

Spatiotemporal application of small molecules in fracture healing

Hairu Sui^{1,2#}, Zhonglin Wu^{3#}, Ziqi Xiong^{1,2}, Hui Zhang^{1,2,4}, Boon Chin Heng⁵, and Jing Zhou^{1,2,6*}

ABSTRACT

Skeletal injuries and disorders are major causes of physical disability worldwide, posing an intractable clinical challenge. Within the field of regenerative medicine, researchers are continuously developing new therapeutic strategies to promote bone regeneration. Small molecules, defined as bioactive compounds with a molecular weight of <1,000 Da, have emerged as promising agents capable of precisely regulating intracellular signaling pathways to enhance bone regeneration. Their cost-effectiveness, superior membrane permeability, and minimal immunogenicity have positioned them at the forefront of both fundamental research and clinical applications. In recent years, advancements in artificial intelligence have accelerated the development and screening of small-molecule drugs, broadening their potential therapeutic applications. Furthermore, innovations in dynamic drug delivery systems have advanced the concept of spatial precision, enabling the controlled release of drug doses over time and achieving the spatiotemporal application of small molecules. These systems release specific small molecules in a sequence, synchronizing therapeutic interventions with the dynamic process of bone healing. Spatiotemporal delivery strategies, which effectively replicate the complex and highly ordered processes of bone healing, have the potential to reduce drug side effects and enhance healing efficacy. However, clinical translation remains hindered by insufficient spatiotemporal control and limited pharmacokinetic precision, challenges that this review explores in depth. We systematically examine stage-specific molecular targets of signaling pathways and their corresponding small molecule modulators. In addition, we discuss current approaches to spatiotemporal delivery strategies, such as stimuli-responsive delivery systems. Finally, we explore the status of clinical applications, the challenges encountered, and potential solutions regarding the spatiotemporal release strategy. We hope this review will contribute to the development of future spatiotemporal delivery strategies, ultimately improving outcomes for patients with impaired fracture healing.

#Authors contributed equally.

*Corresponding author:

Jing Zhou,

(zhoujing@zju.edu.cn)

How to cite this article:

Sui H, Wu Z, Xiong Z, Zhang H, Heng BC, Zhou J. Spatiotemporal application of small molecules in fracture healing. *Biomater Transl*. 2025, 6(4), 416-436.

doi: [10.1233/bmt.24.00087](https://doi.org/10.1233/bmt.24.00087)



Keywords:

Bone regeneration; Fracture healing; Sequential application; Signaling pathways; Small molecules; Spatiotemporal strategy

1. Introduction

With the global population aging rapidly, the incidence of fracture has surged, adversely impacting quality of life and burdening healthcare systems. Although bone possesses a unique regenerative capacity, studies indicate that non-union or delayed union fractures occur in approximately 5% – 10% of cases.¹ In the realm of regeneration medicine, growth factors have been employed to activate osteogenic pathways, but their

efficacy is inconsistent, and safety concerns persist.² For example, food and drug administration (FDA)-approved recombinant bone morphogenetic proteins (BMPs) have adverse effects, including inflammation, immunogenicity, excessive bone growth, and severe cervical swelling.^{3,4}

Small molecule drugs are alternatives to growth factors and promising candidates for bone regeneration. These compounds, characterized by molecular weights below 1 kDa, can penetrate cell

membranes and activate osteogenic signaling pathways.⁵ Compared with growth factors, small molecules offer several advantages, including lower immunogenicity, cost-effective production, and a reduced risk of cross-species contamination. Furthermore, advancements in artificial intelligence (AI) have revolutionized the drug discovery process, reducing costs, expanding therapeutic options, and improving drug efficacy, thereby demonstrating the broad prospects of small molecule drugs.

Recent advances in drug delivery systems have revolutionized fracture treatment paradigms. The current delivery technologies enable spatially precise drug release, allowing targeted delivery of small-molecule drugs to specific organs. However, spatial precision alone is insufficient, as it does not adapt to the dynamic changes in the healing environment. Therefore, efforts are now focused on achieving spatiotemporal precision, combining spatial control with stage-specific drug release. For instance, the rapid release of simvastatin (SIM) during the inflammatory phase enhances stem cell recruitment, followed by sustained pargyline (PGL) release to drive osteogenic differentiation, significantly improving bone formation compared to simultaneous administration.⁶ Moreover, traditional long-term, high-dose regimens often result in adverse effects. In contrast, precisely timed small-molecule release at specific healing stages enables short-term treatments that minimize side effects while maximizing therapeutic efficacy.

Despite these promising advances, critical gaps persist. The current delivery systems predominantly enable concurrent rather than sequential drug release, with inadequate precision in spatiotemporal control and pharmacokinetic modulation. A thorough understanding of stage-specific small molecules and the development of systems enabling sequential drug delivery are essential for optimizing outcomes – an issue that this review explores in depth. We begin by introducing phase-specific therapeutic molecules involved in key signaling pathways during the healing process. We then critically evaluate current spatiotemporal delivery platforms, discussing their clinical translation, associated challenges, and potential solutions. Finally, we explore strategies for screening small molecule drugs and the role of AI in facilitating this process. We hope this review will serve as a foundation for the development of future spatiotemporal strategies and ultimately promote the treatment of fracture healing in clinical practice.

2. Retrieval strategy

To identify small molecules promoting fracture healing, we conducted a PubMed search using the keywords: (“fracture healing”) OR (“bone regeneration”) OR (“bone formation”))

AND (“small molecule”). For temporal strategies in promoting fracture healing, we used the keywords: ((“fracture healing”) OR (“bone regeneration”) OR (“bone formation”)) AND ((“temporal”) OR (“sequential”)) AND (“drug”). We excluded studies from Q3 and Q4 journals, selecting publications from the past 5 years, and manually reviewed the articles to ensure their relevance to the field.

3. Stages of fracture healing and corresponding signaling pathways

Fracture healing is an intricately coordinated process, comprising three partially overlapping phases: inflammation, renewal, and remodeling.^{7,8} We introduced each stage of fracture healing in chronological order, along with the corresponding signaling pathways that regulate each stage. Synergistic and antagonistic effects between signaling pathways were also discussed (Figure 1).

3.1. Inflammatory phase and corresponding signaling pathways

The inflammatory phase involves hematoma formation and the release of inflammatory mediators.^{9,10} Upon bone fracture, blood vessels rupture, leading to the activation of platelets and the formation of a hematoma. Neutrophils, acting as “first responders,” migrate to the injury site and recruit monocytes through the secretion of chemotactic mediators, the most important of which is tumor necrosis factor-alpha (TNF α). These cells also release inflammatory cytokines, triggering the mobilization of fibroblasts and progenitor cells from their respective secluded niches. The recruited cells contribute to new collagen production and hematoma cross-linking, facilitating the initial stages of bone healing.⁷

The inflammatory phase is driven by the TNF α pathway, which plays a dual role in fracture healing.¹¹ On one hand, TNF α can stimulate the migration of bone marrow mesenchymal stem cells (BMSCs) to the fracture site, promoting osteogenic differentiation and facilitating fracture repair.¹² On the other hand, activation of the TNF α pathway also triggers both nuclear factor kappa-B (NF- κ B) and mitogen-activated protein kinase (MAPK) signaling pathways, which inhibit Sma- and Mad-related protein (Smad) 1/5/8 signaling and suppress osteoblast differentiation.¹³ Furthermore, the TNF α pathway disrupts wingless-related integration site (Wnt)/ β -catenin signaling. A study showed that 24 h of TNF α treatment in BMSCs reduced β -catenin expression in both the cytoplasm and nucleus, inhibiting its recruitment to the promoters of key osteogenic transcription factors, Runt-related transcription factor 2 (*Runx2*) and Osterix.¹⁴

¹Department of Sports Medicine of the Second Affiliated Hospital, and Liangzhu Laboratory, Zhejiang University School of Medicine, Hangzhou, Zhejiang, China; ²Dr. Li Dak Sum Yip Yio Chin Center for Stem Cells and Regenerative Medicine, Zhejiang University School of Medicine, Hangzhou, Zhejiang, China;

³Key Laboratory of Integrated Oncology and Intelligent Medicine of Zhejiang Province, Department of Hepatobiliary and Pancreatic Surgery, Affiliated Hangzhou First People’s Hospital, Zhejiang University School of Medicine, Hangzhou, Zhejiang, China; ⁴Stomatology Hospital, School of Stomatology, Zhejiang University School of Medicine, Zhejiang Provincial Clinical Research Center for Oral Diseases, Hangzhou, Zhejiang, China; ⁵Department of Dental Materials Dental Medical Devices Testing Center, Peking University School and Hospital of Stomatology, Beijing, China; ⁶China Orthopedic Regenerative Medicine Group (CORMed), Hangzhou, Zhejiang, China

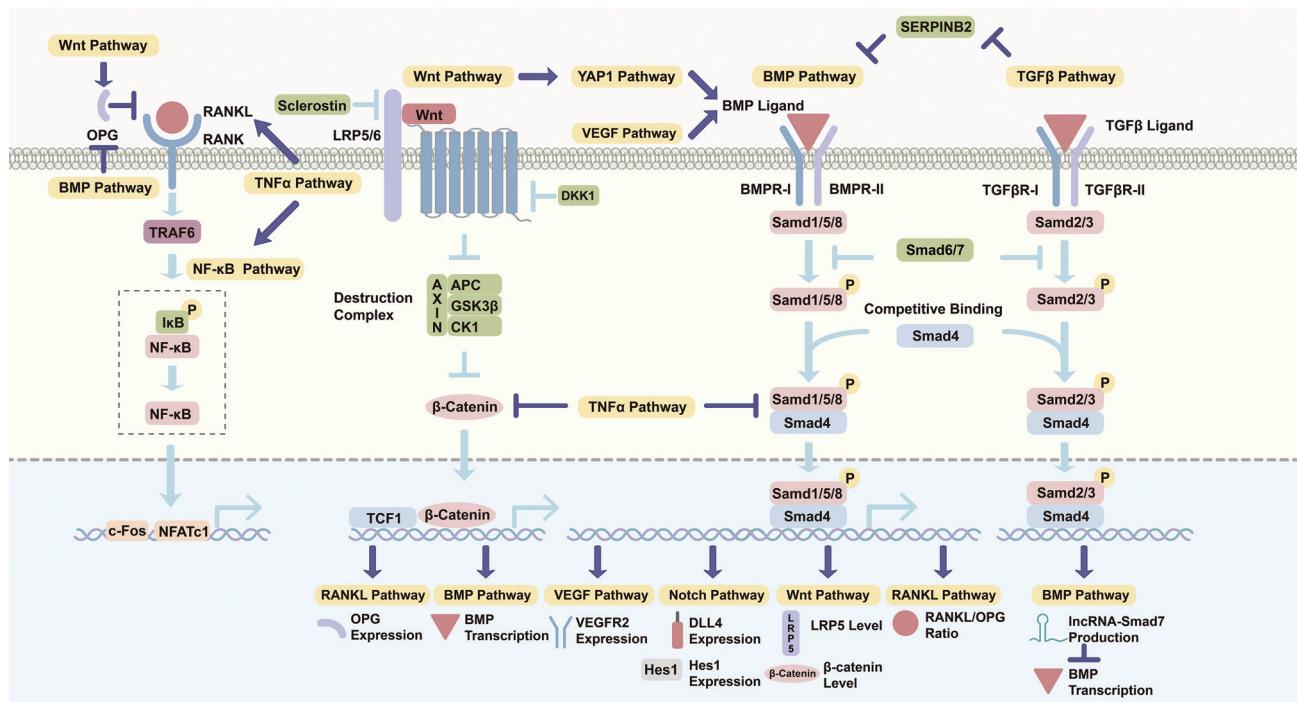


Figure 1. A simplified overview of the synergistic and antagonistic interactions between signaling pathways. BMP signaling promotes the expression of VEGFR2, regulates the expression of the Notch pathway ligands DLL4 and Hes1, increases the ratio of RANKL/OPG, and elevates the levels of Wnt receptors LRP5 and β -catenin. In contrast, BMP signaling antagonizes the TGF β pathway by competitively binding to Smad4, while TGF β signaling, in turn, can suppress BMP expression. Wnt signaling promotes BMP expression and inhibits the RANKL pathway by increasing OPG levels. In contrast, the inflammatory TNF α pathway suppresses Smad complex formation and reduces β -catenin levels, thereby inhibiting osteogenesis, while simultaneously enhancing RANKL expression and activating the NF- κ B pathway to promote osteoclastogenesis. Abbreviations: APC: Adenomatous polyposis coli; BMP: Bone morphogenetic protein; BMPR: BMP receptor; CK1: Casein kinase 1; DLL4: Delta-like ligand 4; GSK3 β : Glycogen synthase kinase 3 beta; Hes1: Hairy and enhancer of split-1; I κ B: Inhibitor of kappa kinase; lncRNA: Long non-coding RNA; LRP: Low-density lipoprotein receptor-related protein; NFATc1: Nuclear factor of activated T-cells, cytoplasmic 1; NF- κ B: Nuclear factor kappa-B; OPG: Osteoprotegerin; P: Phosphate; RANK: Receptor activator of nuclear factor kappa-B; RANKL: Receptor activator of the nuclear factor kappa-B ligand; SERPINB2: Serpin family B member 2; Smad: Sma- and Mad-related protein; TCF-1: T cell-specific DNA-binding protein; TGF β : Transforming growth factor beta; TGF β R: Transforming growth factor beta receptor; TNF α : Tumor necrosis factor alpha; TRAF6: TNF receptor-associated factor 6; VEGF: Vascular endothelial growth factor; VEGFR2: Vascular endothelial growth factor receptor 2; Wnt: Wingless-related integration site; YAP1: Yes-associated protein 1.

