



A novel dual reporter embryonic stem cell line for toxicological assessment of teratogen-induced perturbation of anterior–posterior patterning of the heart

Robert S. Leigh¹ · Heikki J. Ruskoaho¹ · Bogac L. Kaynak¹

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Abstract

Reliable in vitro models to assess developmental toxicity of drugs and chemicals would lead to improvement in fetal safety and a reduced cost of drug development. The validated embryonic stem cell test (EST) uses cardiac differentiation of mouse embryonic stem cells (mESCs) to predict in vivo developmental toxicity, but does not take into account the stage-specific patterning of progenitor populations into anterior (ventricular) and posterior (atrial) compartments. In this study, we generated a novel dual reporter mESC line with fluorescent reporters under the control of anterior and posterior cardiac promoters. Reporter expression was observed in nascent compartments in transgenic mouse embryos, and mESCs were used to develop differentiation assays in which chemical modulators of Wnt (XAV939: 3, 10 μ M), retinoic acid (all-trans retinoic acid: 0.1, 1, 10 μ M; 9-cis retinoic acid: 0.1, 1, 10 μ M; bexarotene 0.1, 1, 10 μ M), and Tgf- β (SB431542: 3, 10 μ M) pathways were tested for stage- and dose-dependent effects on in vitro anterior–posterior patterning. Our results suggest that with further development, the inclusion of anterior–posterior reporter expression could be part of a battery of high-throughput tests used to identify and characterize teratogens.

Keywords Teratogen · Cardiogenesis · Atrial cardiomyocyte · Ventricular cardiomyocyte · Stem cells · Anterior–posterior patterning · 3R · Developmental toxicity · Embryotoxicity

Introduction

Congenital heart diseases (CHDs) are the most common birth defects, with a prevalence in Western Europe of 8.3 cases per 1000 births (0.83%) (Moons et al. 2009). Among the risk factors for heart malformation are genetic predisposition, maternal health, and exposure to teratogens (Donofrio et al. 2014). These include drugs commonly taken by women of reproductive age, such as anticonvulsants, lithium, ACE inhibitors, and retinoids (Donofrio et al. 2014). After the retinoid isotretinoin was approved as an acne treatment in the early 1980s, it was taken by 120,000 women

of childbearing age, and induced spontaneous abortions or birth defects in 83% of pregnancies (Stern et al. 1984). In line with these potentially severe outcomes, developmental toxicity studies in pregnant mice and rats are currently mandated before approval of novel drugs (DeSesso 2017). However, these in vivo tests are low throughput, difficult to stage, require specialized expertise for determination of adverse effects, and rely on costly animal models (DeSesso 2017). In Europe alone, the number of animals used for toxicological risk assessment is 1 million per year, and this will increase with new testing of industrial chemicals (Kugler et al. 2016a, b). The development of robust, high-throughput in vitro tests for developmental toxicity is thus an important step in the reduction of both industrial expenditure and the use of laboratory animals as mandated by 3R principles of animal experiments (reduce, refine, replace) (Beekhuijzen 2017; Russell and Burch 1959).

For in vitro developmental toxicity tests to be reliable, multiple mechanisms of drug-induced developmental perturbation should be taken into account. These are thought to include folate antagonism, neural crest (progenitor) cell

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✉ Bogac L. Kaynak
bogac.kaynak@helsinki.fi

¹ Division of Pharmacology and Pharmacotherapy, Faculty of Pharmacy, University of Helsinki, Helsinki, Finland

disruption, endocrine disruption, oxidative stress, vascular disruption, and specific receptor- or enzyme-mediated effects (van Gelder et al. 2010). These mechanisms are not mutually exclusive, as in the case of progenitor cell perturbation via binding of toxic compounds to specific receptors (van Gelder et al. 2010). Additionally, neural crest cell disruption might be expanded to include disruption of the diverse progenitor populations which give rise to the fully formed heart (Jain and Epstein 2018). Cell-based assays intended to detect developmental toxicity should thus include cells similar to those encountered during embryogenesis, such as undifferentiated progenitors derived from pluripotent stem cells. The validated embryonic stem cell test (EST) is an *in vitro* assay which involves compound testing in mouse embryonic stem cells (mESCs), immortalized fibroblasts (3T3 cells), and the cardiac differentiation of mESCs (Seiler and Spielmann 2011). The cardiac differentiation protocol used in the EST might be improved by considering the diverse progenitor populations underlying embryogenesis, the heterogeneous cell types composing the fully developed heart, the temporal and spatial control of cell signaling, and cell-specific molecular markers underlying the differentiation process.

Recent studies have shown the tight temporal control of signaling pathways during cardiomyocyte differentiation. Increased canonical Wnt and bone morphogenetic protein (Bmp) signaling promotes the mesodermal specification of ESCs, whereas inhibition of these pathways underlies the differentiation of progenitor cells to cardiomyocytes (Kattman et al. 2011; Kwon et al. 2007; Lian et al. 2012). Additionally, there is significant spatial variation in deployment of signaling pathways which governs the patterning of the heart into anterior (ventricular) and posterior (atrial) compartments and is predominantly controlled by time- and dose-dependent retinoic acid signaling in the developing posterior compartment (Ryckebusch et al. 2008; Xavier-Neto et al. 1999). However, retinoic acid signaling has also been shown to govern heart size via the negative regulation of cardiac progenitors (Keegan et al. 2005). Thus, anterior–posterior patterning of organs is a complex process which itself encompasses multiple, stage-specific molecular programs.

Though it is not feasible to have an *in vitro* model which incorporates all aspects of development, testing for the perturbation of multiple, related lineages simultaneously might allow for improved detection of adverse events. Further optimization of protocols to include multiple, short compound treatment windows more closely following developmental stages and capable of detecting multiple lineages simultaneously will provide information on perinatal safety windows and mechanisms of developmental toxicity. This is especially important when attempting to use *in vitro* models to predict effects in clinical settings, as both the stage of pregnancy and dosage of exposure to toxic compounds affect the

likelihood of inducing malformations (Bérard et al. 2007; Cooper et al. 2006; Diav-Citrin et al. 2008).

We here describe steps toward improving the existing EST using reporter lines for developmental markers of anterior–posterior patterning of the heart. To confirm suitability of markers for genetic modification, gene expression profiles were generated of embryonic atria and ventricles using a selection of markers of atrial cardiomyocytes, ventricular cardiomyocytes, cardiac progenitors, nonmyocyte (stromal cells), and signaling pathways. Genome editing was used to generate a novel dual reporter mESC line for detecting anterior and posterior cardiac lineages simultaneously, and gene expression analyses of differentiating reporter mESCs informed assay development. Chimeric embryos generated from these mESCs displayed fluorescent expression in relevant cardiac tissues, and the selected compounds were then tested in the spontaneous differentiation of reporter mESCs. Finally, a serum-free embryoid body (EB) differentiation protocol was conducted in a scalable suspension format, allowing the high-throughput testing of differentiation modulators in cells of a defined mesodermal population. Our results give insight into cardiac development and provide a basis for further improvements to *in vitro* toxicological assessment of teratogens.

Materials and methods

qRT-PCR analysis of embryonic atria and ventricles

Embryonic day 10.5 (E10.5) embryonic hearts were removed from wild-type pregnant mice (C57BL/6JOLA^{Hsd}). Atria and ventricles were collected into TRIzol reagent (ThermoFisher Scientific), and RNA was extracted according to the manufacturer's instructions. RNA purity was improved using the RNeasy MinElute Cleanup kit combined with DNase treatment (Qiagen), and RNA quality was determined via both Qubit (ThermoFisher Scientific) and Bioanalyzer (Agilent). qRT-PCR reactions were performed using the Fluidigm Biomark HD and Taqman gene expression assays (Supplementary Table 1). A general list of abbreviations is shown in Table 1. Values were normalized to a reference gene (*Actb*). Each biological replicate consisted of four embryos. Samples from spontaneous differentiation of reporter mESCs were similarly processed.

