). C. glutamicum DelAro4ΔAcL was selected as host strain, as it is deficient in phenylpropanoid degradation and additionally harbors an IPTG-inducible plant-derived 4cl gene encoding a 4-coumarate-CoA ligase necessary for CoA-activation of phenylpropanoids (Kallscheuer et al., 2016b). Both features are a prerequisite to ensure sufficient intracellular levels of the PhdR inducer p-coumaryl-CoA. This is particularly important since the intracellular p-coumaryl-CoA level should reflect the different extracellular concentrations of supplemented p-coumaric acid in biosensor characterization experiments. Since the chromosomal copy of phdR may interfere with the sensor response, sole episomal expression of phdR would be beneficial for a stringent control of the sensor response. Therefore, the chromosomal phdR gene was deleted yielding C. glutamicum DelAro4ΔAcL ΔphdR as strain background for all subsequent experiments.
regulator protein, which then loses its functionality and cannot tightly repress the expression of the reporter gene (Ellis and Minton, 2006). The reduced dynamic range of the other biosensor variants compared to pSenPhdR (Fig. 2A) can be explained by an increased basal specific fluorescence (Fig. S2), which is in turn due to the leakiness of the regulated promoter at high intracellular transcriptional regulator concentrations. Based on these results, the native genetic circuit of PhdR provides an optimal intracellular regulator activity to ensure high signal amplification. Neither high nor low constitutive expression of phdR could restore this sensor response, indicating that an autoregulatory circuit might control the expression of phdR similar to other MarR-type transcriptional regulators (Wilkinson and Grove, 2006).

When comparing the operational range of the sensor variants constructed according to the unified sensor design, distinct differences became apparent (Table 1). The broadest operational range was covered by pSCcG-PhdR-M with moderate regulator gene expression. In contrast, compared to all other constructed PhdR-based sensors pSCcG-PhdR-W showed an increased fluorescence response at lower inducer concentrations. This enhanced biosensor sensitivity allows for sensor applications at low ligand concentrations.

Fig. 2. Biosensor response of constructed PhdR-based biosensors in C. glutamicum. (A) Dose-response plot for PhdR-based sensor constructs based on the native regulatory circuit (pSenPhdR) and on the unified sensor design (pSCcG-PhdR-S/M/W). All different cultivations were supplemented with eight different p-coumaric acid concentrations ranging from 4 to 4000 μM (externally supplemented). The respective fluorescence response was plotted as fold-change in specific eYFP fluorescence. Error bars represent standard deviations calculated from three biological replicates. (B) FACS experiments with C. glutamicum DelAro4-4ΔphdR strains carrying pSCcG-PhdR-S/M/W or pSenPhdR in the presence of externally supplemented 0 μM p-coumaric acid (blue) or 250 μM p-coumaric acid (pink). In each case, 95,000 representative single cells were analyzed. (For interpretation of the references to color in this figure legend, the reader is referred to the Web version of this article.)
Cytometry was carried out to judge their suitability for such applications. Of the different PhdR-based biosensors at the single-cell level using flow cytometry, fluorescence response of individual cells. Hence, an in-depth characterization was investigated for different inducer concentrations (Fig. S4). Interestingly, the lower the expression level of the repressor gene, the lower the p-coumaric acid concentration to homogenously shift the fluorescence of the whole cell population. Explicitly, this could be shown by comparing the fluorescence response of all assessed PhdR-based biosensors at 25 μM p-coumaric acid. Here, both, pSenPhdR and pSC<sub>Cg</sub>-PhdR-M, gave a heterogeneous fluorescence response resulting in two distinct populations during FACS analysis, whereas the fluorescence response of all cells bearing pSC<sub>Cg</sub>-PhdR-W showed a single global maximum upon supplementation of p-coumaric acid (Fig. 2B). For all constructed sensors the gradual shift of the fluorescent population induced with increasing ligand concentration is sufficient to apply PhdR-based biosensors in screening applications in the determined operational range (Fig. S4).