3.2. Repair phase and corresponding signaling pathways

The repair phase begins before the inflammation stage subsides, characterized by angiogenesis, soft callus formation, and hard callus formation. This stage occurs through both intramembranous and endochondral ossification, with the latter process being more significant and intricate.^{9,15} Intramembranous ossification occurs at the end of the fractured bony, where mesenchymal stem cells (MSCs) differentiate into osteoblasts and directly form woven bone. In contrast, endochondral ossification occurs within the central hypoxic core,^{7,9} where endogenous MSCs develop into chondroblasts and form cartilage-specific matrix.⁹ Simultaneously, hypertrophic chondrocytes secrete angiogenic factors (such as vascular endothelial growth factor (VEGF)), stimulating vascular ingrowth and transforming the non-vascular cartilaginous matrix into a vascularized osseous tissue.¹⁶ Gradually, osteoprogenitor cells (OPCs) are recruited and differentiate into osteoblasts, which secrete mineral vesicles containing calcium and phosphate, facilitating the transition to a hard bony callus.¹⁷

VEGF signal is indispensable for endothelial proliferation and maturation, driving the formation of new blood vessels, and

is a key factor in osteo-angiogenic coupling.¹⁸ Notably, only optimal levels of VEGF could stimulate vascular invasion and progenitor cell osteogenic differentiation, thereby promoting bone formation. This is because while increasing VEGF levels enhances vascular density, it also slows the rate of vascular ingrowth, which is critical for progenitor cell survival and proliferation.¹⁹ VEGF signaling also aids in bone regeneration by increasing vascular permeability, which induces MSCs and OPCs,^{20,21} and by inducing the expression of BMP to activate the osteogenesis pathway.²²

The Notch pathway achieves a balanced regulation of angiogenesis through two competing ligands, Jagged1 and delta-like ligand 4 (DLL4). DLL4 limits epithelial cell mitosis and blood vessels sprouting by downregulating VEGF receptor expression, while Jagged1 competes with DLL4 to interact with the Notch receptor, activating the canonical Notch pathway and promoting angiogenesis.²³ The role of Notch signaling in bone regeneration is context-dependent, leading to contradictory findings in the literature. Certain studies reported that Notch signaling enhanced osteoblast metabolic activity,²⁴ promoted bone mineralization,²⁵ and maintained the pool of bone progenitor cells.²⁶ In contrast, other research indicated that

Notch signaling reduced the number of osteoblasts,²⁷ inhibited osteoblast differentiation,²⁸ and decreased bone mass.²⁹

BMP signaling is one of the most well-established pathways involved in promoting fracture healing, initiating a series of organized processes leading to chondro-osteogenesis. Most BMP pathways promote the final maturation of committed osteoblastic precursors and osteoblasts, with BMP2, BMP6, and BMP9 being particularly effective in driving the differentiation of mesenchymal progenitor cells.³⁰ However, some studies suggest that changes in BMP signaling in adult osteoblasts have a limited effect on bone mass, indicating that reducing BMP dosage in clinical settings might minimize side effects.³¹ The BMP pathway exhibits extensive crosstalk with multiple signaling pathways. BMP2 promotes VEGF-mediated endothelial sprouting by regulating DLL4, while BMP6 modulates VEGF signaling by regulating VEGF receptor 2 expression.²² BMP9 induces the expression of the key Notch signaling effector molecule hairy and enhancer of split-1 through the Smad pathway.³² Moreover, BMP2 upregulates low-density lipoprotein receptor-related protein (LRP) 5 levels and prevents β -catenin degradation, thereby activating the canonical Wnt pathway.³³ BMP signaling also influences the receptor activator of the nuclear factor kappa-B ligand (RANKL) pathway, increasing the RANKL/osteoprotegerin (OPG) ratio to promote osteoclast formation.³³ BMP receptor (BMPR) type II interacts with receptor activator of nuclear factor kappa-B (RANK), activating both phosphorylated Smad1/5/8 and NF- κ B signaling.³³

The transforming growth factor beta (TGF β) pathway plays a dual role in fracture healing,^{34,35} promoting the chemotaxis, expansion, and early differentiation of osteoprogenitors while inhibiting the maturation, mineralization, and osteogenic differentiation of osteoblasts during the later stages of bone formation.³⁶ For instance, in MC3T3-E1 (mouse embryo osteoblast precursor) cells, TGF β 1 treatment resulted in increased alkaline phosphatase (ALP) expression in the early stages while reducing mineralization and decreasing ALP levels in later stages. This suggests that while TGF β 1 might initially promote osteogenic differentiation, it subsequently exerts an inhibitory effect.³⁷ The TGF β pathway can also facilitate BMP signaling. Elsaifi *et al.*³⁸ demonstrated that exogenous SERPINB2 suppresses BMP signaling, whereas TGF β counteracts this suppression, facilitating the differentiation and commitment of human BMSCs. In addition, TGF β 1 synergizes with BMP9 to enhance BMSC osteogenic differentiation, potentially through non-canonical pathways.³⁹ However, TGF β signaling has also been reported to inhibit BMP signaling by competing for Smad4.⁴⁰ Furthermore, the TGF β pathway induces the production of long non-coding RNA-Smad7, which inhibits BMP expression, thereby regulating cell fate determination between osteocytes and myocytes in mouse myoblasts.⁴¹ Notably, low doses of TGF β activate Smad3 and upregulate BMP2 expression in BMSCs, whereas high TGF β levels inhibit Smad3 and attenuate BMP2 transcription.⁴²

The Wnt/ β -catenin pathway is critical for osteoblast development, promoting osteogenesis while simultaneously inhibiting chondrogenesis.⁴³⁻⁴⁵ Canonical Wnt signaling mediated the differentiation of BMSCs into osteoblast

precursor cells.⁴⁶ Notably, local delivery of β -catenin messenger RNA has been demonstrated to promote callus formation in a mouse tibial fracture model.⁴⁷ Targeting and silencing Wnt antagonists, such as schnurri-3 and sclerostin, with microRNA enhances Wnt/ β -catenin signaling, improves osteoblast function, and facilitates the repair of impaired fracture healing.⁴⁸ Activation of the canonical Wnt pathway also enhances the transcription of BMP2⁴⁹ and BMP7.⁵⁰ Wnt1 also promotes fracture healing and bone formation by activating the yes-associated protein (YAP) 1/BMP signaling pathway.⁵¹

The Hedgehog pathway plays an essential role in stimulating osteoblast proliferation and differentiation.⁵² For instance, activation of the Hedgehog signaling pathway through agonists has been shown to increase the production of mineralized fibrocartilage and improve tendon-to-bone healing.⁵³ In addition to its role in osteoblast activity, the Hedgehog pathway also significantly influences both osteogenesis and angiogenesis. This may occur through mechanisms such as TNF receptor-associated factor (TRAF) 6 protein stabilization,⁵⁴ smoothened (Smo)-glioma-associated oncogene family zinc finger (Gli) 1/2 axis activation,⁵⁵ and upregulation of RANKL expression.⁵⁶

3.3. Remodeling phase and corresponding signaling pathways

The remodeling phase involves the gradual replacement of the initial fracture callus by mature mineralized tissue, restoring the normal bone tissue structure. Osteoclasts, recruited by macrophage colony-stimulating factor and RANKL, create absorptive lacunae on the bone surface, removing immature woven bone and the underlying cartilage matrix.^{9,57} Following this, osteoblasts move to the resorption lacuna, re-establish a superior lamellar bone structure, and eventually transform into a quiescent state.⁵⁸

The RANKL pathway serves as a pivotal trigger for the activation of osteoclastogenic signaling,^{59,60} regulating the transformation of pre-osteoclast to multi-nucleated osteoclasts and the activation of mature osteoclasts.⁶¹ The inflammatory TNF α pathway upregulates RANKL expression in osteocytes, contributing to this crosstalk.⁶² The RANKL pathway also exacerbates inflammation and promotes the activation of thymic stromal lymphopoietin, which, in turn, activates the phosphoinositide 3-kinase (PI3K), MAPK, caspase-1, and NF- κ B pathways.⁶³ Furthermore, several signaling crosstalks are involved in balancing the RANKL pathway. RANKL pathway activation induces the production of interferon- β in osteoclast precursors, which inhibits osteoclast differentiation by antagonizing RANKL-induced c-Fos expression. In mouse models, the absence of interferon signaling led to increased osteoclast numbers and decreased bone density.⁶⁴ Furthermore, the Wnt/ β -catenin signaling pathway indirectly suppressed the RANKL pathway and osteoclast differentiation by promoting the secretion of OPG.⁶⁵

3.4. Emerging insights into osteogenic signaling mechanisms

In addition to classical osteogenic pathways, several novel mechanisms have been identified. For instance, nanostructured

topographies can activate Piezo1, a mechanosensitive ion channel located in the cell membrane, thereby enhancing mitochondrial oxidative phosphorylation and increasing intracellular acetyl-coenzyme A levels. This cascade ultimately activates β -catenin signaling, promoting bone formation.⁶⁶ Furthermore, vestigial-like family member 4 has been reported to function as a transcriptional repressor of YAP-transcriptional enhancer factor TEF-1 (TEAD) in the Hippo pathway. TEAD interacts with *Runx2* and inhibits its transcriptional activity; however, vestigial-like family member 4 disrupts TEAD-mediated suppression of *Runx2*, thereby facilitating osteoblast differentiation and skeletal development.⁶⁷ Certain signaling pathways regulate the neurogenic promotion of bone regeneration. For example, the delivery of nerve growth factor to fracture sites has been shown to activate its receptor, tropomyosin receptor kinase A, thereby inducing nerve-mediated bone regeneration in rat cranial defect models.⁶⁸

Advancements in sequencing technologies have significantly deepened our understanding of osteogenic molecular mechanisms. One study employed RNA interference (RNAi) screening of kinases in primary murine osteoblasts and identified cyclin-dependent kinase 5 (Cdk5) as a negative regulator of osteoblast differentiation in both mice and humans. RNA sequencing analysis of Cdk5 knockdown osteoblast revealed that Cdk5 knockdown promotes osteogenic differentiation by activating the MAPK/extracellular regulated kinases (ERK) signaling pathway.⁶⁹ Another study used RNA sequencing to analyze gene expression changes in BMSCs during biomaterial-induced bone regeneration, identifying a significant increase of semaphorin 7A, which promotes osteogenesis through the integrin subunit beta 1/focal adhesion kinase/ERK signaling cascade.⁷⁰ In addition, Liu *et al.*⁷¹ demonstrated that tripartite motif 21 depletion enhances bone mass. Proteomic screening further revealed that tripartite motif 21 regulates osteoblast differentiation by modulating YAP1/ β -catenin signaling.

4. Small molecules targeting pathways to promote fracture healing

Despite the critical role of cytokines in regulating osteogenic pathways, their clinical application faces numerous challenges, including short half-life, high-dose requirements, expensive costs, undesired side effects, and the risk of immune reactions.⁷² Therefore, the discovery and application of small molecules, which serve as validated stable alternatives to cytokines, represents a key milestone for further progress in bone regeneration. In this section, we discuss several osteogenic small molecules, including their effects and the underlying mechanisms involved (Table 1).