TALEN design, assembly, and validation

A Tal effector nuclease (TALEN) pair targeting the *Myl2* locus was designed using TAL effector-nucleotide targeter (Doyle et al. 2012). TALEN-encoding plasmids were assembled using Golden Gate Cloning as described (Cermak et al. 2011). Plasmids for Golden Gate Cloning were obtained

Table 1 Abbreviations used in the current study

Abbreviation	Full name	Abbreviation	Full name
9CRA	9-cis retinoic acid	Kcne1	Potassium voltage-gated channel subfamily E regulatory subunit 1
Acta2	Actin, alpha 2, smooth muscle, aorta	Kdr	Vascular endothelial growth factor receptor 2
Actn2	α -actinin (sarcomeric)	Kit	c-Kit
Alcam	Activated leukocyte cell adhesion molecule	mESC	Mouse embryonic stem cell
Aldh1a2	Aldehyde dehydrogenase 1 family member a2	Mhc/MF20	Myosin, sarcomere
ATRA	All-trans retinoic acid	Myl2	Myosin light chain 2
atrRFP	Atrial-specific (posterior) fluorescent reporter	Myl7	Myosin light chain 2a
Axin2	Axin 2	Myh11	Myosin, heavy polypeptide 11
BX	Bexarotene	Nkx2.5	NK2 homeobox 5
Bmp	Bone morphogenetic protein	Nppa	Natriuretic peptide A
Cdh2	Cadherin 2	Nppb	Natriuretic peptide B
CHD	Congenital heart disease	Nr2f2	COUP transcription factor II
Cyp26a1	Cytochrome P450 retinoic acid-inactivating 1	Oct4	POU class 5 homeobox 1
Cyp26c1	Cytochrome P450 family 26 subfamily C member 1	Pecam1	Platelet/endothelial cell adhesion molecule 1
DMSO	Dimethyl sulfoxide	Pdgfra	Platelet-derived growth factor receptor alpha
E10.5	Embryonic day 10.5	Pitx2	Paired-like homeodomain 2
EB	Embryoid body	RVD	Repeat variable diresidue
ECG	Electrocardiography	Sln	Sarcolipin
EST	Embryonic stem cell test	SMyHC3	Slow myosin heavy chain 3
Gata4	GATA binding protein 4	TALEN	Tal effector nuclease
Gja5	Connexin-40	Tbx5	T-Box 5
hESC	Human embryonic stem cell	Tgf- β	Transforming growth factor beta
Hey2	Hairy-related transcription factor 2	Thy1	Thymus cell antigen 1, theta
hiPSC	Human-induced pluripotent stem cell	Tnnt2	Cardiac muscle troponin T
Irx4	Iroquois homeobox 4	venGFP	Ventricular-specific (anterior) fluorescent reporter
Isl1	Isl1-1	Vim	Vimentin

from Addgene. The TAL1 repeat variable diresidue (RVD) sequence was ‘NI NN NI NI NN NN HD NN NN NN NI NN HD NG HD HD NI’ and the TAL 2 RVD sequence was ‘NN NN NI NG HD NG NN NN NN NG HD NG NN HD NG’. This TALEN pair recognizes the genomic target sequence 5'-AGAAGGCGGGAGCTCCAACGTGTTCTCCATGTTTGAGCAGACCCAGATCC-3' within the Myl2 exon.

Generation of ventricle-specific targeting vector

The Myl2 targeting vector consisted of a promoterless eGFP-bGH-PGK-Puro cassette flanked by 5' and 3' homology arms. A large fragment encompassing the total homologous region was amplified from E14 wild-type mESC genomic DNA by PCR using 5'-AACCCCTCCCAAGC CAAGCA-3' and 5'-ATTCCCCCAAGGGCCAGGTGA-3'. The 5' homology arm was amplified from this amplicon by PCR using 5'-TGGCGGCCGCTCTAGCCCTCC CAAGCCAAGCACCC-3' and 5'-GCTCACCATGCT AGCCACGTTGGAGCTCCCGCCTTC-3', whereas the 3' homology arm was amplified from the homologous

template by PCR using 5' GCTCTATGGAGGCCTTCC ATGTTTGAGCAGACCCAGA-3' and 5'-ATCCAC TAGTTCTAGATTCCCCCAAGGGCCAGGTG-3'. The eGFP-bGH-PGK-Puro cassette was constructed by first excising eGFP from PITX3-eGFP-PGK-Puro using EcoRI and XhoI restriction enzymes, and subcloning this fragment into the pCDNA3.1(-) expression vector upstream of the bGH polyA sequence. This eGFP-bGH cassette was amplified by PCR using 5'-GCTAGCATGGTGAGCAAG GGCG-3' and 5'-AGGCCTCCATAGAGCCCACCGCAT CCC-3'. Primer regions not in bold were added to facilitate HD fusion cloning. The 5' homology arm, eGFP-bGH-PGK-Puro cassette, and 3' homology arm were cloned into XbaI digested pBluescript II KS(+) using the HD fusion cloning kit (Clontech). A PGK-Puro fragment amplified by 5'-TGGGCTCTATGGAGGTCCGATCATATTCAA TAACCCTTAAT-3' and 5'-CTCAAACATGGAAGG GGCGCGCCTAGTGAACCTCT-3' was ligated into a StuI restriction site in the resulting vector to generate the final Myl2-eGFP-PGK-Puro donor construct. The plasmid was sequenced to ensure fidelity.

Generation of atrial-specific transgene

The 840 bp sinoatrial-specific SMYHC3 promoter has been described previously (Xavier-Neto et al. 1999) and a construct containing the sequence was obtained from Dr. Jose Xavier-Neto. A plasmid was generated in which this promoter is used to drive the TdTomato fluorescent protein using infusion HD cloning (Clontech). In short, the 840 bp atria-specific sequence was amplified by PCR using 5'-CGG GCTGCAGGAATTCCACCACAGTGGCCCCATCC-3' and 5'-ACCATGGATCCTGCACAATCCTGCTGCTGCCAC-3'. The TdTomato-pA gene was amplified by PCR using 5'-TGCAGGATCCATGGTGAGCA-3' and 5' TAA ACAAGTCCGAGGCTGGGTACCGGGCCCAATG-3', whereas the PGK-Neo cassette was amplified using 5'-CTC GGAATTGTTTATTGCAGC-3' and 5'-GCTTGATATCGAATTAAGGGAACAAAAGCTGGAG-3'. Primer regions not in bold were added to facilitate HD fusion cloning. The three fragments were cloned into EcoRI-digested pBluescript II KS(+) using the HD fusion cloning kit (Clontech). The plasmid was sequenced to ensure fidelity.

Myl2 gene targeting in mESCs

The targeting vector and TALEN-encoding plasmids were introduced into E14 mESCs cultured in feeder-free conditions using the Xfect transfection reagent (Clontech). Correctly targeted mESC clones were identified using 5' junction PCR genotyping primers 5'-TTGAGAAGAGACGCA GGGTG-3' and 5'-GCTGAACCTGTGGCCGTTTAC-3', which amplify a PCR product encompassing the entire 5' homology arm and part of the eGFP-bGH-PGK-Puro cassette. Additionally, 3' junction PCR primers 5'-TCCATCAGAAGCTGGTCGAG-3' and 5'-CCTCTATGATGGCCGCTGTC-3' were used to identify positive clones. Clones positive from initial genotyping experiments were expanded and re-genotyped after six passages. A region flanking the TALEN targeting site was amplified from genomic DNA of expanded mutant cell lines using primers 5'-TTTCGCCCTC GCATGTTGTCTGGG-3' and 5'-GGATCGCTACCCAGC GCCTT-3' to identify heterozygous mutations. This band was sequenced, and a clone with a heterozygous knock-in (Myl2^{eGFP/w}) was used for further experiments.

Random integration of atrial-specific transgene

Myl2^{eGFP/w} mESCs were transfected with the linearized SMYHC3-TdTomato-PGK-Neo construct and clones with stable integration were manually isolated after 10 days of treatment with G418 (250 µg/mL). Stable integration in individual clones was confirmed by PCR genotyping using primers 5'-GGAGATAAGGAGGCCAGAAATAGC-3' and 5'-CTCACGTAGAACCCCTTTGC-3', which amplify a

sequence within the SMYHC3-TdTomato cassette. Positive clones were tested for differentiation potential, and expression of the eGFP and TdTomato reporter genes was assessed by flow cytometry and microscopy after differentiation to cardiomyocytes.

Generation of reporter mESC-derived embryos

Reporter mESCs were used to generate reporter embryos using eight-cell morula injection essentially as described (Poueymirou et al. 2007). Embryos were dissected and imaged on a fluorescent stereomicroscope (Zeiss Axio Zoom.V16).

Cardiomyocyte differentiation in hanging drops with small molecules

For differentiation of reporter mESCs, cells were plated to V-bottomed 96-well plates at 500 cells/well in 20 µL embryoid body differentiation medium (DMEM, 20% fetal bovine serum, non-essential amino acids, glutamax, 2-mercaptoethanol). Plates were inverted until day 2, when 200 µL medium was added. On day 5, EBs were then manually transferred to a 12-well plate coated with 0.1% gelatin at 6 EBs/well. Small-molecule compounds were diluted in DMSO and added to the cell culture medium at the indicated time points. All compounds were purchased from Sigma-Aldrich. D12 spontaneous differentiation cultures were dissociated with TrypLE for 20 min on a shaker. TrypLE was inactivated with serum and cells were washed and resuspended in 1× PBS before analysis on a BD LSRFortessa flow cytometer. Wild-type EBs and Myl2-eGFP EBs were used as negative controls for gating. Analysis was performed using Flowjo (Flowjo LLC). For fluorescent microscopy of differentiated clones, cells were fixed in 4% PFA, permeabilized with 0.1% Triton-X and stained with anti-RFP antibody (Rockland) and Alexa Fluor secondary (Thermo) to increase the fluorescent signal. Reporter mouse pluripotent stem cells were characterized by immunocytochemistry with an anti-Oct4 antibody (sc-8628). Characterization of sarcomeric protein expression in reporter cells was performed by immunocytochemistry for Mhc/MF20 (Developmental Studies Hybridoma Bank), and α-actinin (Sigma-Aldrich). Cells were imaged by epifluorescence (Zeiss Axioimager) or inverted fluorescence (Leica DMi8) microscopy.