### 3.5. Ferulic acid and caffeic acid trigger a weaker biosensor response

In addition to p-coumaroyl-CoA, PhdR can also detect other ring-hydroxylated phenylpropanoids such as ferulic and caffeic acid (Kallscheuer et al., 2016a). Therefore, it was of interest to know whether the sensor response also depends on the supplemented ligands. For this purpose, the fluorescence response of pSC<sub>Cg</sub>-PhdR-W and pSenPhdR was investigated in 48-well platform cultivations and subsequent FACS experiments in the presence of both phenylpropanoids. pSC<sub>Cg</sub>-PhdR-W was selected as this biosensor already offered a strong and homogenous fluorescence response at low p-coumaric acid concentrations in previous experiments. In general, the dynamic range of both biosensors determined for ferulic acid and caffeic acid was reduced by approximately 30% in comparison to p-coumaric acid (Table 1). However, when comparing both biosensors directly, pSC<sub>Cg</sub>-PhdR-W showed an overall decreased performance with regard to operational and dynamic range in response to ferulic acid and caffeic acid. Additional characterization of the fluorescence response of both PhdR-based sensors using FACS showed a shift of the respective population from low to a high fluorescence intensity with increasing inducer concentrations (Fig. S5). When comparing the histogram plots at 1000 μM inducer concentration of both biosensors (Fig. 3D and Fig. S5 B,D), a clear shift from low to high fluorescence could be observed for pSC<sub>Ec</sub>-PhdR-W in the presence of p-coumaric acid and caffeic acid, but not in response to supplementation of ferulic acid. In contrast, pSenPhdR gave a heterogeneous fluorescence response in presence of all three phenylpropanoids (Fig. 3 C and Fig. S5 A,C). This might indicate that the overall intracellular repressor activity of pSenPhdR was higher compared to pSC<sub>Ec</sub>-PhdR-W, which resulted in a stronger repression of the reporter gene at identical inducer concentrations ultimately leading to a more heterogeneous biosensor response. Noteworthy, not only regulator gene expression and inducer concentration, but also affinity of the respective inducer to the 4CL and the affinity of the CoA-activated inducer on the regulator protein have an impact on the biosensor response in these experiments.

### Table 1: Characterization of PhdR and LysG-based biosensors in C. glutamicum and E. coli.

| Sensor            | Inducer | Host                         | Dynamic range [fold-induction] | Operational range [μM] | low  | high |
|-------------------|---------|------------------------------|-------------------------------|-------------------------|------|------|
| pSC<sub>Ec</sub>- PhdR-S | p-coumaric acid | C. glutamicum DelAr<sup>4</sup>-ΔphdR<sup>Ec</sup> | 30 | 16 | 4000 |
| pSC<sub>Ec</sub>-PhdR-M | p-coumaric acid | C. glutamicum DelAr<sup>4</sup>-ΔphdR<sup>Ec</sup> | 30 | 4 | 250  |
| pSC<sub>Ec</sub>-PhdR-W | p-coumaric acid | C. glutamicum DelAr<sup>4</sup>-ΔphdR<sup>Ec</sup> | 101 | 4 | 1000 |
| pSC<sub>Ec</sub>-PhdR-S | ferulic acid | C. glutamicum DelAr<sup>4</sup>-ΔphdR<sup>Ec</sup> | 17 | 4 | 63   |
| pSC<sub>Ec</sub>-PhdR-W | caffeic acid | C. glutamicum DelAr<sup>4</sup>-ΔphdR<sup>Ec</sup> | 15 | 4 | 250  |