4.1. Small molecules in inflammatory phase for fracture healing

4.1.1. Regulation of the TNF α pathway by small molecules

The TNF α pathway is initiated by the binding of TNF α to TNF α receptor 1, which subsequently activates NF- κ B signaling,¹¹² exacerbating inflammation and inhibiting BMP2-induced osteogenesis (Figure 2).¹¹³

High concentrations of inflammatory factors are known to inhibit osteogenesis,¹¹⁴ suggesting that anti-inflammatory drugs may promote bone regeneration. Notoginsenoside R1 alleviates TNF α expression in human mesenchymal stem cells (hMSCs). Incorporating notoginsenoside R1 into a hyaluronic acid/nanosized hydroxyapatite scaffold activates the MAPK/ERK signaling pathway and downregulates TNF α expression, ultimately controlling inflammation and promoting superior osteogenic effect in the rat skull defect model.⁷³ TNF α activates downstream NF- κ B signaling through TRAF2/6, which inhibits the Wnt pathway and impairs osteogenesis. The TRAF6 inhibitor 6877002 has been shown to successfully block TNF α -stimulated NF- κ B signaling, reducing TNF α -mediated osteoclastogenesis.⁷⁴ Quercetin has been demonstrated to safely act as an NF- κ B signaling repressor, reversing TNF α -induced osteogenic damage in BMSCs and significantly increasing bone mass.⁷⁶ In addition, a scaffold loaded with nano-formulated quercetin promotes the healing of femoral bone defects in rats.⁷⁵

4.2. Small molecules in bone renewal phase for fracture healing

4.2.1. Regulation of the VEGF pathway by small molecules

The VEGF pathway, a critical regulator of osteo-angiogenic coupling,¹¹⁵ is activated in the hypoxic environment of the fracture site through hypoxia-inducible factor 1-alpha (HIF-1 α) upregulation. Its downstream signaling pathway includes MAPK-ERK1/2 and PI3K- protein kinase B (Akt), among others (Figure 3).¹¹⁶

Small molecules that upregulate VEGF secretion can promote fracture healing. Statins, including SIM, atorvastatin, and pravastatin, have been reported to enhance VEGF mRNA expression in osteoblasts, thereby stimulating angiogenesis and facilitating bone repair.⁷⁷ Forskolin, an activator of adenylyl cyclase that raises intracellular cyclic adenosine monophosphate (cAMP) levels, induced cAMP activation in mouse OPCs and rabbit MSCs after 24 h of treatment. This upregulated VEGF through a cascade reaction, exerting long-term osteogenic effects.^{78,79} Treatment with cilostazol, an approved drug to inhibit phosphodiesterase-3 and increase cAMP levels in clinical practice, elevated VEGF levels, increased microvessels formation, and enhanced bone formation in both the atrophic non-union mouse model and the aged mouse fracture model.^{80,81}

Hypoxia-inducible factor 1-alpha, an oxygen-sensitive transcription factor that mediates VEGF production, is hydroxylated by prolyl hydroxylases and subsequently degraded under oxygen conditions. Stabilizing HIF-1 α is a critical target for activating the VEGF pathway. The prolyl hydroxylase inhibitor, iron chelator 2 (IOX2), was shown to activate the HIF-1 α pathway, promote VEGF production, enhance BMSC proliferation and migration, and increase bone density in a rat femoral fracture model.⁸² Deferoxamine, an FDA-approved iron chelator that mimics a hypoxic environment, upregulates HIF-1 α signaling. Loading deferoxamine onto hydrogel scaffolds improved the viability and adhesion of human umbilical vein endothelial cells and exerted angiogenic effects.⁸³ Salidroside also upregulated HIF-1 α to activate the VEGF

Table 1. Summary of small molecule drugs targeting signal pathways for bone healing

Pathways	Small molecules	Mechanisms	Models	References
TNF α pathway	NGR1	Activate the MAPK/ERK pathway to downregulate TNF α expression	hMSC model; rat skull defect model	73
	6877002	Inhibit TNF α /TRAF6/NF κ B axis	Osteoclast precursor model	74
	Quercetin	Repress NF- κ B signaling and activate Wnt/ β -catenin	BMSC model; Rat femoral bone defect model	75,76
VEGF pathway	Statins	Increase VEGF mRNA expression	Osteoblast model	77
	Forskolin	Activate cAMP pathway to increase VEGF expression	Mouse osteogenic progenitor cell MC3T3-E1 model; rabbit MSC model	78,79
	Cilostazol	Increase VEGF secretion	Mouse atrophic fracture non-healing model; Elderly mice fracture model	80,81
	IOX2	Stabilize HIF-1 α to activate VEGF pathway	SD rat femoral fracture model	82
Notch pathway	DFO	Stabilize HIF-1 α to activate VEGF pathway	HUVEC model	83
	SAL	Stabilize HIF-1 α to activate VEGF pathway	Fetal mouse long bone model	84
	VPA	Activate Notch signaling	MC3T3-E1 osteoblasts; OVX rats with femoral epiphyseal defect	85
BMP pathway	Imiquimod	Activate Notch signal	iMAD cell model	86
	DAPT	Inhibit γ -secretase	Embryonic and induced pluripotent stem cell model; aged BMSC model	87,88
	SY-LB-35	Act as BMP receptor agonists	C2C12 cell model	89
	SY-LB-57	Act as BMP receptor agonists	C2C12 cell model	89
TGF β Pathway	Trapidil	Increase reactivity of BMPR	Rat skull defect model	90
	FK506	Activate BMPR	Rat ectopic subcutaneous implantation model; rat femoral defect model; rabbit spinal fusion model	91,92
	NVP	Promote nuclear translocation phosphorylated Smad1/5/9	of C2C12 cell model; rabbit skull defect model	93
	ONO-1301	Enhance the effect of BMP	MSCs; rat skull defect model	94
Hh pathway	Amygdalin	Promote Smad2/3 phosphorylation	Gli1+MSCs; mouse tibial fracture model	10
	Zg	Inhibit Smad7	MSC model	95
	Csn-B	Stimulate Nr4a1 and reverse the side effects of TGF β pathway	BMSCs; mouse skull defect model; mouse tibia defect model	96
	SB431542	Downregulate TGF β -induced inhibitory Smads expression	Mouse skull defect model; miniature pig maxillofacial bone severe defect model	97,98
Wnt/ β -catenin pathway	PUR	Activate Smo to activate Hedgehog pathway	MSC; mouse skull defect model	99,100
	SAG	Activate Smo to activate Hedgehog pathway	Primary neonatal mouse skull cell model; mouse skull defect model	101
RANKL pathway	SAG21k	Activate Smo to activate Hedgehog pathway	Mouse segmental femoral model defect	102
	1-Azakenpaullone	Inhibit GSK-3 β to upregulate β -catenin	hMSC model	103
	C91	Inhibit GSK-3 β to upregulate β -catenin	BMSC model	104
	VA1	Inhibit sclerostin to activate Wnt pathway	Rat ectopic mineralization model; rabbit posterior spinal arthrodesis surgery model	105
RANKL pathway	C07	Inhibit sclerostin to activate Wnt pathway	Rat ectopic mineralization model; rabbit posterior spinal arthrodesis surgery model	105
	WAY-262611	Inhibit DKK1 to activate Wnt pathway	Lumbar fusion model in osteoporotic rats	106
	ZA	Downregulate RANK expression	Rabbit femoral defect model	107
	Aspirin	Inhibit NF- κ B and NFATc1 activation	Dendritic cell model; Rat mandibular defect model	108
W9	XAV-939	Increase OPG expression and decrease RANKL expression	hMSCs model	109
	W9	Bind competitively with RANKL	Rat femur delayed-union model	110,111

Abbreviations: BMP: Bone morphogenetic protein; BMPR: BMP receptor; BMSC: Bone marrow mesenchymal stem cell; cAMP: Cyclic adenosine monophosphate; C91: CHIR99021; DFO: Deferoxamine; DKK1: Dickkopf-related protein 1; ERK: Extracellular regulated kinase; Gli1: Glioma-associated oncogene family zinc finger; GSK3 β : Glycogen synthase kinase 3 beta; HIF-1 α : Hypoxia-inducible factor 1-alpha; hMSC: Human mesenchymal stem cell; HUVEC: Human umbilical vein endothelial cells; iMAD: Multipotent adipose-derived cells; IOX2: Iron chelator 2; mRNA: Messenger RNA; MAPK: Mitogen-activated protein kinase; MSC: Mesenchymal stem cell; MC3T3-E1: Mouse embryo osteoblast precursor' NFATc1: Nuclear factor of activated T-cells, cytoplasmic 1; NF- κ B: Nuclear factor kappa-B; NGR1: Notoginsenoside R1; Nr4a1: Nuclear receptor 4 A1; NVP: N-Vinyl-2-pyrrolidone; OPG: Osteoprotegerin; OVX: Ovariectomized; PUR: Purmorphamine; RANK: Receptor activator of nuclear factor kappa-B; RANKL: RANK ligand; SAG: Smoothened agonist; SAL: Salidroside; SD: Sprague Dawley; Smad: Sma- and Mad-related protein; Smo: Smoothened; TGF β : Transforming growth factor beta; TGF β R: Transforming growth factor beta receptor; TNF α : Tumor necrosis factor alpha; TRAF6: TNF receptor-associated factor 6; VA1: VCP activator 1; VEGF: Vascular endothelial growth factor; VPA: Valproic acid; Wnt: Wingless-related integration site; W9: WP9QY; ZA: Zoledronic acid; Zg: Zingerone.

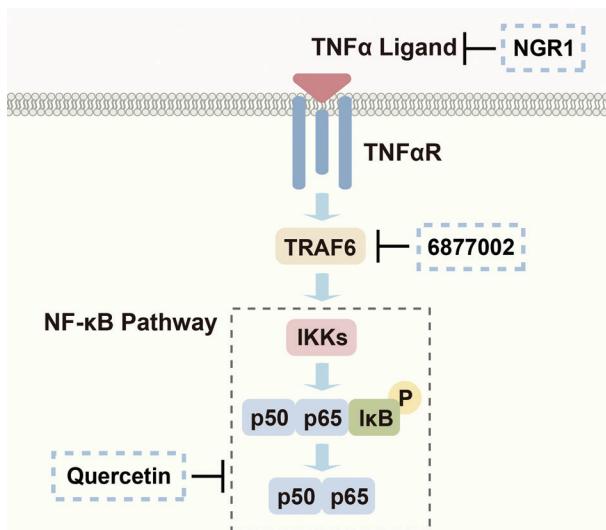


Figure 2. Small molecules targeting the inflammatory phase to promote fracture healing. The TNF α ligand binds to TNF α R, initiating intracellular signaling cascades through TRAF6, including the NF- κ B pathway. This pathway subsequently regulates osteogenesis through NF- κ B subunits. At present, small molecules can modulate the TNF α ligand, TRAF6, or the NF- κ B pathway to influence TNF α signaling.

Abbreviations: IKKs: I κ B kinase complexes; I κ B: Inhibitor of kappa B; NF- κ B: Nuclear factor kappa-B; NGR1: Notoginsenoside R1; NF- κ B: Nuclear factor kappa-B; P: Phosphate; p50: Nuclear factor NF- κ B p50 subunit; p65: Nuclear factor NF- κ B p65 subunit; TNF α : Tumor necrosis factor alpha; TNF α R: Tumor necrosis factor- α receptor; TRAF6: TNF receptor-associated factor 6.

pathway, promoting endothelial cell proliferation, migration, and capillary-like structure formation, demonstrating angiogenic activity in mouse fetal long bone.⁸⁴

4.2.2. Regulation of Notch pathway by small molecules

Notch signaling consists of five ligands (Jagged-1, Jagged-2, DLL1, 3, and 4) and four transmembrane receptors (Notch 1 – 4). Ligand-receptor interactions trigger the proteolytic cleavage of the Notch receptor by the γ -secretase complex, releasing the intracellular domain, which subsequently induces the transcription of classical Notch target genes, including those from the Hes and Hey families (Figure 3).