Directed cardiomyocyte differentiation and high-throughput detection

E14 wild-type, Myl2^{eGFP/w}, and Myl2^{eGFP/w}, SMYHC3-TdTomato dual reporter mESCs were cultured in feeder-free conditions on 0.1% gelatin in LIF-containing medium. Directed differentiation into cardiomyocytes was performed

as described with some modifications (Kattman et al. 2011). mESCs were allowed to form EBs in suspension culture and grown at 75,000 cells/mL in media composed of the following: IMDM, Ham's F12, BSA, Glutamax, B27 supplement, N2 supplement, monothioglycerol, and ascorbic acid. After 2 days of suspension culture, EBs were dissociated with TrypLE and then re-aggregated for 40 h in media containing activin A (R&D Systems) and BMP4 (R&D systems). On day 4, EBs were again dissociated and replated at 125,000 cells in 250 μ L of StemPro, a serum-free medium (SP34, ThermoFisher Scientific #10639011) supplemented with VEGF (R&D systems), FGF10 (R&D systems), and FGFb (R&D systems) in ultra-low attachment 24-well plates. Day 5 EBs were dissociated with the neonatal mouse dissociation kit (Milenyi) and plated to 384-well clear-bottomed black plates. Compounds were added to adherent cells at the indicated time points, and the differentiation efficiency was measured using a Pherastar fluorescent plate reader (BMG). Data consist of at least four biological replicates and four technical replicates within each experiment. For characterization of D6 cells by immunocytochemistry, cells were fixed in 4% PFA, permeabilized with 0.5% Triton-X and stained with anti-Isl antibody (Developmental Studies Hybridoma Bank) and Alexa Fluor secondary (Thermo).

Results

Gene expression analysis of the newly formed embryonic heart

We selected a genetic approach for the efficient detection of anterior–posterior marker expression during *in vitro* differentiation. To assess specificity of markers to the anterior and posterior heart, we conducted a qPCR analysis of native, embryonic tissues to determine expression patterns of published chamber-specific markers. We also analyzed markers of stromal cell differentiation, progenitor cells, and signaling pathways to identify relevant differences in the newly formed chambers and inform assay development. We selected E10.5 hearts, as at this developmental time point the two atria and two ventricles have clearly formed. By choosing an early developmental stage, we sought to identify markers which would be suitable for *in vitro* differentiation, which produces immature cardiomyocytes. Known ventricle-specific genes such as *Hey2*, *Irx4*, *Kcne1*, and *Myl2* were also upregulated in the ventricular compartment in our study (Fig. 1a). Importantly, *Myl2* was the most upregulated ventricular gene (50-fold higher than atria), suggesting its suitability for reporter cell generation (Fig. 1a). Published atrial markers *Nr2f2*, *Myl7*, *Gja5*, and *Pitx2* were detected at increased levels in the atria (Fig. 1b), but also showed expression in the ventricular compartment, confirming the lack of robust, native

atrial markers during early embryogenesis in the mammalian system (Xavier-Neto et al. 1999). Sarcophilin was specifically expressed in the atrial compartment and absent in the ventricles (Fig. 1b), however, the presence of this marker in skeletal muscle makes it less suitable for differentiation analysis of mESCs (Babu et al. 2007). Importantly, the pan-cardiac marker *Tnnt2* showed no difference between atrial and ventricular compartments, suggesting equal composition of cardiomyocytes in the atria and ventricles (Fig. 1c).

In addition to known cardiomyocyte markers, we identified differences between the nascent compartments in stromal cell type composition. Interestingly, fibroblast markers *Cdh2* and *Thy1* were upregulated in the ventricular compartment, whereas smooth muscle marker *Myh11* was upregulated in the atrial compartment (Supplementary Fig. S1). Also, endothelial marker *Pecam1* was upregulated within the ventricular compartment. These suggest the early ventricle has a more fibrotic/endothelial character, whereas the atria have more cells of a smooth muscle identity.

No difference in cardiac progenitor marker *Nkx2-5* was observed between the embryonic atria and ventricles (Fig. 1d). However, progenitor markers *Kit* and *Kdr* were upregulated in the ventricular compartment (Fig. 1d), indicating the presence of endothelial progenitors in the developing ventricle (van Berlo et al. 2014). Additionally, the *Isl1* transcription factor, a marker of the second heart field and later sinoatrial nodal cells, was upregulated within the atria (Fig. 1d).

Signaling pathway markers also displayed differences between atria and ventricles (Fig. 1e). To distinguish between canonical and non-canonical Wnt signaling, *Axin2* and *Alcam*, respectively, were used as target genes (Cizelsky et al. 2014; Yan et al. 2001). While canonical Wnt signaling (*Axin2*) showed increased expression in atria, non-canonical Wnt signaling (*Alcam*) was upregulated in the ventricles (Fig. 1e). Additionally, retinoic acid signaling genes *Cyp26a1* and *Aldh1a2* were upregulated in the atria compared to the ventricles (Fig. 1e). These confirm the presence of developmental signaling pathways across the cardiac chambers of the newly formed embryonic heart.

Generation of dual reporter mESC line with genome editing

TALEN-mediated genome editing was used to generate a mESC line from which anterior and posterior lineages could be efficiently analyzed after *in vitro* differentiation. To mark cells of the anterior (ventricular) lineage, *Myl2* was selected for genomic modification, as *Myl2* has been shown to be specific to ventricular segments of the heart during embryonic and adult stages (O'Brien et al. 1993).

TALEN-encoding plasmids were constructed to encode nucleases which induce a double-strand break in the second