3.4. Homogeneous fluorescence response of PhdR-based biosensors can be restored by decreased regulator expression levels

Transcriptional biosensors show their true potential in combination with FACS in high-throughput screening (HTS) campaigns in which every cell is characterized with respect to fluorescence intensity individually. However, the biosensor response of a whole culture can be very different from the response of individual cells. Hence, an in-depth characterization of the different PhdR-based biosensors at the single-cell level using flow cytometry was carried out to judge their suitability for such applications.
However, based on the results from analysis of liquid cultures and FACS analysis, phdR expression requires tight control since high repressor concentrations result in permanent repression of the reporter gene, whereas low repressor levels result in an incomplete or partial repression of the reporter gene. Taken together, pSC\textsubscript{Cg}-PhdR-W appears to be most suitable biosensor for FACS applications since a homogeneous shift of the entire population with respect to the fluorescence intensity was observable for all tested phenylpropanoids, even at low inducer concentrations.

3.6. Construction and modulation of transcriptional activator-based biosensors

In addition to the constructed repressor-based PhdR-biosensors, we set out to also use the unified biosensor design for constructing activator-based biosensors. In this context, the genetic circuit controlling basic amino acid export in \textit{C. glutamicum} was selected, which involves the LTTR-type transcriptional activator LysG (Bellman et al., 2001). In \textit{C. glutamicum}, LysG regulates the expression of the transporter gene \textit{lysE}, which exports excess amounts of basic proteinogenic amino acids L-lysine and L-arginine as well as of L-citrulline and L-ornithine (Bellman et al., 2001). Based on this native regulatory circuit, the transcriptional biosensor pSenLysG was constructed previously (Binder et al., 2012). Subsequently, this biosensor was successfully used to screen chemically mutagenized \textit{C. glutamicum} wild type cells for identifying novel genetic hot spots contributing to \(\text{l-lysine}\) overproduction using FACS (Binder et al., 2012). Here, several LysG-based biosensors using the same constitutive promoters for regulator gene expression were constructed according to the unified sensor design for \textit{C. glutamicum} (pSC\textsubscript{Cg}-LysG-W, pSC\textsubscript{Cg}-LysG-M, pSC\textsubscript{Cg}-LysG-S). All constructed sensor plasmids were characterized in a \textit{C. glutamicum} \(\Delta\text{lysEG}\) strain background to prevent interfering regulator and/or exporter gene expression from the genome.

Initially, the fluorescence response of the constructed biosensors was assessed in 48-well plate cultivations using amino acid dipeptides His-Ala, Lys-Ala and Arg-Ala at different concentrations ranging from 0 to 10,000 \(\mu\text{M}\) (Fig. S6). Dipeptide inducers were used instead of free amino acids, as dipeptides are more easily taken up by \textit{C. glutamicum}, independent from their composition and sequence (Erdmann et al., 1993). In these experiments, the original biosensor pSenLysG served as benchmark. For all constructed biosensors the fold-induction in specific eYFP fluorescence was plotted against the respective inducer concentration (Fig. 4A). These dose-response experiments revealed, that the dynamic range increases with an increasing expression of the regulator gene \(\text{lysG}\) (Table 1 and Fig. 4A). Based on the “activating” nature of LysG, an increase of regulator gene expression resulted in an enhanced sensor response at low inducer concentrations. In line with this sensor response at low regulator gene expression levels, a slight shift of the operational range to higher concentrations could be observed. Therefore, the design principles developed can be also used to modulate the transcriptional activator activity, which ensures a broad applicability of LysG-based biosensors.