Co-culturing MC3T3-E1 osteoblasts with valproic acid (VPA) was found to activate the Notch pathway, significantly promoting cell mineralization and the expression of osteogenic proteins.⁸⁵ The delivery of VPA through hydrogel to femoral metaphyseal defects in ovariectomized (OVX) rats accelerated both vascular and bone formation.⁸⁵ Imiquimod treatment of mouse immortalized multipotent adipose-derived cells (iMAD) activated the Notch pathway, increasing ALP activity and matrix mineralization, leading to a 2.8-fold enhancement in the cells' osteogenic differentiation capacity and a 1.6-fold increase in BMP-9-induced osteogenic differentiation.⁸⁶

Conversely, Notch pathway inhibitors have also demonstrated therapeutic potential by counteracting the inhibitory effects of Notch signaling on bone formation, such as γ -secretase inhibitors like DAPT.^{87,88} Notably, DAPT application

enhanced the osteoblastic commitment of embryonic and induced pluripotent stem cells⁸⁷ and improved the diminished osteogenic differentiation potential of aged BMSCs.⁸⁸

4.2.3. Regulation of TGF β pathway by small molecules

Transforming growth factor-beta and BMPs are both members of the TGF β superfamily, each with both canonical and non-canonical signaling pathways,³⁴ mediated by Smad 2/3 and MAPKs, PI3K-Akt, Ras homolog family member A, protein phosphatase 2, etc. (Figure 4).¹¹⁷

Transforming growth factor-beta activators have shown promise in enhancing fracture healing. Amygdalin upregulated phosphorylated Smad2/3, enhanced cartilage formation in Gli1⁺ MSCs, and promoted tibial fracture healing in C57BL/6 mice through the TGF β /Smad signaling pathway.¹⁰ Similarly, zingerone exhibited a potent osteoinductive effect by inhibiting Smad7, a negative regulator of TGF β 1 signaling, which in turn promoted osteoblast differentiation and calcium deposition in MSCs.⁹⁵

On the other hand, TGF β inhibitors have also been reported to enhance bone healing. TGF β signaling activation suppressed transcription of the Wnt4 agonist, nuclear receptor 4 A1. Treatment with nuclear receptor 4 A1 agonist, cytosporone B, promoted BMSC differentiation *in vitro* and enhanced skull and tibial defect repair, accelerating fracture healing *in vivo*.⁹⁶ TGF β 1 receptor inhibitor, SB431542, downregulated TGF β -induced inhibitory Smad expression, and potentially accelerated BMP-stimulated osteogenesis, functioning as a skeletal repair promoter in mouse skull defect models and swine jawbone defect models.^{97,98}

4.2.4. Regulation of BMP pathway by small molecules

BMP pathway begins with the interaction between BMPs and specific type I or type II receptors,^{34,35} subsequently regulating target gene expression through the phosphorylated Smad1/5/8 complex (canonical pathway)¹¹⁸ or by activating various protein kinases, such as c Jun N-terminal kinase/P38, PI3K/Akt, Ras homolog family member-GTPase, and MAPK (non-canonical pathways) (Figure 4).³⁴

BMPR agonists have been shown to promote fracture healing. SY-LB-35 and SY-LB-57, full BMPR agonists, elevated the expression of phosphorylated Smad and activated the PI3K/Akt signaling pathway, significantly increasing cell proliferation and viability in the C2C12 myoblast cell line.⁸⁹ Trapidil increased BMPR reactivity, induced Smad1/5/9 phosphorylation, and enhanced Runx2 expression, thus promoting osteoblastic differentiation and bone regeneration in a rat cranial defect model.⁹⁰ FK506-binding protein 12 is an intracellular BMP inhibitor targeting BMPR-I. FK506, an FDA-approved immunosuppressant, can bind to FK506-binding protein 12 and inhibit its function, thereby activating BMPR and elevating pSmad1/5 levels.⁹¹ Sangadala *et al.*⁹² found that FK506 could induce ALP activity in C2C12 cells, and local delivery of FK506 on collagen sponges in a rat subcutaneous implantation model resulted in mineralization comparable to BMP2, suggesting FK506's potential as a future

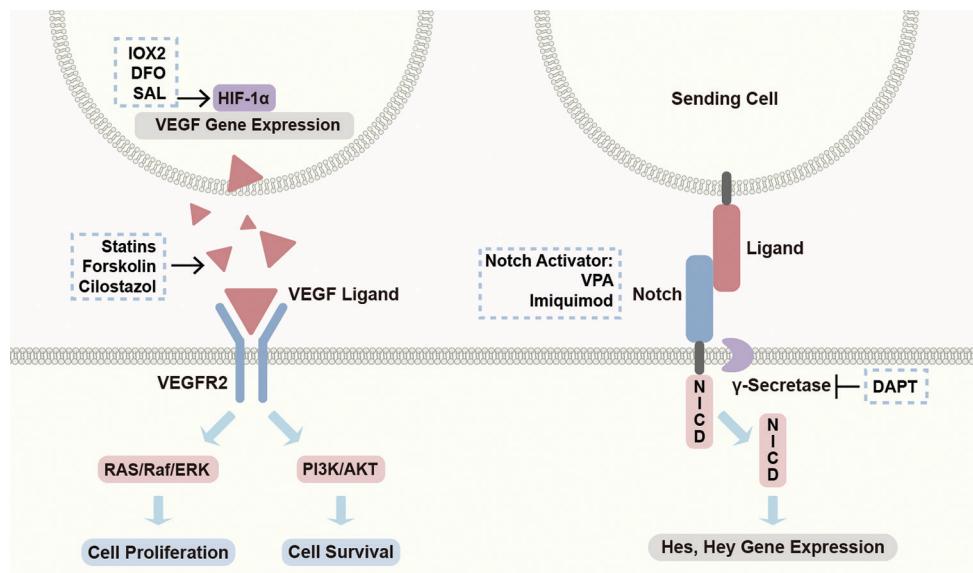


Figure 3. Small molecules targeting angiogenesis. VEGF pathway: VEGF ligands bind to VEGFR2, activating the downstream ERK pathway to promote cell proliferation and the PI3K pathway to support cell survival. Small molecules can regulate VEGF ligand levels and modulate HIF-1 α expression to influence this pathway. Notch pathway: Ligands expressed on neighboring cells bind to Notch receptors, leading to the release and nuclear translocation of NICD, which activates the transcription of osteogenic genes such as Hes and Hey. Small molecules can regulate Notch signaling by modulating γ -secretase activity.

Abbreviations: AKT: Protein kinase B; DFO: Deferoxamine; ERK: Extracellular regulated kinase; Hey: Hes-related repressor Herp, Hesr, Hrt, CHF, gridlock; Hes: Hairy and enhancer of split; HIF-1 α : Hypoxia-inducible factor 1 alpha; IOX2: Iron chelator 2; NICD: Notch intracellular domain; PI3K: Phosphoinositide 3-kinase; Raf: Raf protein kinase; RAS: Rat sarcoma; SAL: Salidroside; VEGF: Vascular endothelial growth factor; VEGFR2: Vascular endothelial growth factor receptor 2; VPA: Valproic acid.

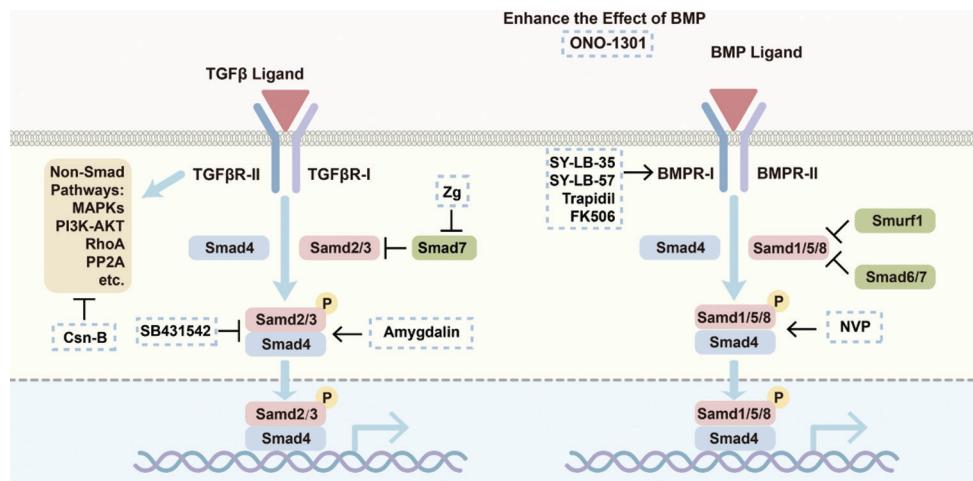


Figure 4. Small molecules for callus formation. TGF β pathway: Binding of TGF β to its receptor activates Smad2/3, which then forms a complex with Smad4. This complex translocates to the nucleus, influencing gene expression involved in both osteoclast and osteoblast differentiation. Small molecules can regulate the expression of Smads, Smad complexes, and non-canonical signaling pathways to modulate TGF β signaling. BMP pathway: BMP ligands bind to type I and II receptors, leading to the phosphorylation of Smad1/5/8. These phosphorylated Smads form complexes with Smad4 and translocate to the nucleus to regulate osteogenic genes such as *Runx2*. Small molecules can modulate BMPR-I activity and Smad complexes to influence BMP signaling. Non-canonical pathways, such as MAPK and PI3K, are activated downstream, influencing the transcription of genes involved in bone formation and resorption.

Abbreviations: AKT: Protein kinase B; BMP: Bone morphogenetic protein; BMPR: BMP receptor; Csn-B: Cytoporone B; MAPK: Mitogen-activated protein kinase; NVP: N-Vinyl-2-pyrrolidone; PI3K: Phosphoinositide 3-kinase; PP2A: Protein phosphatase 2; Smad: Sma- and Mad-related protein; Smurf1: Smad ubiquitination regulatory factor 1; RhoA: Ras homolog family member A; TGF β : Transforming growth factor-beta; TGF β R: TGF β receptor; Zg: Zingerone.

osteogenic agent. Another study demonstrated that FK506 promoted osteogenic differentiation of hMSCs and induced bone formation in rat femoral defect and rabbit spinal fusion models, showcasing its efficacy across different models.⁹¹

Assisting in enhancing the osteogenic effect of the BMP pathway is another approach to promoting fracture healing. N-Vinyl-2-pyrrolidone (NVP), an FDA-approved drug, enhanced the nuclear translocation of phosphorylated Smad1/5/9 in a

dose-dependent manner, thereby increasing ALP activity in BMP2-induced C2C12 cells.⁹³ Local delivery of NVP through a biodegradable membrane promoted healing in a rabbit cranial defect model.⁹³ ONO-1301, a prostacyclin analog known for its pro-angiogenic properties, when combined with BMP2 on a scaffold, improved MSC migration and osteogenic differentiation *in vitro* and promoted bone regeneration in a rat cranial defect model, surpassing the effects of scaffolds with BMP2 alone.⁹⁴

4.2.5. Regulation of Wnt pathway by small molecules

Upon Wnt binding to its receptor, Frizzled, along with the co-receptor, LRP5/6, β -catenin accumulates in the cytoplasm and subsequently translocates to the nucleus, where it drives the transcription of osteogenesis-related genes (Figure 5).⁴⁵

Glycogen synthase kinase 3 β (GSK-3 β) phosphorylates and reduces β -catenin levels, positioning GSK-3 β inhibitors as promising candidates for promoting bone formation, including 1-Azakenpauillone¹⁰³ and CHIR99021(C91).¹⁰⁴ 1-Azakenpauillone enhanced Wnt signaling and nuclear β -catenin accumulation in hMSCs, leading to elevated *Runx2* expression and enhanced osteoblastic differentiation and mineralization.¹⁰³ Similarly, C91 boosted ALP activity and secretion in BMSCs. When incorporated into an artificial bone scaffold mimicking the *in vivo* environment, the slow release of C91 promoted osteogenic differentiation and mineralization of BMSCs.¹⁰⁴

Sclerostin, a protein that inhibits Wnt signaling by competitively binding to LRP5/6, is another therapeutic target for enhancing fracture healing. VA1 (an FDA-approved drug) and C07, small molecules that block the extracellular sclerostin interaction with LRP5/6, activated Wnt pathways, produced dose-dependent

ectopic mineralization in a non-bony environment in rats, and significantly increased bone healing in a posterior spinal arthrodesis model in rabbits.¹⁰⁵ BMP pathway activation was also involved in the process, mediated by GSK-3 β -enhanced Smad1 phosphorylation.¹⁰⁵ Dickkopf-1 (DKK1) inactivates the Wnt pathway by blocking Wnt binding to the Lrp5/6 receptor. The small molecule WAY-262611 inhibited DKK1, thereby activating Wnt/ β -catenin signaling and significantly improving lumbar fusion in osteoporotic rats.¹⁰⁶

4.2.6. Regulation of Hedgehog pathway by small molecules

The Hedgehog pathway is initiated by three ligands – Sonic Hedgehog, Indian Hedgehog, and Desert Hedgehog – binding to its receptor, Patched. This binding relieves the suppression of Smo by Patched, enabling Smo to trigger intracellular signaling cascades that activate the Gli family of transcription factors, which modulate various cellular activities (Figure 5).¹²⁰

Activation of Smo is a key target for regulating the Hedgehog pathway. Purmorphamine (PUR) can activate Smo to trigger the Hedgehog pathway, thereby promoting osteogenic differentiation of endogenous stem cells and MSCs.¹⁰⁰ Another study utilized 20S-hydroxycholesterol, a naturally occurring small molecule that targets Smo, to form sterosomes with PUR, which were then immobilized onto scaffolds. This scaffold significantly improved osteogenic differentiation of MSCs through Hedgehog pathway activation and enhanced bone repair in a mouse cranial defect model.¹⁰⁰

Smoothened agonist (SAG), another Smo activator, induced osteogenesis in primary neonatal mouse calvarial cells and dose-dependently promoted bone healing and angiogenesis in a mouse cranial defect model.¹⁰¹ SAG21k, a derivative of SAG,

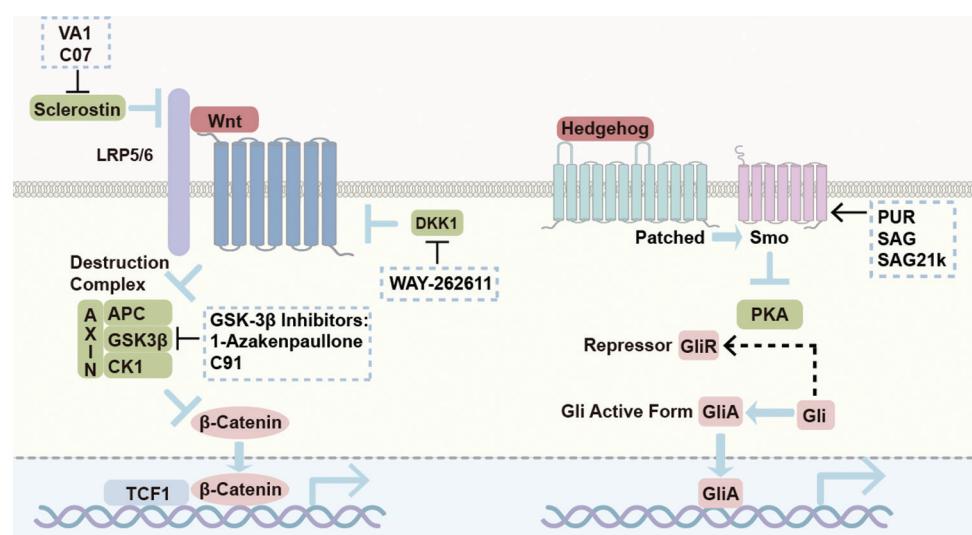


Figure 5. Small molecules for callus formation. Wnt pathway: In the Wnt signaling pathway, Wnt ligands bind to Frizzled and LRP5/6 receptors, leading to the degradation of GSK-3 β and the accumulation of β -catenin, which then translocates to the nucleus to drive gene transcription. Small molecules can regulate GSK-3 β levels and modulate Wnt inhibitors like DKK1 and sclerostin to control the Wnt pathway. Hedgehog pathway: Hedgehog proteins bind to Patched receptors on target cells, activating Smo and subsequently activating Gli transcription factors to regulate downstream target genes. Small molecules can modulate Smo activation to regulate Hedgehog signaling.