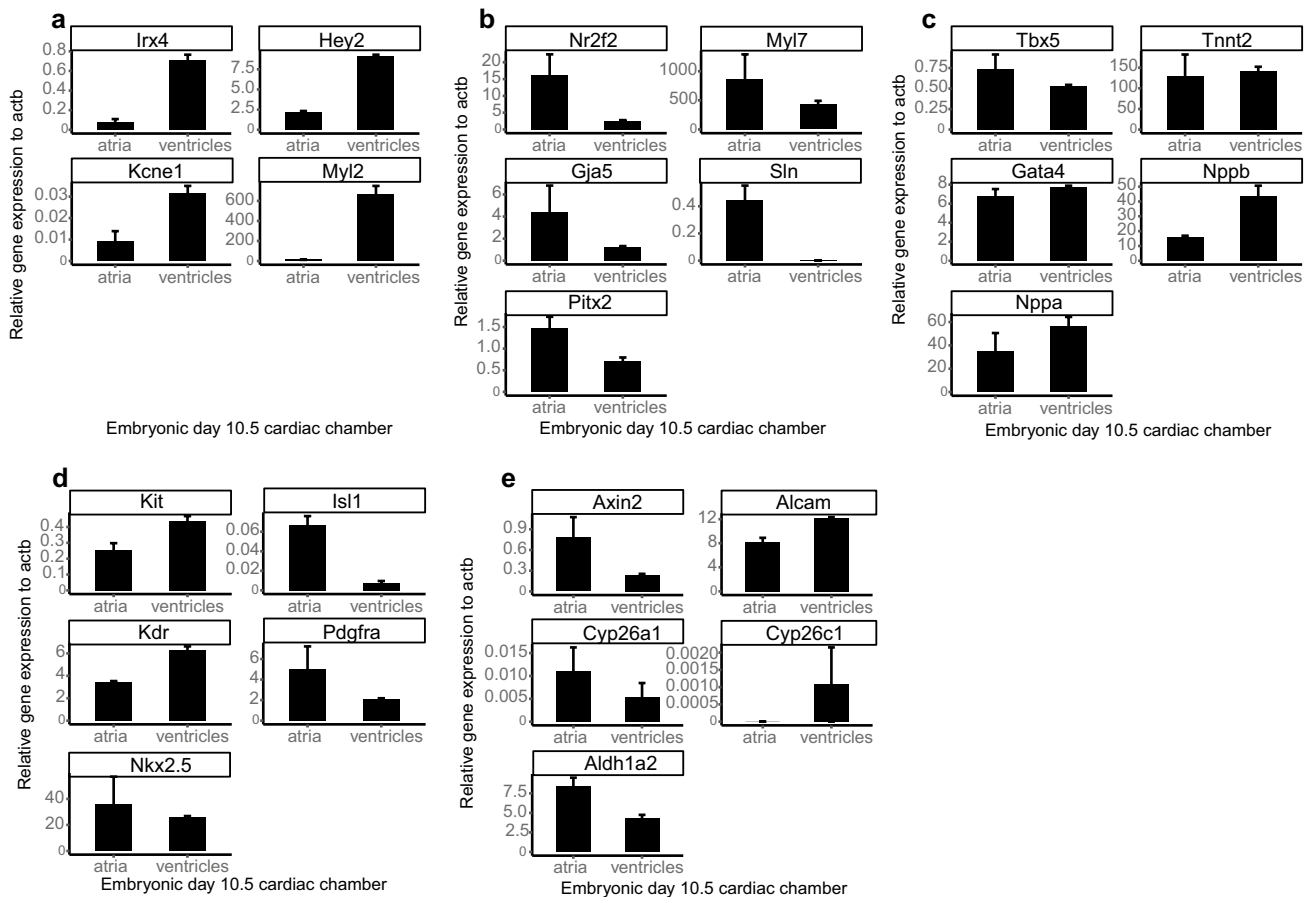


Fig. 1 qRT-PCR profiling of the newly formed four-chambered mouse heart (E10.5). Published markers of **a** ventricular: *Irx4*, *Hey2*, *Kcne1*, *Myl2* **b** atria: *Nr2f2*, *Myl7*, *Gja5*, *Sln*, *Pitx2* **c** pan-cardiac:

Tbx5, *Tnnt2*, *Gata4*, *Nppb*, *Nppa* **d** progenitor: *Kit*, *Isl1*, *Kdr*, *Pdgfra*, *Nkx2.5* **e** *Axin2*, *Alcam*, *Cyp26a1*, *Cyp26c1*, *Aldh1a2*. Data are presented as mean + SEM ($n = 3$)

exon of the mouse *Myl2* locus. Additionally, a donor plasmid for in-frame integration of an eGFP-PGK-Puro cassette was generated (Fig. 2a). After transfection with TALEN-encoding and donor plasmids, clones with an integration event were purified via puromycin selection, and correctly targeted mESC clones were identified by junction PCR (Supplementary Fig. S2a). Selected clones with undifferentiated morphology were used for further experiments. Upon spontaneous differentiation in hanging drops, *Myl2*-eGFP expression was observed at D9–D10 of differentiation in areas with spontaneous beating. A single clone was selected for further targeting, hereafter referred to as *Myl2*^{eGFP/w}.

To our knowledge, no gene has been described which has expression only in mouse atrial cardiomyocytes during both embryonic and adult stages. Our qRT-PCR analysis of embryonic hearts also failed to identify endogenous markers of atrial cardiomyocytes not expressed in other mammalian cell types. We thus selected the atrial-specific enhancer/proximal promoter of the quail slow myosin heavy chain (*SMyHC3*), previously shown to mark atrial cells during all developmental stages and adulthood (Xavier-Neto

et al. 1999). A construct was assembled in which the *SMyHC3* promoter drives the fluorescent protein TdTomato (*SMyHC3*-TdT-PGK-Neo) (Fig. 2a). After transfection and antibiotic selection with G418, stably transfected clones were identified by PCR (Supplementary Fig. S2b). A total of ten clones were differentiated in hanging drops, and one mESC clone was selected for further experiments, based on cardiomyocyte differentiation capacity and expression of both eGFP and TdTomato detectable by fluorescent microscopy and flow cytometry (Fig. 2b, c). For simplicity, these markers are hereafter referred to as venGFP (ventricular, anterior) and atrRFP (atrial, posterior). Immunocytochemistry of dual reporter mESCs indicates expression of the Oct-4 protein, a pluripotency marker, as well as characteristic pluripotency morphology, further confirming that dual reporter mESCs represent cells in the pluripotent state (Supplementary Fig. S3). Importantly, differentiated venGFP and atrRFP cardiomyocytes also expressed sarcomeric proteins myosin heavy chain (*Mhc*/MF20) and α -actinin, indicating the overlap of reporter expression with the contractile phenotype in vitro (Supplementary Fig. S4a–b). Live cell

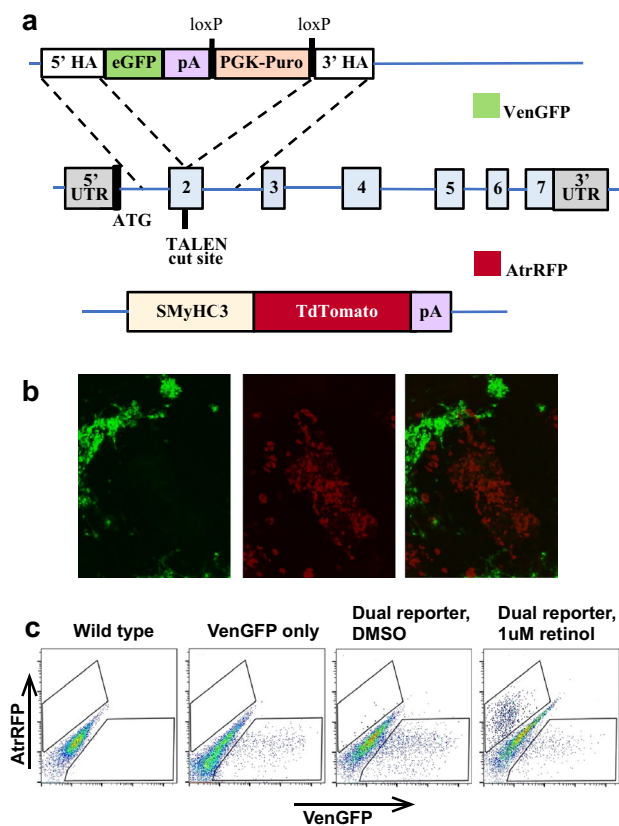


Fig. 2 Generation of reporter mESC line. **a** Targeting strategy for generation of TALEN-mediated knock-in at the ventricle-specific Myl2 locus and random integration of atrial-specific SMYHC3-TdTomato into mESCs. **b** Fluorescent expression of ventricular and atrial reporters upon spontaneous differentiation to cardiomyocytes, $\times 10$ magnification. **c** Representative flow cytometry analysis of wild-type, Myl2eGFP/w, and dual reporter mESCs upon directed differentiation to cardiomyocytes and retinoid treatment

imaging also revealed the presence of venGFP and atrRFP expression in spontaneously beating, differentiated cardiomyocytes (Supplementary Fig. S5). These suggest the utility of reporter expression as an endpoint for assays which have previously used the detection of spontaneously beating cells.

Embryonic expression of venGFP and atrRFP in reporter mESC-derived embryos

To confirm the correct expression of fluorescent reporters in the developing embryo, chimeric embryos were generated via laser-assisted morula injection of dual reporter mESCs. Embryos were dissected during early stages of cardiac development from stages spanning the formation of the cardiac crescent to the fully looped heart. Reporter embryos are apparent in Fig. 3a–l. We observed robust venGFP expression at the cardiac crescent stage (E7.5) (Fig. 3a), pointing to reporter expression prior to the formation of the linear heart tube. Myl2 is known to be expressed when the lateral plate

mesoderm forms into the linear tube and marks the primitive ventricle (future left ventricle), but we have observed venGFP expression from the midline towards the distal ends of the cardiac crescent but not in the distal portion that will give rise to other fragments of the heart (Fig. 3a, b). atrRFP expression was not observed in this stage. In E8.25 embryos, we observed venGFP expression in the first beating chamber of the primitive ventricle (also reported by previous studies) and atrRFP expression in the forming venous pole region and the myocardial sinus horns of the embryonic heart (Fig. 3c, d). In E8.5 embryos, we observed venGFP at the primitive left ventricle, and atrRFP in the primitive, common atrium at the junction of the primitive ventricle and inflow region (Fig. 3e, f). In the rightward looping heart (E8.75), venGFP expression was observed in the future left ventricle (Fig. 3g, h). Interestingly, the future atrioventricular canal was marked by double positive cells, and atrRFP signal alone was visible in the sinus venosus region (Fig. 3g, h). In the E9.5 embryo, robust atrial and ventricular expression were observed (Fig. 3i–l). Collectively, we observed venGFP in the forming left ventricle, atrioventricular canal, and right ventricle/outflow tract. Moreover, we recorded atrRFP expression on the forming left and the right sides of the common atria at the junction of the dorsal aorta and atrioventricular canal. Our results mirror published reports of the expression of venGFP (Myl2-eGFP) and atrRFP (SMYHC3), confirming our fluorescent reporter expression is specific to atrial and ventricular regions during the earliest stages of cardiogenesis (O'Brien et al. 1993; Xavier-Neto et al. 1999). However, in contrast to previous studies, the use of a fluorescent reporter shows detail at the cellular level, in addition to a dynamic range of expression. Importantly, the onset and duration of fluorescent reporter expression in reporter cell-derived hearts coincides with spontaneous beating in differentiated cardiomyocytes of the embryonic heart. Furthermore, the ability of reporter mESCs to contribute to all embryonic structures and specifically express fluorescent reporters only in the heart is strong *in vivo* evidence for both pluripotency of reporter mESCs and specificity of reporter expression.