The potential of the different LysG-based biosensors in HT-FACS applications was assessed by detailed FACS analysis using all constructed biosensor variants (Fig. 4B). A low basal fluorescence level is crucial for...
Fig. 4. Biosensor response of constructed LysG-based biosensors in C. glutamicum. (A) Dose-response plot for LysG-based sensor constructs based on the native regulatory circuit (pSenLysG) and on the unified sensor design (pSCcgl-lysG-S/M/W). All different cultivations were supplemented with eight different inducer concentrations ranging from 125 to 10,000 μM dipeptide His-Ala (externally supplemented). The respective fluorescence response was plotted as fold-change in specific eYFP fluorescence. Error bars represent standard deviations calculated from three biological replicates. (B) FACS experiments with C. glutamicum ΔlysEG strains carrying pSenLysG or pSCcgl-lysG-S/M/W in the presence of externally supplemented 0 μM His-Ala (blue), 1250 μM His-Ala (pink) and 2500 μM His-Ala (green). In each case 95,000 representative single cells were analyzed. (For interpretation of the references to color in this figure legend, the reader is referred to the Web version of this article.)
any future sensor application in high-throughput screening campaigns. Therefore, a first characterization comparing the basal fluorescence level of C. glutamicum ΔlysEG to the same strain carrying the empty sensor plasmid pSC_{Cg} without any biosensor components as well as the same strain carrying the pSenLysG sensor was performed. These experiments confirmed a very similar fluorescence response under the same conditions rendering strain and plasmid suitable for further experiments (Fig. S3B).

Corresponding to the determined operational range from performed BioLector cultivations (Fig. 4A), an increase and gradual shift in fluorescence intensity from lower to higher state could be followed for all sensor variants with increasing inducer concentration (Fig. S7). An increased fluorescence response for pSC_{Cg}-LysG-S and pSC_{Cg}-LysG-M could be observed at low inducer concentrations (625 μM His-Ala) whereas the same shift could be detected for pSenLysG and pSC_{Cg}-LysG-W at higher inducer concentrations (>625 μM His-Ala) (Fig. S7). This result was confirmed by comparing the histogram plots at extracellular supplemented inducer concentration of 1250 μM His-Ala of all biosensor constructs in which the different stages of induction of the sensor constructs were clearly visible (Fig. 4B). A distinct shift of the fluorescence response from an uninduced to an induced state allows for the application of LysG-based biosensors in FACS screening approaches to achieve a sufficient separation between different cell populations in a genetically diverse mutant library. Since the operational range of the constructed sensor variants differs as a result of the different promoter strengths, a suitable biosensor can be selected based on the expected target molecule concentration in the respective screening application.

3.7. Ligand-spectrum of LysG-based biosensors

Further sensor characterization with regard to the biosensor’s ligand spectrum was performed with different dipeptide inducers containing the basic amino acids l-arginine and l-lysine. Previous binding studies of LysG showed that the transcriptional regulator responds to all basic amino acids L-histidine-, L-lysine- and L-arginine with different affinities corresponding to the dissociation constants (K_{D}) (L-His 16 ± 1.1 \times 10^{-6} M/ L-Lys 3.29 ± 0.62 \times 10^{-3} M/L-Arg 1.15 ± 0.06 \times 10^{-3} M) (Della Corte et al., 2020). Due to the observed broader dynamic- and operational range of pSC_{Cg}-LysG-S with inducer His-Ala, this biosensor and pSenLysG were used to characterize the biosensor performance in the presence of Lys-Ala and Arg-Ala in 48-well plate cultivations and in FACS experiments (Table 1). The dynamic range of pSC_{Cg}-LysG-S in response to the presence both dipeptides was decreased compared to His-Ala. Here, pSenLysG showed a broader dynamic range compared to pSC_{Cg}-LysG-S in case of the same dipeptides. However, in case of both biosensors, with decreasing binding affinity of the respective ligand to LysG, the operational range of the different biosensor variants was more shifted to higher concentrations (Table 1, Fig. 5A and B).