Abbreviations: APC: Adenomatous polyposis coli; CK1: Casein kinase 1; C91: CHIR99021; DKK1: Dickkopf-related protein 1; GSK3 β : Glycogen synthase kinase 3 beta; Gli: Glioma-associated oncogene family zinc finger; LRP: Low-density lipoprotein receptor-related protein; PKA: Protein kinase A; PUR: Purmorphamine; SAG: Smoothened agonist; Smo: Smoothened; TCF1: T-cell factor 1; Wnt: Wingless-related integration site.

activated the Sonic Hedgehog pathway and enhanced cartilage formation.¹⁰² Sequential application of SAG21k and IOX2 yielded significant effects in a mouse femoral segmental defect model, with SAG21k promoting cartilage development in the callus and IOX2 facilitating its conversion to bone, showing potential in the healing of challenging bone injuries.¹⁰²

4.3. Small molecules in bone remodeling phase for fracture healing

4.3.1. Regulation of RANKL pathway by small molecules

Receptor activator of nuclear factor kappa-B ligand is a ligand of the transmembrane protein RANK, which recruits TRAFs (particularly TRAF6). This interaction activates downstream MAPKs, NF- κ B, PI3K/Akt, ultimately leading to the activation of key transcription factors such as c-Fos and nuclear factor of activated T cells, cytoplasmic 1 (NFATc1) (Figure 6).¹²¹

Overactivation of the RANKL pathway can lead to osteoclast dysregulation and bone loss. Therefore, biomolecules that finely tune RANKL signaling are key for managing this process. Zoledronic acid (ZA), a member of the bisphosphonate family, downregulates RANKL-related gene expression and inhibits osteoclast-mediated bone resorption. Local delivery of ZA through hydroxyapatite exhibited dual effects, promoting osteogenesis while suppressing osteolysis, and facilitating bone defect repair in rabbit femur models.¹⁰⁷ Aspirin reduced RANKL-induced dendritic cell differentiation into osteoclasts by inhibiting NF- κ B and NFATc1 activation, which reduced the number of osteoclasts and promoted bone regeneration in a rat mandibular defect model.¹⁰⁸

OPG, a soluble decoy receptor produced by osteoblasts, inhibits RANKL/RANK binding.⁶¹ Treatment of hMSCs with XAV-939 increased OPG expression while decreasing RANKL expression, thereby inhibiting osteoclast differentiation.¹⁰⁹ WP9QY (W9) competes with RANK for binding with RANKL, thus inhibiting RANK-RANKL interactions and blocking osteoclast differentiation.^{110,111} Local administration of W9 promoted callus formation and aided fracture healing in a rat femur delayed-union model.¹¹¹

5. Spatiotemporal precision in drug delivery strategies

Bone tissue engineering has made significant progress in achieving spatially precise delivery of small molecules. However, spatial delivery alone may present challenges, as the therapeutic effects of these drugs can vary depending on the phase of the treatment. For instance, the early-stage release of magnesium ions promotes the reconstruction of the neurovascular network, whereas its later-stage release inhibits mineralization.¹²² Controlled, spatiotemporal drug release over time can help address this issue. Spatiotemporal precision delivery, which allows for sequential drug release and dose modulation in accordance with the temporal progression of healing, can significantly enhance overall repair outcomes. Numerous approaches have been explored to regulate the rate and sequence of release for multiple drugs.

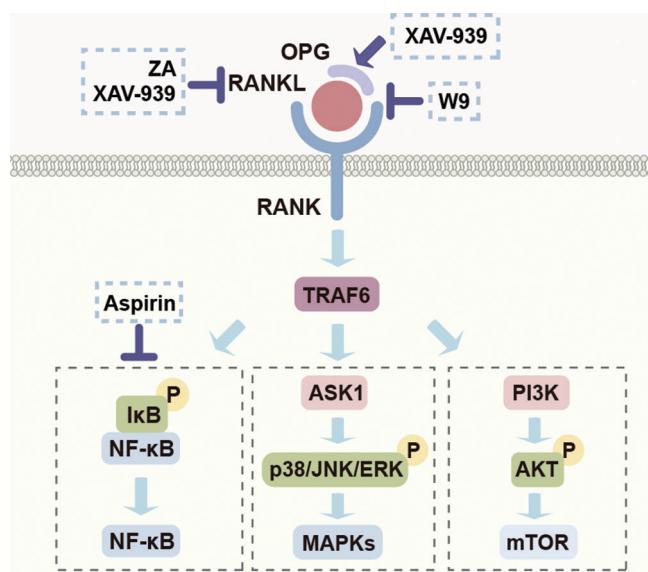


Figure 6. Small molecules for bone remodeling. RANKL, produced by osteoblasts, binds to RANK receptors on osteoclast precursors, initiating signaling cascades through TRAF6, including MAPK, NF- κ B, and PI3K/AKT pathways, ultimately enhancing NFATc1 expression. OPG serves as a decoy receptor for RANKL, blocking RANK-RANKL interactions. Small molecules can modulate RANKL expression, inhibit RANK-RANKL binding, increase OPG levels, and block NF- κ B signaling to suppress RANKL-mediated osteoclastogenesis.

Abbreviations: AKT: Protein kinase B; ASK1: Apoptosis signal-regulating kinase 1; ERK: Extracellular signal-regulated kinase; I κ B: Inhibitor of kappa B; JNK: c-Jun N-terminal kinase; MAPK: Mitogen-activated protein kinase; mTOR: Mechanistic target of rapamycin; NFATc1: Nuclear factor of activated T-cells, cytoplasmic 1; NF- κ B: Nuclear factor kappa-B; OPG: Osteoprotegerin; P: Phosphate; PI3K: Phosphoinositide 3-kinase; RANK: Receptor activator of nuclear factor kappa-B; RANKL: RANK ligand; TRAF6: TNF receptor-associated factor 6; W9: WP9QY; ZA: Zoledronic acid.

5.1. Drug affinity for targeted microenvironments

In the development of spatiotemporal delivery systems, researchers have capitalized on the differential affinity of drugs to their environments for controlled release. Zhang *et al.*¹²³ engineered a spatiotemporal scaffold system that leveraged the varying solubility profiles of drugs. The highly hydrophilic strontium ranelate demonstrated a strong affinity for aqueous environments, exhibiting substantial burst release (70% of the payload within 24 h). Conversely, the hydrophobic resveratrol showed preferential retention in polycaprolactone/tricalcium phosphate (PCL/TCP) matrices, achieving sustained release over 21 days. This dual-release system significantly enhanced angiogenesis, suppressed osteoclastic activity, and promoted MSC osteogenesis in rat mandibular defect models. Lee *et al.*¹²⁴ developed a sequential delivery platform through differential drug-scaffold interactions. The anti-inflammatory substance P, loaded through a simple hydration method, displayed burst release, discharging approximately 90% of the payload within 14 days. Concurrently, 4-hexylresorcinol was tightly bound to the scaffold matrix, maintaining therapeutic concentrations for 70 days. This system promoted angiogenesis and osteogenesis, offering a novel therapeutic approach to osteoporosis (OP).

healing. Furthermore, Sun *et al.*¹²⁵ achieved sustained delivery through affinity-based conjugation by coupling BMP2 with PIGF-2123-144 peptide, which had a strong affinity for extracellular matrix-based materials, thereby achieving a slow and sustained release of BMP2. Apt19s, which effectively recruited MSCs, exhibited a binding affinity for BMSCs and released rapidly in the early phase. The sequential release of Apt19s to recruit BMSCs and BMP2 to promote osteogenic differentiation demonstrated effective osteogenic potential both *in vitro* and *in vivo*.

5.2. Release kinetics differences across delivery platforms

Poly (lactic-co-glycolic acid) (PLGA)-based systems are widely utilized in drug delivery due to their ability to release drugs continuously over extended periods as PLGA degrades. Given the degradation rate of PLGA is adjustable, the drug release profile from PLGA microspheres can, in theory, be controlled. Lee *et al.*¹²⁶ developed a spatiotemporal scaffold loaded with BMP2 and biodegradable microspheres encapsulating alendronate (ALN). Initially, BMP2 was released rapidly, followed by the slow release of ALN from the PLGA microspheres. The sequential release of BMP2 and ALN effectively promoted MSC osteogenic differentiation while inhibiting osteoclast activity, significantly enhancing osteogenic activity. Hao *et al.*¹²⁷ incorporated platelet-derived growth factor with two B subunits (PDGF-BB) directly into hydrogel scaffolds, while kartogenin (KGN) was encapsulated in PLGA microspheres and integrated into the scaffold. This system achieved the early release of PDGF-BB to recruit MSCs and the sustained release of KGN to promote MSC chondrogenic differentiation, facilitating enhanced bone regeneration *in situ* for tissue engineering applications. By adjusting the initial concentrations of silk fibroin (SF) and polyvinyl alcohol, the drug release rate of the nanosphere-incorporated matrix could be modulated. A 5% nanosphere-incorporated matrix achieved a rapid initial release of drugs that promoted BMSC migration, while a 0.2% nanosphere-incorporated matrix provided a slow and sustained release of molecules that promoted chondrogenesis, effectively facilitating osteochondral regeneration.¹²⁸

5.3. Stimuli-responsive delivery systems for controlled release

Stimuli-responsive delivery systems enable controlled biomolecular release through exogenous stimuli (e.g., temperature, light, and electric/magnetic fields) or endogenous stimuli (e.g., enzymes, pH changes, and redox gradients). Dong *et al.*⁶ designed a near-infrared light-responsive hydroxyapatite/collagen-based three-dimensional (3D)-printed scaffold. This system initially released SIM to recruit MSCs, and upon exposure to near-infrared light, precisely modulated the release of PGL, a compound that promoted osteogenic differentiation, thereby optimizing bone regeneration outcomes. Xue *et al.*¹²⁹ synthesized an enzyme-responsive hydrogel system based on matrix metalloproteinase-7, an enzyme that naturally appears 3 days post-fracture. Initially, most physically encapsulated nanoparticles were released through diffusion. In the presence of matrix metalloproteinase-7, chemically bonded nanoparticles were rapidly released as the hydrogel degraded, enabling drug

release in response to the fracture microenvironment. Zha *et al.*¹³⁰ developed pH-responsive nanocomposite hydrogel using zinc-gallium-humic acids (soluble at pH ≥ 7). In the inflammation stage (pH < 7), the nanoparticles released zinc ions and gibberellic acid to combat bacteria. As the pH increased in the later stage (pH ≥ 7), the humic acids dissolved and promoted tissue regeneration, facilitating rapid healing of infectious fractures in mice.

At present, substitutes for artificial bone grafts primarily include bone cement, bioglass, alloy materials, naturally derived materials, and synthetic polymer materials.^{131,132} Among these, natural materials are favored for their superior degradation properties, while synthetic polymers are widely used in bone repair-related research due to their mechanical properties and stable and adjustable structures.¹³³ When designing scaffolds with spatiotemporal drug release capabilities, it is essential to consider additional characteristics such as mechanical properties, biocompatibility, degradability, appropriate porosity, and the potential for convenient surgical application.¹³⁴ These characteristics are crucial for the scaffold's future clinical applications.