Gene expression dynamics during spontaneous differentiation of reporter mESCs

To gauge the suitability of *in vitro* differentiation of reporter mESCs to cardiac chamber development, we conducted gene expression analyses of differentiating cells at three time points: D6 (before the onset of spontaneously beating cells), D9 (first appearance of small numbers of spontaneously beating cells), and D12 (large numbers of beating clusters of cells) (Fig. 4a). Gene expression of ventricular, atrial, and pan-cardiac cardiomyocyte markers increased progressively from

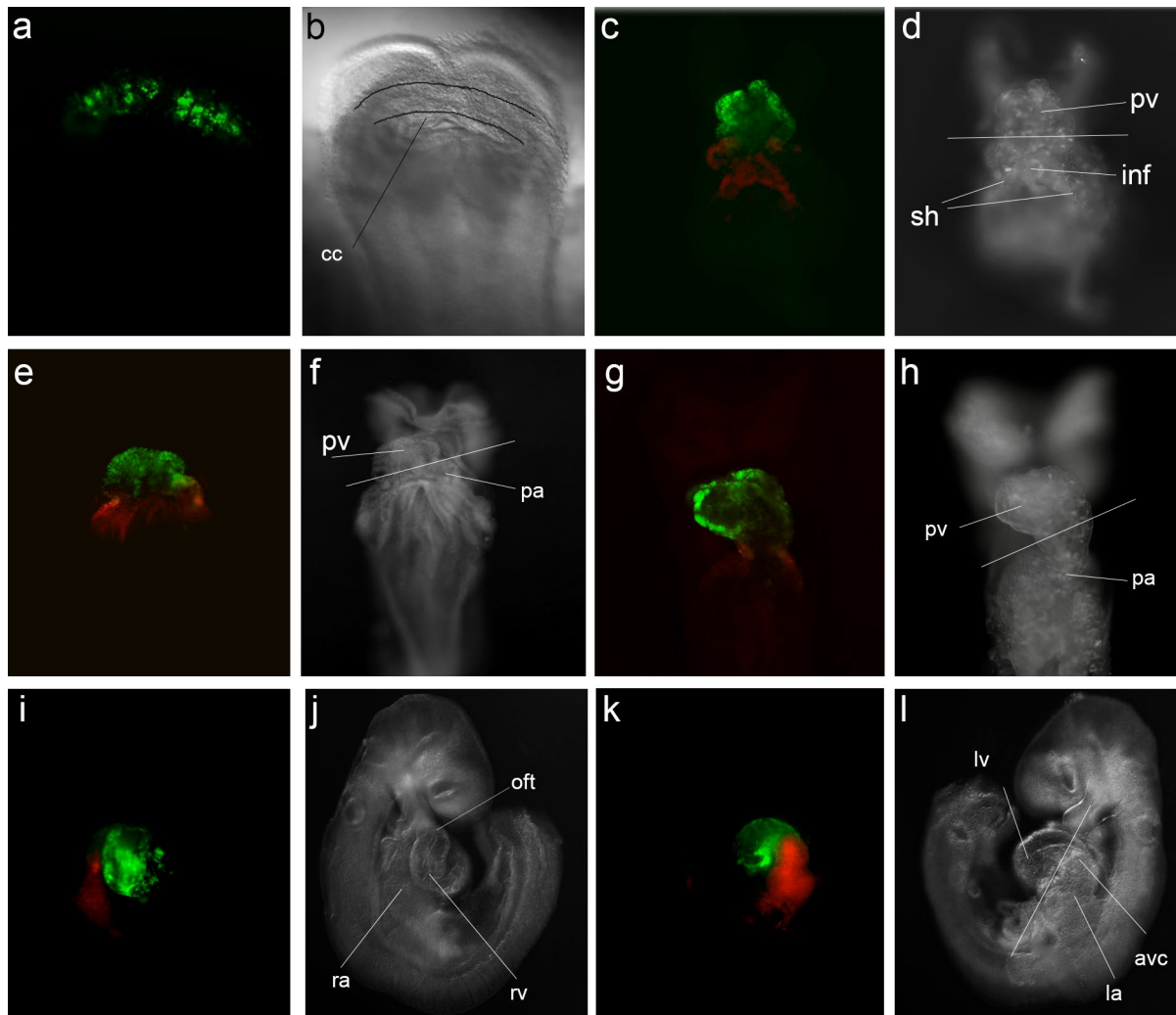


Fig. 3 Anatomical localization of fluorescent reporter expression in chimeric embryos. **a, b** E7.5 embryo, venGFP (Myl2, green) expression in the cardiac crescent, bright field image showing cardiac crescent (cc) which will form the primitive ventricle (pv) of the linear heart tube, which is depicted by black lines. **c, d** E8.25 embryo, venGFP expression in the primitive ventricle, atrRFP (red) in the inflow region of the linear heart tube, bright field image showing sinus horns (sh), inflow region (inf) of the linear heart tube which together makes the venous pole of the heart and primitive ventricle. The horizontal line depicts the axis of the embryo prior to looping. **e, f** E8.5 embryo, venGFP expression in the primitive ventricle/future left ventricle, atrRFP expression in the inflow region of the developing heart and developing primitive atrium (pa) observed by a small

ballooning at the junction of the horizontal line which is angled by the starting of looping. **g, h** E8.75 embryo, the horizontal line shows advancement of looping observed by the elliptic right side of the primitive ventricle and the left side of the primitive left ventricle which connects to the primitive atrium. **i, j** E9.5 embryo, right side, advancement of the looping outflow tract (oft)/ right ventricle (rv) showing venGFP expression and the left part of the common atria (ra) showing atrRFP expression. **k, l** E9.5 embryo, right side, venGFP expression in left ventricle (lv), atrRFP expression in the left part of the common atria (la) and in the connection of the left ventricle, left atria. Red–green regions (orange) in the atrioventricular canal (AVC) regions are visible (color figure online)

D6–D12, in line with spontaneous beating observations (Fig. 4b–e). Similar expression dynamics were observed for smooth muscle (Myh11) and fibroblast (Thy1, Vim, Acta2) markers, suggesting that differentiation of these cell types occurs simultaneously with cardiomyocyte differentiation (Supplementary Fig. S6). Multipotent, cardiac progenitor markers (Kit, Isl1, Kdr, Pdgfra, Nkx2-5) were also observed, with highest expression levels at day

9 (Fig. 4d). Early mesodermal marker (Brachyury) was more strongly expressed at D6 of differentiation, suggesting that D6–D12 of differentiation covers both early and late mesodermal progenitor stages (Fig. 4d). Wnt targets (Axin2, Alcam) and retinoic acid components (Aldh1a2, Cyp26a1, Cyp26c1) were also expressed during the D6–D12 window (Fig. 4f). Interestingly, canonical Wnt