Fig. 5. Ligand spectrum of LysG-based biosensors in C. glutamicum. (A) Dose-response plot for reference pSenLysG and (B) sensor construct pSC_{Cg}-LysG-S in the presence of externally supplemented inducers His-Ala (blue), Lys-Ala (pink) and Arg-Ala (green). Cultivations were supplemented with eight different inducer concentrations ranging from 125 μM –10,000 μM (externally supplemented). The respective fluorescence response was plotted as fold-change in specific eYFP fluorescence. Error bars represent standard deviations calculated from three biological replicates. FACS experiments with C. glutamicum ΔlysEG strains carrying (C) pSenLysG or (D) pSC_{Cg}-LysG-S in the presence of 5000 μM His-Ala (blue), Lys-Ala (pink) and Arg-Ala (green) (externally supplemented). In each case 95,000 representative single cells were analyzed. (For interpretation of the references to color in this figure legend, the reader is referred to the Web version of this article.)
The fluorescence response at the single-cell level confirmed the results obtained in liquid cultures and showed that an increased binding affinity to the inducer allowed for a shift from lower to a higher fluorescence levels at lower inducer concentrations. With respect to a homogeneous sensor response on a single-cell level for the whole cell population, the respective sensor response of pSenLysG and pSCCg-LysG-S in the presence of different dipeptide inducers at the same concentration was investigated. A homogeneous fluorescence response was recorded for all cells carrying pSenLysG within a culture (Fig. 5C and S8 A,C), whereas pSCCg-LysG-S only yielded a heterogeneous fluorescence response for the whole cell population (Fig. 5D and S8 B,D). In case of pSenLysG, the native genetic circuit controlling lysG expression always provides sufficient regulator activity in response to the respective inducer concentration, whereas in pSCCg-LysG-S a strong constitutive expression of lysG always ensures an excess of LysG in the cell. Intracellularly, LysG is present either in an activated ligand-bound state or a ligand-free inactive state (Bellman et al., 2001). This equilibrium is influenced by many parameters, namely the regulator concentration, the number of ligand binding sites per regulator as well as by the inducer concentration and binding affinity of the inducer to its designated regulator binding site. Hence, a shift of this equilibrium results in a change in fluorescence response of the sensor. Therefore, a weaker or incoherent activation of the transcriptional regulator depending on inducer concentration, may result in a heterogeneous fluorescence response of the entire cell population on the single-cell level.

Hence, fine-tuning of the expression level of a transcriptional repressor or activator in different sensor constructs enables the adaption of the sensor’s operational and dynamic range depending on the desired application in C. glutamicum. Successful sensor characterization on a single-cell level allowed for the identification of the concentration range in which a gradual shift of the fluorescent population from low to higher fluorescence levels can be assessed, even for different inducer molecules. Based on the results of the sensor characterization of both LysG and PhdR-based biosensors, the repertoire of biosensor variants constructed allows for selection of a specific sensor construct, which meets the requirements for FACS screenings in a specific field of application.

3.8. The unified biosensor design allows for the functional transfer of biosensors to E. coli

Previously, a LysG-based biosensor using the native promoters from C. glutamicum was constructed for applications in E. coli (Wang et al., 2016). However, no fluorescence response could be detected in performed dose-response experiments (Wang et al., 2016). With the aim to construct LysG-based biosensors for E. coli and to show that also PhdR-based sensors can be functionally implemented, several biosensor variants were built following the unified biosensor design. In this context, biosensors carrying either lysG or phdR under control of four different constitutive promoters of the PLTetO1 promoter library were constructed. For the application of the transcriptional regulator PhdR in
**E. coli**, CoA-activation of the ring-hydroxylated phenylpropanoids is essential. Hence, the functionality of the transcriptional biosensor could only be achieved by co-expression of a 4CL-encoding gene in *E. coli*. For this purpose, the open reading frame of the 4cl-gene originating from *Streptomyces coelicolor* was integrated in a pCDF-Duet-1 vector under control of an arabinose-inducible promoter yielding pCDF-BAD-4cl (*van Summeren-Wesenhagen and Marienhagen, 2015*). For all experiments concerning PhdR-based biosensors, the respective biosensor plasmid and the 4cl expression plasmid were co-expressed in *E. coli* DH10B.