6. Clinical applications of small molecules in fracture healing: From conventional to spatiotemporal strategies

6.1. Translation of conventional small molecules

To date, numerous small-molecule drugs have demonstrated osteogenic effects in clinical applications. For instance, a randomized controlled trial in healthy elderly women showed that intermittent administration of dasatinib and quercetin over a short period (2 – 4 weeks) promoted bone formation (NCT04313634). Several prospective randomized controlled trials have confirmed that SIM enhances osteoblastic activity and facilitates autologous bone formation following tooth extraction.¹³⁵⁻¹³⁷ ZA, a bisphosphonate used to treat OP, has improved bone health in various conditions, including in elderly women with cognitive impairment.¹³⁸ In addition, the combination of ZA and calcitriol in diabetic OP patients post-fracture has been reported to enhance bone density and metabolism, alleviate pain, improve knee joint function, and reduce the risk of re-fracture.¹³⁹ These studies highlight the clinical translational potential of small-molecule drugs. However, their clinical application faces several challenges, including low drug efficacy, local adverse effects, and systemic off-target effects.

6.1.1. Low drug efficacy

Small molecule drugs may exhibit suboptimal clinical efficacy due to limitations such as poor water solubility, instability in weakly alkaline conditions, and low oral bioavailability. For example, the natural osteogenic small molecule quercetin has poor solubility and low oral absorption, limiting its practical application.¹⁴⁰ The conventional oral administration of bisphosphonates results in poor gastrointestinal absorption, typically <1%, with further reductions when taken alongside food or calcium.¹⁴¹

Encapsulating small molecules in biodegradable and biocompatible delivery systems can address these issues.⁷⁵ A Phase III clinical trial demonstrated that an oral

phospholipid-based quercetin formulation significantly improved oral bioavailability, achieving plasma levels 20 times higher than unformulated quercetin, with no reported adverse effects in human volunteers.¹⁴⁰ Similarly, calcium phosphate cement/PLGA composite materials have been used for controlled local delivery of ALN, facilitating bone defect repair in osteoporotic rat femoral condyles.¹⁴¹

6.1.2. Local adverse effects

Some small molecule drugs, even when administered at therapeutic doses, can cause unintended local adverse effects. For instance, dexamethasone has been shown to induce osteogenic differentiation by inhibiting SOX9 expression and simultaneously promote adipocytic differentiation in a dose-dependent manner through upregulation of peroxisome proliferator-activated receptor gamma, impairing bone marrow osteogenesis.¹⁴² Similarly, multiple cAMP pathway activators, such as 8-bromo-cAMP and forskolin, enhance osteogenesis while inhibiting MSC proliferation.¹⁴³

To mitigate these local adverse effects, strategies such as short-term treatment, dose reduction, and reduced administration frequency have been proposed.¹⁴⁴ For example, short-term, low-dose administration of dexamethasone during early differentiation stages has been reported to minimize adipogenic side effects.¹⁴² A phenotypic mini-screening study identified forskolin (100 μ M) as the most potent osteogenic agent with minimal toxicity when administered as a single 24-h dose to rabbit BMSCs.¹⁴⁵ Furthermore, forskolin-loaded scaffolds implanted in a rabbit radial defect model significantly promoted *in vivo* bone regeneration, comparable to recombinant human BMP-2, while reducing cAMP-related adverse effects.⁷⁹

6.1.3. Systemic off-target effects

One of the major limitations of small molecules in clinical applications is their systemic off-target effects. Due to their high diffusivity, these compounds may induce non-specific systemic adverse reactions.¹⁴⁵ For instance, natural drug psoralen has been demonstrated to accelerate femoral defect repair in rats through the ERK and BMP pathways,¹⁴⁶ but its accumulation in the liver depletes glutathione, leading to hepatotoxicity.¹⁴⁷ Intravenous ZA administration may alter endogenous cytokine release, triggering infusion-related inflammatory responses¹⁰⁷ which can result in flu-like symptoms, hypocalcemia, gastrointestinal disturbances, and renal impairment.¹⁴⁸

Targeted drug delivery using scaffolds can minimize off-target effects by localizing drug action to the damaged bone tissue. For example, psoralen-loaded polyelectrolyte multilayer-coated titanium mesh scaffolds enhanced spinal fusion in rats while preventing post-operative complications.¹⁴⁹ Similarly, the localized release of ZA from hydroxyapatite scaffolds minimized systemic exposure, reducing adverse effects while promoting osteoblast activity and bone defect repair in rabbits.¹⁰⁷ These findings underscore the importance of precise spatiotemporal drug targeting to minimize systemic adverse reactions and maximize therapeutic efficacy.

Systemic side effects also contribute to discrepancies between fundamental research and clinical trials. For example, VPA has been shown to enhance fracture repair in OVX rats through local hydrogel-based release.⁸⁵ However, clinical studies have reported that systemic VPA use as an antiepileptic drug reduces bone mass.¹⁵⁰⁻¹⁵³ This discrepancy may be attributed to VPA-induced osteoclast activation,¹⁵⁴ which, in localized delivery, facilitates bone remodeling by clearing necrotic bone tissue but, in systemic administration, leads to overall bone loss. Similarly, aspirin promoted osteogenesis in cellular and rat models by inhibiting NF- κ B and NFATc1 activation.¹⁰⁸ However, a clinical trial in elderly individuals found that aspirin did not reduce fracture risk and instead increased the risk of serious falls (ACTRN12615000347561). This divergence may stem from aspirin's differential effects on osteoblasts and osteoclasts in fracture sites versus normal bone tissue.

6.2. Translation of spatiotemporal delivery systems

Several small molecule-releasing materials have advanced to clinical and pre-clinical evaluation. Injectable PLGA polymer microsphere formulations for anticancer drug delivery have been approved for clinical use.¹⁵⁵ SF, derived from silkworms, has gained widespread application in tissue engineering due to its excellent biocompatibility, controllable degradation rates, strong mechanical properties, and non-inflammatory byproducts. SF has been approved by the FDA for clinical use in settings such as sutures and support structures in reconstructive surgery.¹²⁸ A keratin-based hydrogel has been developed for use in a porcine burn model, enabling the controlled release of fluoroquinolone, an inhibitor of fibrosis that works by inhibiting collagen synthesis. This system fostered a favorable microenvironment for burn wound healing *in vivo*.¹⁵⁶ Kim *et al.*¹⁵⁷ developed Inventage Lab Inc. Precision Particle Fabrication Microsphere[®] technology to fabricate PLGA microspheres encapsulating finasteride. The inclusion of PLA02A prolonged drug release in beagle dogs for up to 3 months.

Pre-clinical studies have demonstrated the efficacy of spatiotemporally controlled small molecule release in large animal models. Zhang *et al.* incorporated nanospheres into a sericin porous matrix, achieving controlled release by adjusting the initial SF/polyvinyl alcohol concentration. This system facilitated early-stage recruitment of BMSCs through E7 release, followed by sustained KGN release to induce chondrogenesis, enhancing cartilage defect repair in rabbits (Figure 7).¹²⁸ A sequentially releasing scaffold delivered SIM for early-stage chemotaxis, followed by late-stage PGL release to promote MSC osteogenic differentiation. This scaffold enhanced ALP activity, upregulated osteogenic gene expression, and improved bone regeneration in a rabbit cranial defect model.⁶

6.2.1. Pre-clinical insights into spatiotemporal delivery in disease models

Despite significant advancements in medical treatments, fractures that cannot spontaneously heal remain a major challenge in clinical practice, particularly osteoporotic fractures and large bone defects.^{131,158} Osteoporotic fractures, which are severe consequences of OP, are difficult to treat and are associated with high mortality rates. Due to decreased bone strength and

microstructural degradation in OP, the bone's repair capacity is impaired, delaying the healing of bone defects.¹⁵⁸ In this context, spatiotemporal drug release offers a potential therapeutic strategy for osteoporotic fractures. Lee *et al.*¹²⁴ designed a biomimetic scaffold that rapidly releases anti-inflammatory SP during the early stages of fracture healing. The sustained release of 4-hexylresorcinol promoted endothelial cell proliferation through MAPK signaling and inhibited osteoclastogenesis by disrupting the I κ B/NF- κ B signaling pathway. The sequential release of SP and 4-hexylresorcinol endowed the scaffold with multiple osteogenic abilities in the osteoporotic microenvironment, significantly promoting femoral defect healing in OVX rats.

Another study grafted ALN, a drug that inhibits osteoclast activity, onto the surface of microspheres, while parathyroid hormone, which promotes osteogenesis, was loaded into the internal cavity of the microspheres. The spatiotemporal, sustained release of these drugs effectively suppressed osteoclast activity while stimulating osteogenesis, providing an effective treatment for osteoporotic bone defects in OVX rats.¹⁵⁹

Treating large segmental bone defects also remains a formidable clinical challenge.¹³¹ Autologous bone grafts are considered the “gold standard” for treatment; however, they are limited by donor site morbidity and a scarcity of donor

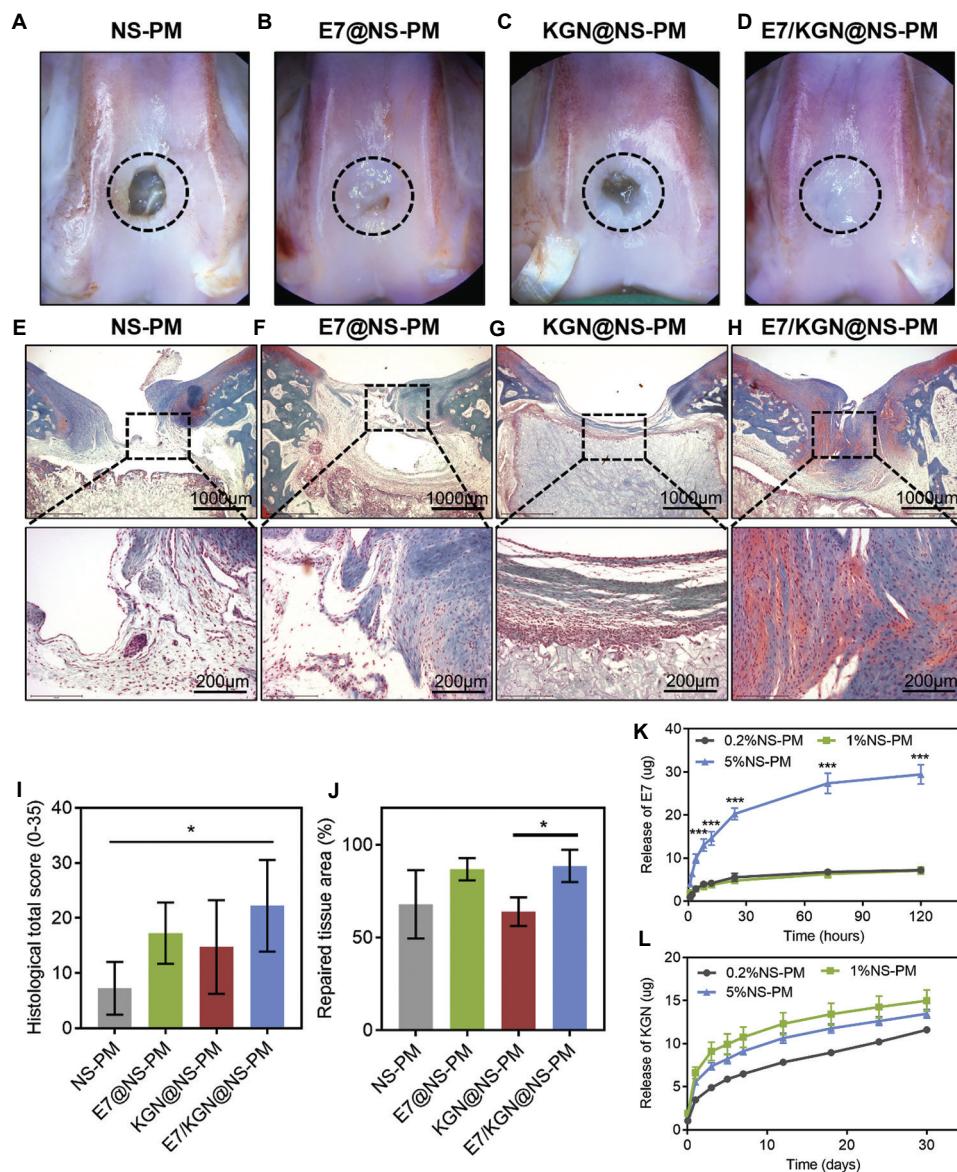


Figure 7. Spatiotemporal delivery strategy enhancing cartilage defect repair in rabbit models. (A-D) Macroscopic morphology of joint specimens collected 12 weeks post-surgery. Black circles indicate the boundaries of the original defect. (E-H) Safranine-O staining images. The bottom panels show higher magnification images of the corresponding black boxes in the top panels. Scale bars = 1,000 μ m (top panels), 200 μ m (bottom panels). (I) Histological evaluation according to the established histological scoring system. (J) Quantification of the repair tissue area as a percentage of the total defect area. (K and L) Cumulative E7 and kartogenin (KGN) release from SF nanosphere matrices at 37 C. * p <0.05, ** p <0.01. Reprinted from Zhang *et al.*¹²⁸ Copyright 2020 Authors.