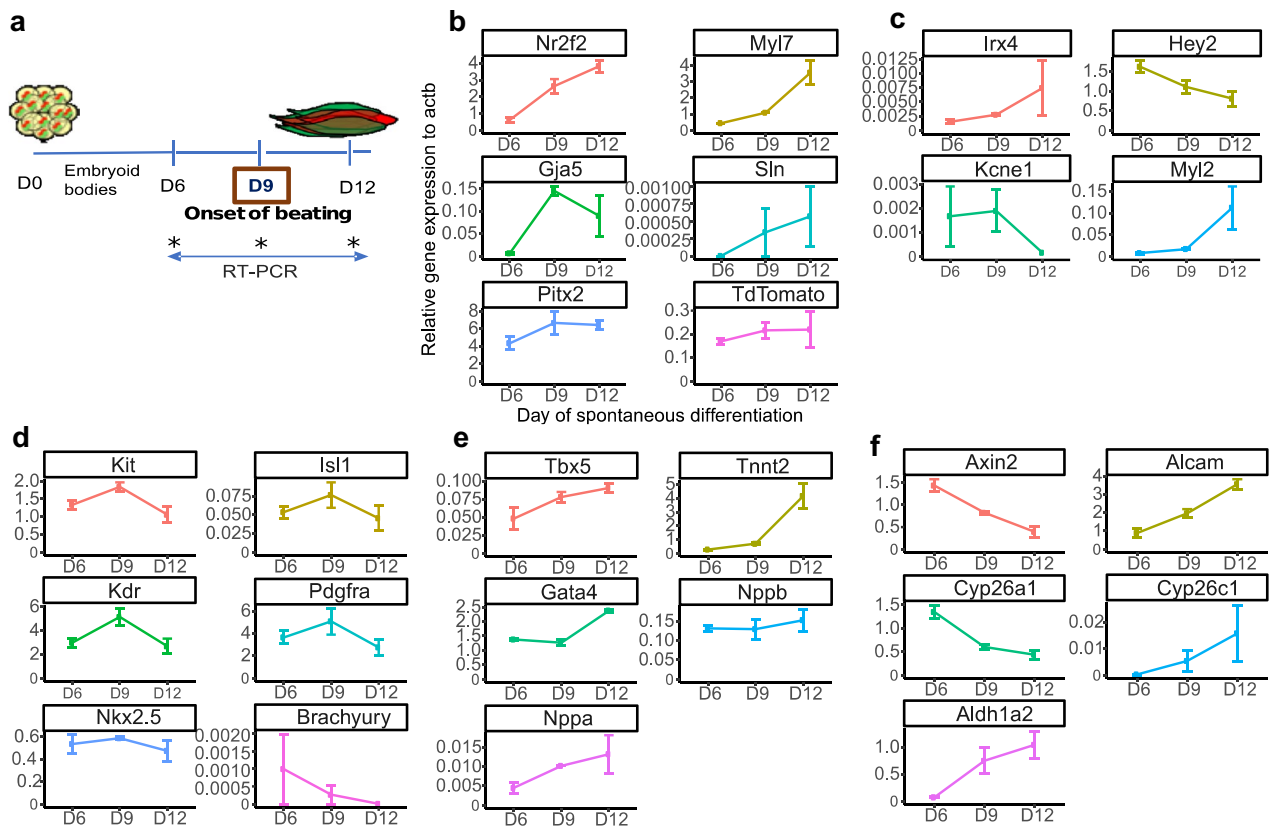


Fig. 4 qRT-PCR profiling of spontaneous differentiation in reporter mESCs. **a** Differentiation schematic for sampling at D6, D9, and D12 of differentiation for detection of markers of **b** atria: Nr2f2, Myl7, Gja5, Sln, Pitx2, TdTomato **c** ventricles: Irx4, Hey2, Kcne1,

Myl2 **d** progenitor cells: Kit, Isl1, Kdr, Pdgfra, Nkx2.5, Brachyury **e** pan-cardiac: Tbx5, Tnnt2, Gata4, Nppb, Nppa **f** signaling pathways: Axin2, Alcam, Cyp26a1, Cyp26c1, Aldh1a2. Data are presented as mean \pm SEM for each time point ($n=3$)

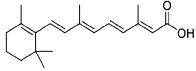
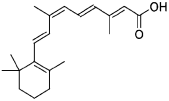
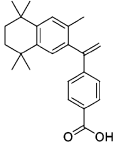
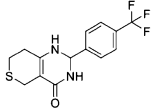
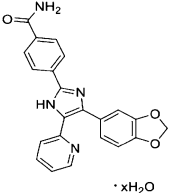
(Axin2) and non-canonical Wnt (Alcam) displayed inverse temporal expression, in line with previous observations that non-canonical Wnt replaces canonical Wnt during cardiomyocyte differentiation (Mazzotta et al. 2016). Retinoid degrading enzymes Cyp26a1 and Cyp26c1 also showed inverse temporal expression, as Cyp26c1 replaced Cyp26a1 during D6–D12 differentiation (Fig. 4f). To our knowledge, this has not been described previously, and has potential implications for teratogenic effects of retinoid treatment. Endogenous retinoic acid signaling (Aldh1a2) was nearly absent at D6 of differentiation, and increased at D9 and D12 time points. As retinoic acid signaling is thought to be a principal component of anterior–posterior patterning of the heart (Xavier-Neto et al. 1999), this suggests that in the absence of exogenous retinoid treatment, in vitro retinoic acid patterning of multipotent cardiac progenitor cells occurs during D6–D12 spontaneous differentiation of reporter mESCs. Collectively, these results show that embryonic cardiac chamber differentiation genes are expressed during D6–D12 spontaneous differentiation

of mESCs, suggesting the suitability of the in vitro model for compound testing.

Stage-specific effects of retinoids on expression of anterior–posterior reporters during spontaneous differentiation of reporter mESCs

To assess the functionality of a dual reporter differentiation assay, we tested commercially available retinoids with known teratogenic properties for effects on fluorescent reporter expression (Table 2). Initial experiments showed that D2–D10 addition of high concentrations of all-trans retinoic acid (10 μ M) completely eliminates the cardiac lineage and expression of both venGFP and atrRFP. As our aim was to detect more subtle defects in patterning, we selected shorter time windows and smaller doses for our experiments based on the appearance of spontaneous beating, venGFP/atrRFP expression, and temporal gene expression analysis. Time points for compound addition were selected shortly before (D6–D9) and after the appearance of beating cardiomyocytes (D9–D12). As the linear heart tube of E8 embryos

Table 2 Summary of the compounds tested in differentiation assays

Compound	Abbr ev-iation	Drug	Structure	Molecular target	Assays	Concentrat ions (μM)	References	Supplier
all-trans retinoic acid	ATRA	Tretinoin		ligand for RXR and RAR	Spontaneous and directed	0.1, 1, 10	Van Dorp et al., 1946	Sigma-Aldrich
9-cis-retinoic acid	9CRA	Alitretinoin		ligand for RXR and RAR	Spontaneous	0.1, 1, 10	Levin et al., 1992	Sigma-Aldrich
Bexarotene	BX	Targretin		Selective RXR ligand	Spontaneous	0.1, 1, 10	Gottardis et al., 1996	Sigma-Aldrich
XAV939	XAV	Pre-clinical		Tankyrase inhibitor (inhibits canonical wnt)	Directed	3, 10	Huang et al., 2009	Sigma-Aldrich
SB 431542 hydrate	SB	Pre-clinical		ALK receptor inhibitors (inhibits TGFbeta pathway)	Directed	3, 10	Inman et al., 2002	Sigma-Aldrich

beat robustly, we estimate these earliest myocytes roughly approximate E8–E10 hearts.

Results of differentiation experiments are shown in Fig. 5. Regardless of compound treatment window, cultures were measured on D12 of differentiation for %venGFP and %atrRFP cells, mean fluorescent intensity (MFI) of venGFP and atrRFP, and atrRFP/venGFP ratio. Both anterior and posterior cell populations were strikingly sensitive to retinoid treatment during early time windows. A significant decrease in the %venGFP cells was observed for D6–D9 treatment with ATRA (1 μM and 10 μM) and 9CRA (0.1 μM, 1 μM, 10 μM), but not by BX (Fig. 5a). A decrease in venGFP-MFI was observed during D6–D9 treatment with ATRA (1 μM, 10 μM), 9CRA (1 μM, 10 μM), and BX (1 μM, 10 μM) (Fig. 5b). Similar to D6–D9 treatment, a decrease in %venGFP + cells was induced by D9–D12 treatment with ATRA (1 μM, 10 μM) and 9CRA (1 μM, 10 μM), but not by BX (Fig. 5a). The venGFP-MFI showed an increase in venGFP levels with high levels of 9CRA (10 μM) and BX (10 μM) during D9–D12 treatment. These results clearly show the stage-specific effects of retinoids on fluorescent reporter expression.

Expression of the atrRFP reporter was also affected by retinoids (Fig. 5c, d). We observed a statistically significant

decrease in %atrRFP cells upon D6–D9 treatment with ATRA (1 μM, 10 μM) and 9CRA (1 μM), but no statistically significant effects from BX treatment. atrRFP-MFI decreased upon D6–D9 treatment with ATRA (0.1 μM, 1 μM, 10 μM) and 9CRA (1 μM, 10 μM), but was unaffected by BX treatment. A decrease in %atrRFP cells was observed in D9–D12 treatment with ATRA (1 μM), while a decrease in atrRFP-MFI during D9–D12 treatment was observed for ATRA (0.1 μM, 1 μM, 10 μM) and 9CRA (10 μM). Non-statistically significant increases in %atrRFP+ cells were observed for early (D6–D9) 9CRA (0.1 μM) and BX treatment (0.1 μM, 1 μM), as well as late (D9–D12) 9CRA (0.1 μM) and BX treatment (0.1 μM).