All PhdR- and LysG-based biosensors were first characterized in 48-well plate cultivations with regard to their fluorescence response at different inducer concentrations ranging from 0 to 200 μM p-coumaric acid and 0–90,000 μM L-histidine for PhdR- and LysG based biosensors, respectively (Fig. 6 A,B and S 9,10). Obtained results showed that PhdR-based biosensors are fully functional in *E. coli*; however, growth of sensor constructs pSCEc-PhdR-S, pSCEc-PhdR-M1 and pSCEc-PhdR-M2 was impaired. For an optimal fluorescence response of PhdR-based biosensors, optimization of the kanamycin concentration for plasmid maintenance and the arabinose concentration controlling 4cl gene expression was crucial to reduce the metabolic burden. With 0.02% (w/v) arabinose corresponding to low expression levels of the 4cl gene, the biosensor pSCEc-PhdR-W reached the highest dynamic range with up to 9 fold-induction at 100 μM p-coumaric acid inducer concentration also offering the widest operational range (Fig. 6 B). Due to the employed 4CL not accepting any other substrate than p-coumaric acid, only this inducer could be tested. For PhdR-based biosensors in *E. coli*, the highest dynamic- and operational range could be determined for the biosensor variant with the weakest constitutive promoter. These results showed that low levels of the transcriptional repressor lead to the highest fluorescence response, which might be due to a low metabolic burden for *E. coli* at low expression levels. In accordance to the performed dose-response experiments in 48-well plate cultivations, the conducted FACS experiments showed an increase in fluorescence over increasing p-coumaric acid concentrations (Fig. 6C and S11).

Similar to PhdR-based biosensors, a sensor response of all constructed LysG-based biosensors could be obtained in *E. coli*. Key was the expression of the transcriptional regulator gene under control of the constitutive promoter originating from *E. coli*. The maximal fold-induction of all variants was reached for pSCEp-LysG-W at 90,000 μM L-histidine with 16-fold induction (Fig. 6B) and the widest operational range (Table 1). However, a substantial difference in dynamic- and operational range between different sensor variants comprising a weak and moderate promoter was not observable. Exemplarily, the fluorescence response of pSCEp-LysG-W was investigated on the single cell-level using FACS. Increasing inducer concentrations also resulted in a shift of fluorescence intensity. Based on the homogeneous fluorescence response over the entire cell population at different inducer concentrations and a well-differentiable fluorescence response, the sensor can be applied in HTS in combination with FACS to detect basic amino acids in *E. coli* (Fig. 6D and S12).

Independent from the mode of action of the used transcriptional regulator, the fluorescence response of the respective transcriptional biosensor from *C. glutamicum* could always be restored in *E. coli*. Furthermore, the constitutive promoter library controlling the regulator expression always allowed for the selection of a suitable transcriptional biosensor variant for FACS applications.

### 4. Conclusions

In this study, we introduced a unified biosensor design, which allows not only for the construction of transcriptional biosensors in *c. glutamicum* and *e. coli*, but also for the fine-tuning of important sensor parameters, such as dynamic range and operational range. Depending on the mode of action of the transcriptional regulator, regulator expression strength was an important parameter when tailoring the biosensor activity to a specific application, either in liquid cultures or at the single-cell level using FACS. Furthermore, an individual characterization of the biosensor in the presence of different ligands is essential, as different binding affinities of the respective inducer molecules strongly influence the overall biosensor response. In the future, the biosensor variability can be expanded by modulation of the target gene promoter, which would allow additional fine-tuning of the biosensor performance. We believe that the biosensor design described here, can also be used to construct tailor-made biosensors for other prokaryotic species.

**Author contributions**

C.K.S. and L.K.F designed the experiments; C.K.S., C.M. and M.V. performed all experiments, and C.K.S. and J.M. wrote the manuscript. All authors read and approved the final version of the manuscript.

**CRediT authorship contribution statement**

Christiane Katharina Sonntag: Conceptualization, Investigation, Visualization, Writing - original draft, Writing - review & editing. Lion Konstantin Flachbart: Conceptualization, Verification. Celine Maass: Investigation. Michael Vogt: Investigation. Jan Marienhagen: Conceptualization, Funding acquisition, Supervision, Researchers, Writing - original draft, Writing - review & editing.