Notes: E7@NS-PM: E7-loaded nanosphere-porous matrix; E7/KGN@NS-PM: E7/KGN-loaded nanosphere-porous matrix; KGN@NS-PM: KGN-loaded nanosphere-porous matrix; NS-PM: Unloaded nanosphere-incorporated matrix.

sites, severely restricting their use. Although allografts are less limited by supply, they present challenges related to the risk of disease transmission and immune rejection, which limit their clinical success.¹³¹ In this context, spatiotemporal drug release represents a potential strategy for treating large bone defects. A study demonstrated that a composite scaffold, which released the chemokine PDGF-BB to recruit and proliferate endogenous stem cells in the early stages, followed by the long-term release of KGN to promote MSC chondrogenesis, effectively promoted the healing of large bone defects in critical-sized rabbit knee joint defects.¹²⁷

6.2.2. Clinical translation challenges and mitigation strategies

Despite these advancements, clinical studies remain limited. Several challenges hinder clinical translation, including the complexity of design and fabrication processes, as well as the low bioactivity of certain materials. Current spatiotemporally controlled release systems have made progress in fundamental research, achieving effective release of multiple small molecules. However, challenges persist in achieving precise temporal control over drug release and reducing the *in vivo* immunogenicity of carrier materials. Consequently, the clinical translation of spatiotemporal strategy remains in its early stages.

The functional requirements for spatiotemporally controlled release of small molecule drug materials are as follows: (i) the ability to effectively load multiple small molecules; (ii) precise recognition of target tissues *in vivo*; (iii) the ability to release small molecules in an ordered manner within target tissues to achieve therapeutic concentrations during the treatment window; (iv) minimal drug leakage during non-treatment periods; and (v) good bioactivity. These complex requirements lead to intricate design and fabrication processes, contributing to the complexity of production and high manufacturing costs. These factors hinder large-scale production and clinical translation. At present, nanodrug delivery systems and prodrug strategies show promise in meeting these criteria while minimizing challenges in clinical translation and application.¹⁶⁰

6.2.3. Nanodrug delivery systems

In recent years, human serum albumin (HSA) has been widely explored as a multifunctional nanodrug delivery system in biomedical applications due to its superior biodegradability, biocompatibility, non-toxicity, and non-immunogenicity. The advantages of using HSA as a carrier for small molecules include: (i) its inherent biocompatibility as an endogenous substance; (ii) its unique spatial structure and abundant surface functional groups that provide strong drug-loading capacity; (iii) the ability to significantly extend the half-life of drugs in circulation; and (iv) its ability to protect exogenous drugs from enzymatic degradation, thereby reducing drug leakage. Although this approach offers unique advantages, there are still unresolved issues and mechanisms to explore. First, while HSA-based nanodrug delivery systems have proven effective in cancer treatment, their efficacy in other biomedical disease models remains to be validated. Second, how HSA can covalently conjugate drugs for controlled release at the target site and subsequent transport pathways requires further investigation.¹⁶¹

6.2.4. Prodrug strategies

Nanodrugs typically consist of a small amount of active drug components and carrier materials, which have long been used to improve pharmacokinetics and biodistribution, enhance therapeutic efficacy, and reduce side effects. However, the low drug-loading capacity inevitably requires the use of excess carrier materials to deliver the desired active pharmaceutical dose, posing an additional burden on patients, particularly when repeated dosing is required. Prodrug nanodrugs can increase bioavailability through chemical modification of small molecule drugs, enabling spatiotemporal control of drug release and activation. Amphiphilic prodrugs, which involve modifying hydrophobic/hydrophilic drugs into amphiphilic prodrugs capable of self-assembling into nanostructures, have emerged as a convenient method for manufacturing nanodrugs. This amphiphilic prodrug strategy offers several advantages, including minimal use of inert carrier materials, well-characterized prodrug structures, high and stable drug-loading rates, and controlled drug release without explosive release. These advantages facilitate the faster clinical translation of self-assembled small molecule nanodrugs.^{162,163}

The therapeutic mechanisms of small molecule drugs in fracture healing primarily involve the regulation of key signaling pathways related to bone metabolism. We expect that the research and application of these strategies will enable the spatiotemporal release of small molecule drugs in fracture healing, allowing for precise and effective modulation of signaling pathways while minimizing systemic side effects, thereby maximizing medical benefits for patients.

7. Small molecule drug screening: Strategies and AI integration

Drug screening refers to the process of evaluating compounds for their bioactivity, pharmacological effects, and therapeutic potential. This process can be categorized into experimental screening and virtual screening. Experimental screening involves standardized laboratory procedures to identify bioactive compounds from a large pool of small molecules, whereas virtual screening employs computational methods to preselect molecules most likely to bind target proteins, significantly reducing the number of compounds requiring experimental validation. Advancements in screening technologies have expanded beyond traditional methods – such as activity-based screening and high-throughput screening (HTS) – to more advanced approaches, including structure-based virtual screening (SBVS), ligand-based virtual screening (LBVS), and DNA-encoded compound libraries (DEL). These innovations have significantly broadened the market potential of small-molecule drugs.

AI, defined as a technological framework for simulating human intelligence through computational systems, has emerged as a valuable tool in the design and development of small-molecule drugs. AI-driven approaches enable the rapid screening of vast numbers of small molecules, significantly reducing the cost and time compared with traditional drug discovery.¹⁶⁴ The number of small molecules discovered through AI methods has risen exponentially, paralleling the output of conventional methods by 2022, with AI-discovered drugs demonstrating higher

success rates in Phase I clinical trials compared to the historical industry average.¹⁶⁵ This section focuses on the screening strategies of small molecule drugs, with particular emphasis on the integration and applications of AI in this field.

7.1. HTS and AI integration

HTS employs automated platforms to conduct large-scale experimental assays, enabling rapid data collection and computational analysis to identify lead compounds. Its advantages include high standardization, automation, sensitivity, and minimal sample consumption. However, HTS is constrained by high screening costs and extended processing times.

A recent HTS study utilized OPCs as *in vivo* probes, employing dual-parameter screening based on phosphorylated Akt signaling (indicative of cell survival and growth) and OPC-binding affinity. This approach successfully identified two osteogenic small molecules, YLL3 and YLL8, which enhanced osteogenic differentiation in OPCs and accelerated femoral fracture healing.¹⁶⁶ Another study leveraged a human extended pluripotent stem cell-derived cartilage organoid model equipped with dual fluorescent reporters, COL2A1-mCherry and COL10A1-eGFP, to monitor chondrogenesis and hypertrophy in real time. This platform identified the α 2-adrenergic receptor antagonist phentolamine as a potent enhancer of chondrocyte differentiation. *In vivo* studies in murine and mini-pig cartilage defect models further demonstrated phentolamine's ability to promote hyaline cartilage regeneration.¹⁶⁷

The integration of AI with HTS addresses several inherent challenges, including high false-positive rates, data imbalance, and low screening efficiency. Machine learning algorithms improve the predictive accuracy and reliability of HTS by assigning weighted scores to data points based on their importance, thereby reducing unnecessary validation experiments and enhancing screening efficiency.¹⁶⁸ Furthermore, AI-driven Bayesian active learning has revolutionized combinatorial drug screening by dynamically adjusting experimental designs based on iterative feedback, maximizing information gain while overcoming the combinatorial explosion of experimental conditions – a fundamental limitation of HTS in multi-drug synergy studies.¹⁶⁹

7.2. SBVS and AI integration

SBVS utilizes computational tools to identify small molecules that optimally interact with 3D structures of biological targets. Compared to traditional HTS, SBVS offers significantly improved hit rates and reduced costs while enabling precise predictions of receptor-ligand binding interactions. However, its reliance on complete structural data of target proteins limits its applicability, and it does not inherently predict the pharmacodynamic properties of identified compounds.

SBVS has facilitated the discovery of novel therapeutic agents in bone metabolism research. For example, a series of 3-acetylindole derivatives were identified as selective inhibitors of bromodomain and PHD finger-containing protein1 bromodomains, which are effective targets for inhibiting RANKL activity. Further experiments revealed that compound 18 displayed the highest *in vitro* efficacy without

cytotoxicity in osteoclast precursor cells.¹⁷⁰ Molecular docking and molecular dynamics (MD) simulations are important components of SBVS. Molecular docking simulates and predicts intermolecular interactions, while MD simulations calculate binding energies to verify the effective binding of proteins to small molecule ligands.¹⁷¹ For instance, molecular docking successfully identified seven compounds as fibroblast growth factor receptor 3 binders, a target positively associated with osteogenesis, and MD simulations confirmed that compound 14977614 exhibited the most stable binding. Treating organ-cultured mouse skulls with 14977614 enhanced mineralization and upregulated bone formation markers.¹⁷² Similarly, five anti-TNF α lead-like complexes were identified through molecular docking, and further MD simulations revealed the stability of these small molecules in a dynamic state, confirming their ability to bind to and antagonize TNF α .¹⁷³

Recent AI-driven advancements in SBVS have further enhanced predictive accuracy and efficiency. Zhou *et al.*¹⁷⁴ developed Rosetta virtual screening, which integrated flexible sidechain modeling and limited backbone adjustments to improve docking accuracy. In addition, Gentile *et al.*¹⁷⁵ introduced the Deep Docking platform, which iteratively refined docking predictions for a subset of a chemical library while using ligand-based predictions to estimate docking scores for the remaining dataset. This approach enables efficient screening of billion-scale molecular libraries without excessive computational resource demands.

7.3. LBVS and AI integration

LBVS is employed when structural data of a biological target are unavailable. Instead, it analyzes known ligands with specific binding affinities to infer the structural features of potential lead compounds. Its advantages include shorter development timelines and the ability to discover novel small-molecule drugs; however, it is generally less accurate than SBVS.¹⁷⁶

Zhao *et al.*¹⁷⁷ employed LBVS to screen anti-OP drugs and summarized chemical assembly rules, based on which they identified a series of potential compounds. Among them, compound 10a exhibited the most significant inhibition of RANKL-induced osteoclast differentiation and effectively prevented bone loss in OVX rats. Three-dimensional quantitative structure–activity relationship (3D-QSAR) is an important tool in LBVS, as it elucidates the structural characteristics and physicochemical properties of molecules related to their biological activity. Through 3D-QSAR, the characteristic structure of TGF β I receptor inhibitors was identified, leading to the identification of seven lead molecules, which exhibited superior docking scores compared to standard TGF β I receptor inhibitors (SB431542 and galunisertib).¹⁷⁸

The integration of AI with LBVS has further advanced drug discovery. One study introduced the Molecular Prediction Model Fine-Tuning approach, which was pre-trained on a dataset of one million unlabeled molecules to learn molecular representations before being fine-tuned on various QSAR tasks using smaller chemical datasets with specific endpoints.¹⁷⁹ AI integration also facilitates the identification of novel drug candidates. For instance, chemical language

models utilize Simplified Molecular Input Line Entry System strings to explicitly describe ligand molecular structures. These models learn the intrinsic features of these strings and generate customized sequences that meet pre-defined design requirements, enhancing the efficiency of LBVS.¹⁸⁰

7.4. DEL and AI integration

DEL technology enables HTS of small molecules by tagging compounds with unique DNA barcodes. By analyzing the DNA tags, researchers can efficiently identify high-affinity small molecules from libraries containing billions of compounds, offering substantial time and cost advantages. However, DEL screening presents technical challenges, including the complexity of DNA-conjugated molecules and uncertainties regarding selection specificity.

To date, DEL technology has not been applied to small molecule screening for fracture healing. The first DEL-identified clinical candidate was GSK2256294, an inhibitor of soluble epoxide hydrolase, a target implicated in cardiovascular and anti-inflammatory processes. Previous attempts using HTS and fragment-based drug discovery failed to yield viable lead compounds, but screening an 800-million-compound DEL library identified a triazine compound with promising activity, which was ultimately optimized into GSK2256294.¹⁸¹ Phase I trials confirmed its safety and tolerability (NCT01762774, NCT02262689), and it is currently undergoing a Phase IIa clinical trial for diabetic complications (NCT03486223).