The effects of atrialization of the total cardiac progenitor pool by retinoids were explored via quantification of atrial/ventricular ratio and atrRFP/venGFP-MFI ratio (Fig. 5e, f). Increases in atrial/ventricular ratio were observed for nearly all retinoids at early time points D6–D9, though only ATRA (0.1 μM) was statistically significant. This suggests that the atrializing potential of ATRA exists prior to the onset of spontaneous beating, as observed previously (Lee et al. 2017). atrRFP-MFI/venGFP-MFI levels were increased at early time points

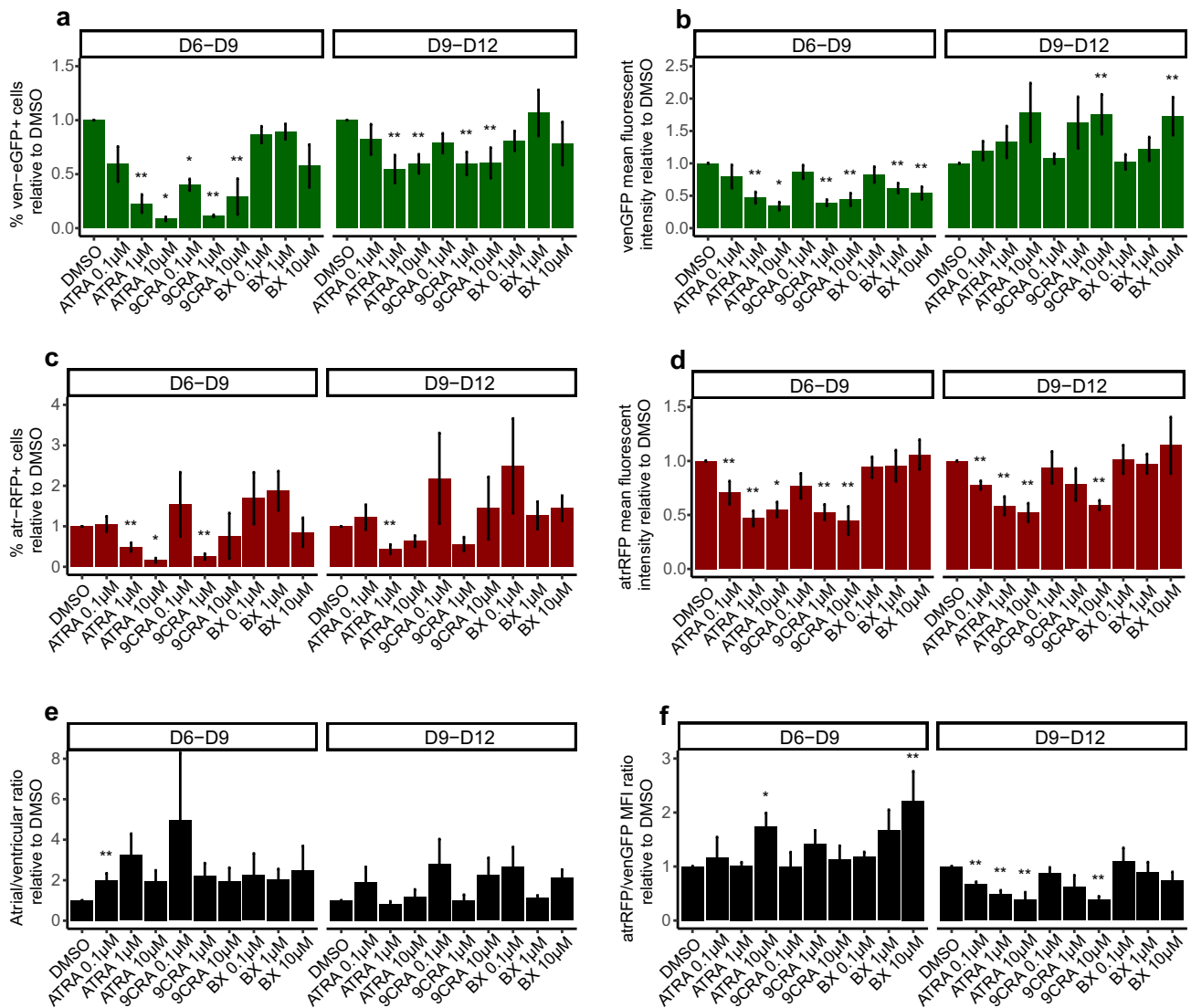


Fig. 5 Effects of retinoids on reporter expression during spontaneous differentiation of reporter mESCs. D12 measurements of **a** %venGFP+ cells **b** venGFP-mean fluorescent intensity **c** %atrRFP+ cells **d** atrRFP-mean fluorescent intensity **e**

f atrRFP-MFI/venGFP-MFI. Fluorescence activity was normalized to DMSO and is presented as mean \pm SEM ($n=5$). ** $P < 0.01$, * $P < 0.05$ (Wilcoxon test vs DMSO control)

D6–D9 by ATRA (10 μ M) and BX (10 μ M), but decreased at later time points by ATRA (0.1 μ M, 1 μ M, 10 μ M) and 9CRA (10 μ M). Collectively, these results indicate increased severity of cardiovascular developmental toxicity from dual RAR/RXR agonists (ATRA, 9CRA) than RXR agonists (BX). These results also confirm the complex time and spatial characteristics of retinoic acid signaling during cardiogenesis, and indicate this can be partially recapitulated in vitro with reporter cell lines using a spontaneous differentiation model. Interestingly, these results mirror the time-dependent effects of retinoid acid signaling in the zebrafish model (Keegan et al. 2005).

Chemical modulation of retinoic acid, Wnt, and TGF β pathways in high-throughput ventricular differentiation

To assess the feasibility of a high-throughput differentiation assay (384-well format), we developed a protocol for generation of a large number of cardiac progenitors in chemically defined conditions. We modified a widely used protocol requiring serial dissociation of EBs and treatment with BMP4/activin A to generate large enough number of multipotent cardiac progenitors for efficient toxicological screening (Kattman et al. 2011). The most significant modification was plating mesodermal progenitors (D4 differentiation) to

ultra-low attachment plates instead of to adherent conditions, allowing the generation of a large number of D5 multipotent cardiac progenitors (~20 million). These were plated to 384-well plates for total fluorescence analysis on D10 of differentiation. Total fluorescence of venGFP could be measured, but not atrRFP, likely reflecting the difference in strength of these two promoters, the preferential induction of ventricular cardiomyocytes via the protocol, and the reduced sensitivity of the plate reader format compared to flow cytometry. Indeed, flow cytometric analysis from cells differentiated via this protocol generated a strong preference for cells of the ventricular lineage (Supplementary Fig. S7). This is also in line with a recent study which found the necessity of titrating BMP4/activin A-induced mesodermal specification to generate cells capable of differentiation to the atrial lineage (Lee et al. 2017).

Spontaneous beating occurs at D7 in this assay and was used as a reference point for compound addition points. Importantly, venGFP cells beat robustly in cell sheets in the 384-well format, and the abundance of beating correlates qualitatively with the amount of venGFP cells. In conditions with highly efficient differentiation, the cells beat synchronously in a unified cell sheet. Compounds modulating retinoic acid (ATRA), TGF- β (SB431542), and Wnt (XAV939) signaling pathways were tested in this assay system during two windows, one in which compounds are added before the onset of beating (D6–D8), and one in which compounds

are added after the onset of beating (D7–D9) (Fig. 6a). D6 cells also express the multipotent cardiac progenitor marker Isl1, confirming their undifferentiated, progenitor state (Fig. 6b). Early addition (D6–D8) of ATRA caused a decrease in venGFP fluorescence, whereas late addition resulted in an increase in venGFP fluorescence (D7–D9) (Fig. 6c, d). This suggests biphasic effects of retinoic acid signaling on late progenitor specification to ventricular cardiomyocytes. Inhibition of both Tgf- β (SB431542) and canonical Wnt (XAV939) increased venGFP fluorescence when added prior to spontaneous beating, but showed no statistically significant effects when added after the onset of beating (Fig. 6c, d). This also suggests divergent roles for these pathways in multipotent cardiac progenitors and differentiated cardiomyocytes. Overall, these results indicate the potential for detection of stage-specific differentiation modulation of chamber-specific cardiomyocytes in a high-throughput system. Additionally, they further confirm that the *in vitro* commitment of cells to anterior–posterior lineages largely occurs before the onset of spontaneous beating.