**Declaration of competing interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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**Appendix A. Supplementary data**

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**References**

Abe, S., Takayama, K.-I., Kinoshita, S., 1967. Taxonomic studies on glumatic acid-producing bacteria. J. Gen. Appl. Microbiol. 13, 279–301. [https://doi.org/10.2322/jgam.13.279](https://doi.org/10.2322/jgam.13.279).

Alper, H., Fischer, C., Nevoigt, E., Stephanopoulos, G., Demasi, J., Huh, K., Nakatani, Y., Mu, K., 2006. Tuning genetic control through promoter engineering. Pnas 103, 3006–3007. [https://doi.org/10.1073/pnas.0507062103](https://doi.org/10.1073/pnas.0507062103).

Bellman, A., Vlijmić, M., Patek, M., Sahm, H., Krämer, R., Eggeling, L., 2001. Expression control and specificity of the basic amino acid exporter lytE of Corynebacterium glutamicum. Microbiol. 147, 1765–1774. [https://doi.org/10.1099/mic.00221271-1765](https://doi.org/10.1099/mic.00221271-1765).

Berti, G., 1951. Studies on lysogeny. I. The mode of phage liberation by lysogenic Escherichia coli. J. Bacteriol. 62, 293. [doi:10.1128/JB.62.3.293-296](https://doi.org/10.1128/JB.62.3.293-296).

Binder, S., Schendzielorz, G., Stäbler, N., Krumbich, K., Hoffmann, K., Bott, M., Eggeling, L., 2012. A high-throughput approach to identify genomic variants of bacterial metabolite producers at the single-cell level. Genome Biol. 13, R40. [https://doi.org/10.1186/gb-2012-13-5-r40](https://doi.org/10.1186/gb-2012-13-5-r40).

Bonazzio, S., Oreglia, J., Sicard, A.M., 1990. Nucleotide sequence of the daps gene from Corynebacterium glutamicum. Nucleic Acids Res. 18, 6421.

De Paep, B., Maertens, J., Vanholme, B., De Mey, M., 2018. Modularisation and response curve engineering of a naringenin-responsive transcriptional biosensor. ACS Synth. Biol. 7, 1303–1314. [https://doi.org/10.1021/acssynbio.7b00419](https://doi.org/10.1021/acssynbio.7b00419).

Della Corte, D., van Beek, H.L., Syberg, F., Schallmey, M., Tóthola, F., Cormann, K.U., Schlicker, C., Baumann, P.T., Krumbach, K., Hoffmann, K., Bott, M., Eggeling, L., 2012. A high-throughput approach to identify genomic variants of bacterial metabolite producers at the single-cell level. Genome Biol. 13, R40. [https://doi.org/10.1186/gb-2012-13-5-r40](https://doi.org/10.1186/gb-2012-13-5-r40).

Della Corte, D., van Beek, H.L., Syberg, F., Schallmey, M., Tóthola, F., Cormann, K.U., Schlicker, C., Baumann, P.T., Krumbich, K., Sokolowsky, S., Morris, C.J., Grünberger, A., Hofmann, E., Schroder, G.F., Marienhagen, J., 2020. Engineering and application of a biosensor with focused ligand specificity. Nat. Commun. 11, 4851. [https://doi.org/10.1038/s41467-020-18400-0](https://doi.org/10.1038/s41467-020-18400-0).

Durfee, T., Nelson, R., Baldwin, S., Plunkett, G., Burland, V., Mau, B., Petrosino, J.F., Qin, X., Muzny, D.M., Ayele, M., Gibbs, R.A., Qin, X., Muzny, D.M., Ayele, M., Gibbs, R.A., Qin, X., Muzny, D.M., Ayele, M., Gibbs, R.A., Qin, X., Muzny, D.M., Ayele, M., Gibbs, R.A., Qin, X., Muzny, D.M., Ayele, M., Gibbs, R.A.,