Discussion

To facilitate the detection of teratogens which are deleterious to fetal health, we developed an *in vitro* model based on the anterior–posterior patterning of the early heart. Using

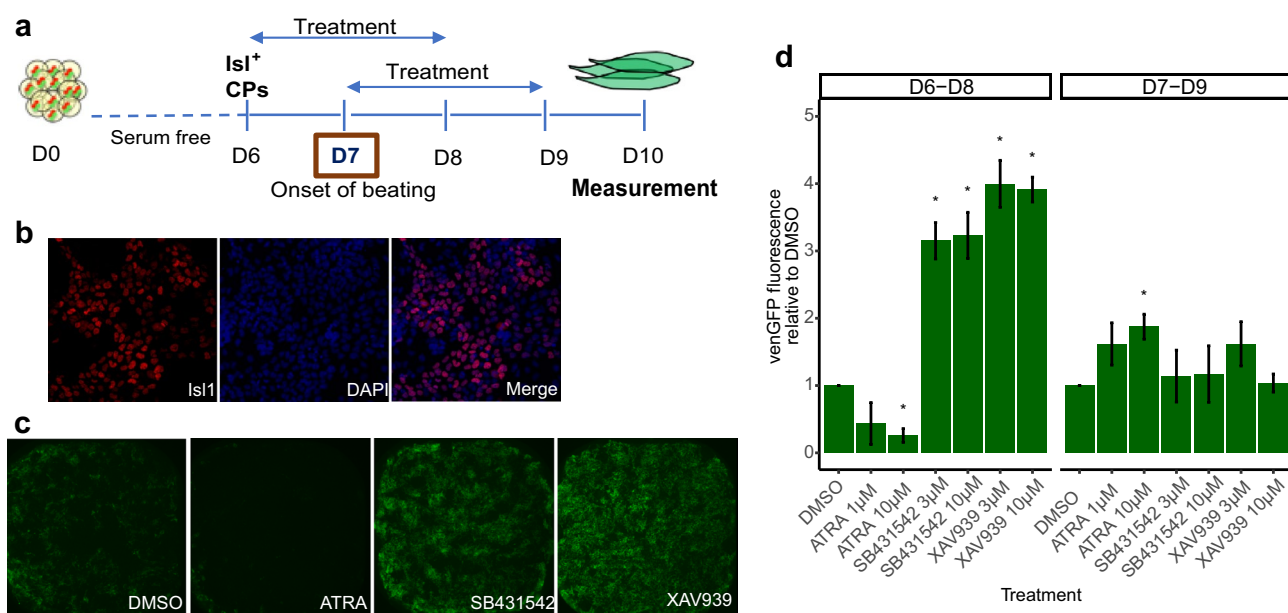


Fig. 6. 384-well plate screening in reporter mESCs in serum-free conditions. **a** Schematic of serum-free differentiation system for high-throughput screening. **b** Immunocytochemistry of cardiac progenitor marker Isl1 on D6 of the differentiation protocol, $\times 40$ magnification. **c** Representative wells of compound treatment showing effects of compounds on Myl2 promoter activation upon D6–D8 treatment,

$\times 5$ magnification. **d** D10 total fluorescence measurements of venGFP upon treatment either before (D6–D8) or after (D7–D9) the onset of beating. Fluorescence activity was normalized to DMSO and is presented as mean \pm SEM ($n=4$). ** $P < 0.01$, * $P < 0.05$ (Wilcoxon test vs DMSO control)

qRT-PCR analysis of early four-chambered hearts, we have identified suitable markers for genome modification and gained insight into the spatially distinct cell composition of the embryonic heart. TALEN-mediated genome editing was used to generate a dual reporter mESC line for more efficient detection of differentiated lineages, and expression of reporter alleles was observed in chimeric embryos and during both spontaneous and directed differentiation of mESCs at the onset of spontaneous beating. To our knowledge, this is the first reporter cell line in the mammalian system including markers for both anterior and posterior cardiac lineages simultaneously. Furthermore, the reporter system described here presents an alternative readout to the counting of beating clusters currently used as part of the EST, and allows for adaptation to high-throughput screening for developmental toxicity.

Using our reporter system, we delineated the windows of action of a panel of retinoids, demonstrating their effects on the induction of expression of anterior–posterior markers *in vitro*. Retinoic acid is a potent teratogen, and in humans principally causes malformation of the heart, nervous system, and craniofacial tissues (Lammer et al. 1985). In zebrafish and mouse models, retinoic acid signaling has been implicated in both limiting the number of cardiac progenitors in the cardiac crescent and patterning progenitors into anterior–posterior compartments (Keegan et al. 2005; Ryckebusch et al. 2008; Xavier-Neto et al. 1999). Our *in vitro* results also reflect biphasic retinoid acid signaling, as we observed both inhibition and promotion of anterior–posterior lineages which were dependent upon the time of treatment (D6–D9 vs D9–12). These results suggest lineage commitment of cells to anterior–posterior fates precedes the onset of beating, and this coincides with replacement of retinoic acid-degrading enzyme Cyp26a1 with Cyp26c1. To our knowledge, this has not been described previously, and has potential implications for teratogenic effects of retinoid treatment. We also observed that low concentrations of retinoic acid administered before the onset of beating preferentially inhibited the ventricular lineage but did not affect the atrial lineage, mirroring the atrialization seen in zebrafish models (Keegan et al. 2005).

For large-scale toxicological screening, detection of reporter alleles with a high-throughput plate reader would be desirable. In the present study, we adapted a directed differentiation protocol to a high-throughput, 384-well plate format. We utilized a directed differentiation protocol in chemically defined medium to generate cardiac progenitor populations suitable for fluorescent protein detection. This screening system was capable of detecting expression from the *venGFP* (*Myl2*), but not *atrRFP* (*SMyHC3*) promoters, and this can be partially explained by differences in the strength of these promoters in the mouse system. Re-engineering of reporter alleles to express the more easily

detectable luciferase instead of fluorescent proteins might resolve this issue. Additionally, the directed differentiation system we employed mostly produces cardiomyocytes of the ventricular lineage (Lee et al. 2017). Further optimization of our directed differentiation protocol to Cyp26a1+ and Cyp26a1– mesoderm would likely be necessary to achieve detection of the *SMyHC3* promoter in a high-throughput format (Lee et al. 2017). However, the screening system we employed was successful in detecting the effects of Wnt, TGF- β , and retinoid signaling pathway alteration on differentiation to the ventricular lineage.

Though developmental toxicity was the aim of this study, aberrant expression of atrial/ventricular identity genes might also predict physiological defects arising from developmental exposure to teratogens. Ventricular upregulation of the *SMyHC3* transgene during embryogenesis was shown to precede adult-onset pathological hypertrophy upon deletion of the transcription factor *Irx4* in the murine model (Bruneau et al. 2001). Perturbed Wnt signaling during development can also lead to chamber-specific arrhythmias in adulthood due to underlying defects in chamber-specific gene expression (Li et al. 2018). These effects are overlooked by the existing EST, and cannot be feasibly routinely tested *in vivo*, as pups from pregnant mothers in embryonic toxicity studies would necessarily be brought to term and subjected to ECG and telemetry recordings. Our assays, which use chamber-specific gene expression as a readout of differentiation, could potentially uncover subtle developmental toxicity which results in adult disease due to altered chamber-specific gene expression.

Teratogenic activities have not been determined in humans/human cell models for more than 90% of drugs, and rodent studies may not always be predictive (van Gelder et al. 2010). Though the present study was conducted in mESCs, in line with previous iterations of the EST, a clear goal would be to develop a reliable system in human embryonic stem cells (hESCs)/human-induced pluripotent stem cells (hiPSCs). One limitation is that there is no feasible method of validating transgene expression in human embryos, in contrast to transgenic mouse methods in which chimeric embryos show a clear overlap of anatomical expression, as in the current study. Other barriers to establishment of hiPSC methods include the ethical issues surrounding hESCs, and the oncogenic mutations known to exist in most hiPSC lines (Merkle et al. 2017). mESC models based on transgenic lines thus still hold advantages in terms of cost, validation, and the existence of well-characterized reporter alleles (Kugler et al. 2016a, b).

In the present study, only a small set of compounds in a small number of time windows were tested. Future efforts must focus on testing a larger set of well-characterized reference compounds for their effects on anterior–posterior patterning in shorter time windows. As some non-familial

CHD cases could be due to non-medical exposure to environmental pollutants and industrial byproducts, these could also be tested for safety windows in low-cost, high-throughput differentiation assays (Ou et al. 2017). Additionally, the same time windows presented here could be tested in other reporter lines which have been developed for toxicological assessment, such as a recently described Wnt/B-catenin reporter (Kugler et al. 2016a, b).

As the heart is the first organ to form, and its development includes most key developmental signaling pathways, interruption of cardiac differentiation *in vitro* might not only reflect interference with *in vivo* cardiogenesis, but could also be predictive of a general disruption of *in vivo* organogenesis. Indeed, defects in the patterning of the heart might be predictive of defects in patterning of limbs and craniofacial tissue, as significant overlap exists in those developmental programs (Diogo et al. 2015). Thus, by developing adequately validated, step-wise cardiac differentiation assays, the need for conducting differentiation assays to other lineages (endodermal, ectodermal) could be eliminated. We also envision such stage-specific analyses of different reporter alleles in the context of cardiac differentiation of mESCs will allow the study of previously misunderstood mechanisms of developmental toxicity. Mechanistic information gained from high-throughput assays could also aid in the identification of off-target effects early in the drug development process and an overall reduction in the congenital disease burden.

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Compliance with ethical standards

Conflict of interest The authors have no competing interests to disclose.

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