AI integration has further refined DEL screening precision. Suo *et al.*¹⁸² demonstrated that Graph Convolutional Network, Message Passing Neural Network, and Attentive FP outperform traditional machine learning models, such as random forests, in DEL-based screening. A hybrid joint model combining these AI approaches improved predictive accuracy. Furthermore, a co-model integrating DEL affinity and photocross-linking screening data dynamically adjusted weights based on dataset characteristics, yielding optimized small molecule candidates with lower molecular weights and enhanced modification potential.

8. Limitations

Despite the comprehensive scope of this review, several limitations must be acknowledged. Due to space constraints, we were unable to provide an in-depth discussion of small-molecule drug delivery systems. The review mainly focuses on the most extensively studied signaling pathways involved in fracture healing, and other potentially relevant pathways were not covered. Furthermore, while temporal strategies for small molecules in fracture healing show promise, they have yet to be clinically translated, and the number of studies on this topic remains limited.

9. Conclusions

In summary, this review highlights the spatiotemporal delivery of small-molecule drugs as a novel strategy for enhancing fracture healing. The spatiotemporal strategy offers a promising approach to achieving precise control over the healing process, improving therapeutic efficacy while minimizing adverse effects. Future research should focus on

refining these strategies to address current clinical challenges, ultimately providing cost-effective and efficient therapeutic solutions for bone defects and fractures.

Acknowledgement

None.

Financial support

This work was supported by the National Key Research and Development Program of China (2023YFB3813000), the National Natural Science Foundation of China (T2121004, 92268203), the Key R&D Program of Zhejiang (2024SSYS0027), and the Zhejiang Provincial Natural Science Foundation of China (No. LTGY23H060009).

Conflicts of interest statement

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

Author contributions

Conceptualization: JZ; Validation: JZ; Visualization: HS; Writing – original draft: HS and ZW; Writing – editing & review: HS, ZH, ZX, and BCH.

All authors have seen and approved the final version of the manuscript.

Ethics approval and consent to participate

Not applicable.

Consent for publication

Not applicable.

Availability of data

Not applicable.

Open access statement

This is an open access journal, and articles are distributed under the terms of the Creative Commons Attribution-NonCommercial-ShareAlike 4.0 License, which allows others to remix, tweak, and build upon the work non-commercially, as long as appropriate credit is given and the new creations are licensed under the identical terms. Important, ancillary information, which is relevant to the parent article but cannot (and does not) appear in the print (or online) version of the journal. It may comprise additional tables, data sets, figures, movie files, audio clips, 3D structures, and other related non-essential multimedia files.

References

- Wildemann B, Ignatius A, Leung F, *et al.* Non-union bone fractures. *Nat Rev Dis Primers.* 2021;7:57. doi: 10.1038/s41572-021-00289-8
- Marongiu G, Contini A, Cozzi Lepri A, Donadu M, Verona M, Capone A. The treatment of acute diaphyseal long-bones fractures with orthobiologics and pharmacological interventions for bone healing enhancement: A systematic review of clinical evidence. *Bioengineering (Basel).* 2020;7:22. doi: 10.3390/bioengineering7010022
- James AW, LaChaud G, Shen J, *et al.* A review of the clinical side effects of Bone morphogenetic protein-2. *Tissue Eng Part B Rev.* 2016;22:284-297. doi: 10.1089/ten.TEB.2015.0357
- Lo KWH. Effects on bone regeneration of single-dose treatment with osteogenic small molecules. *Drug Discov Today.* 2022;27:1538-1544. doi: 10.1016/j.drudis.2022.02.020
- Lo KWH, Jiang T, Gagnon KA, Nelson C, Laurencin CT. Small-molecule based musculoskeletal regenerative engineering. *Trends Biotechnol.* 2014;32:74-81. doi: 10.1016/j.tibtech.2013.12.002
- Dong QY, Wan ZQ, Li Q, *et al.* 3D-printed near-infrared-light-responsive on-demand drug-delivery scaffold for bone regeneration. *Biomater Adv.* 2024;159:213804. doi: 10.1016/j.bioadv.2024.213804
- Claes L, Recknagel S, Ignatius A. Fracture healing under healthy and inflammatory conditions. *Nat Rev Rheumatol.* 2012;8:133-143. doi: 10.1038/nrrheum.2012.1
- Maruyama M, Rhee C, Utsunomiya T, *et al.* Modulation of the inflammatory response and bone healing. *Front Endocrinol (Lausanne).* 2020;11:386.

doi: 10.3389/fendo.2020.00386

9. Saul D, Khosla S. Fracture healing in the setting of endocrine diseases, aging, and cellular senescence. *Endocr Rev*. 2022;43:984-1002.
doi: 10.1210/endrev/bnac008

10. Ying J, Ge Q, Hu S, et al. Amygdalin promotes fracture healing through TGF- β /Smad signaling in mesenchymal stem cells. *Stem Cells Int*. 2020;2020:8811963.
doi: 10.1155/2020/8811963

11. Gerstenfeld LC, Cho TJ, Kon T, et al. Impaired intramembranous bone formation during bone repair in the absence of tumor necrosis factor-alpha signaling. *Cells Tissues Organs*. 2001;169:285-294.
doi: 10.1159/000047893

12. Yao Q, He L, Bao C, Yan X, Ao J. The role of TNF- α in osteoporosis, bone repair and inflammatory bone diseases: A review. *Tissue Cell*. 2024;89:102422.
doi: 10.1016/j.tice.2024.102422

13. Cai L, Lv Y, Yan Q, Guo W. Cytokines: The links between bone and the immune system. *Injury*. 2024;55:111203.
doi: 10.1016/j.injury.2023.111203

14. Guo J, Wang F, Hu Y, et al. Exosome-based bone-targeting drug delivery alleviates impaired osteoblastic bone formation and bone loss in inflammatory bowel diseases. *Cell Rep Med*. 2023;4:100881.
doi: 10.1016/j.xcrm.2022.100881

15. Hankenson KD, Gagne K, Shaughnessy M. Extracellular signaling molecules to promote fracture healing and bone regeneration. *Adv Drug Deliv Rev*. 2015;94:3-12.
doi: 10.1016/j.addr.2015.09.008

16. Ming Z, Vining B, Bagheri-Fam S, Harley V. SOX9 in organogenesis: Shared and unique transcriptional functions. *Cell Mol Life Sci*. 2022;79:522.
doi: 10.1007/s00018-022-04543-4

17. Wang H, Qi L, Shema C, Jiang K, et al. Advances in the role and mechanism of fibroblasts in fracture healing. *Front Endocrinol (Lausanne)*. 2024;15:135095815.
doi: 10.3389/fendo.2024.1350958

18. Apte RS, Chen DS, Ferrara N. VEGF in signaling and disease: Beyond discovery and development. *Cell*. 2019;176:1248-1264.
doi: 10.1016/j.cell.2019.01.021

19. Grossi A, Lunger A, Burger MG, et al. VEGF dose controls the coupling of angiogenesis and osteogenesis in engineered bone. *NPJ Regen Med*. 2023;8:15.

20. Peng Y, Wu S, Li Y, Crane JL. Type H blood vessels in bone modeling and remodeling. *Theranostics*. 2020;10:426-36.
doi: 10.7150/thno.34126

21. Qin Q, Lee S, Patel N, et al. Neurovascular coupling in bone regeneration. *Exp Mol Med*. 2022;54:1844-9.
doi: 10.1038/s12276-022-00899-6

22. Pulkkinen HH, Kiema M, Lappalainen JP, et al. BMP6/TAZ-Hippo signaling modulates angiogenesis and endothelial cell response to VEGF. *Angiogenesis*. 2021;24:129-144.
doi: 10.1007/s10456-020-09748-4

23. Benedito, R, Roca, C, Sörensen, I, et al. The notch ligands Dll4 and Jagged1 have opposing effects on angiogenesis. *Cell*. 2009;137:1124-1135.
doi: 10.1016/j.cell.2009.03.025

24. Liang, S.T, Chen, J.R, Tsai, J.J, Lai, Y.H, Hsiao, C.D. Overexpression of Notch signaling induces hyperosteogeny in Zebrafish. *Int J Mol Sci*. 2019;20:3613.
doi: 10.3390/ijms20153613

25. Osathanon, T, Manokawinchoke, J, Sa-Ard-Iam, N, Mahanonda, R, Pavasant, P, Suwanwela, J. Jagged1 promotes mineralization in human bone-derived cells. *Arch Oral Biol*. 2019;99:134-140.
doi: 10.1016/j.archoralbio.2019.01.013

26. Lee SY, Long F. Notch signaling suppresses glucose metabolism in mesenchymal progenitors to restrict osteoblast differentiation. *J Clin Invest*. 2018;128:5573-5586.
doi: 10.1172/JCI96221

27. Lawal RA, Zhou X, Batey K, et al. The Notch ligand Jagged1 regulates the osteoblastic lineage by maintaining the osteoprogenitor pool. *J Bone Miner Res*. 2017;32:1320-1331.
doi: 10.1002/jbmr.3106

28. Hilton MJ, Tu X, Wu X, et al. Notch signaling maintains bone marrow mesenchymal progenitors by suppressing osteoblast differentiation. *Nat Med*. 2008;14:306-314.
doi: 10.1038/nm1716

29. Canalis E, Grossman TR, Carrer M, Schilling L, Yu J. Antisense oligonucleotides targeting Notch2 ameliorate the osteopenic phenotype in a mouse model of Hajdu-Cheney syndrome. *J Biol Chem*. 2020;295:3952-3964.
doi: 10.1074/jbc.RA119.011440

30. Lowery JW, Rosen V. The BMP pathway and its inhibitors in the skeleton. *Physiol Rev*. 2018;98:2431-2452.
doi: 10.1152/physrev.00028.2017

31. Omi M, Konuru T, Lyu Y, Haraguchi A, Kamiya N, Mishina Y. Increased BMP-Smad signaling does not affect net bone mass in long bones. *Front Physiol*. 2023;14:1145763.
doi: 10.3389/fphys.2023.1145763

32. Seong CH, Chiba N, Kusuyama J, et al. Bone morphogenetic protein 9 (BMP9) directly induces Notch effector molecule Hes1 through the SMAD signaling pathway in osteoblasts. *FEBS Lett*. 2021;595:389-403.
doi: 10.1002/1873-3468.14016

33. Wu, Z, Li, W, Jiang, K, et al. Regulation of bone homeostasis: Signaling pathways and therapeutic targets. *MedComm* (2020). 2024;5:e657.
doi: 10.1002/mco.2.657

34. Jann J, Gascon S, Roux S, Faucheu N. Influence of the TGF- β superfamily on osteoclasts/osteoblasts balance in physiological and pathological bone conditions. *Int J Mol Sci*. 2020;21:7597.
doi: 10.3390/ijms21207597

35. Salazar VS, Gamar L, Rosen V. BMP signalling in skeletal development, disease and repair. *Nat Rev Endocrinol*. 2016;12:203-221.
doi: 10.1038/nrendo.2016.12

36. Wu M, Chen G, Li YP. TGF- β and BMP signaling in osteoblast, skeletal development, and bone formation, homeostasis and disease. *Bone Res*. 2016;4:16009.
doi: 10.1038/boneres.2016.9

37. Wang Z, Sun J, Li Y, et al. Experimental study of the synergistic effect and network regulation mechanisms of an applied combination of BMP-2, VEGF, and TGF- β 1 on osteogenic differentiation. *J Cell Biochem*. 2020;121:2394-2405.
doi: 10.1002/jcb.29462

38. Elsafadi M, Shinwari T, Al-Malki S, et al. Convergence of TGF β and BMP signaling in regulating human bone marrow stromal cell differentiation. *Sci Rep*. 2019;9:4977.
doi: 10.1038/s41598-019-41543-0

39. Yao H, Zou Y, Yang K, Yin L, Liu Y, Li R. TGF β 1 induces bone formation from BMP9-activated bone mesenchymal stem cells, with possible involvement of non-canonical pathways. *Int J Med Sci*. 2020;17:1692-1703.
doi: 10.7150/ijms.45786

40. Yuan G, Zhan, Y, Gou, X, Chen, Y, Yang, G. TGF- β signaling inhibits canonical BMP signaling pathway during palate development. *Cell Tissue Res*. 2018;371:283-291.
doi: 10.1007/s00441-017-2757-y

41. Kong X, Yan K, Deng P, et al. LncRNA-Smad7 mediates cross-talk between Nodal/TGF- β and BMP signaling to regulate cell fate determination of pluripotent and multipotent cells. *Nucleic Acids Res*. 2022;50:10526-10543.
doi: 10.1093/nar/gkac780

42. Xu J, Liu J, Gan Y, et al. High-Dose TGF- β 1 impairs mesenchymal stem cell-mediated bone regeneration via Bmp2 inhibition. *J Bone Miner Res*. 2020;35:167-180.
doi: 10.1002/jbmr.3871

43. Choy MHV, Wong RMY, Chow SKH, et al. How much do we know about the role of osteocytes in different phases of fracture healing? A systematic review. *J Orthop Translat*. 2020;21:111-121.
doi: 10.1016/j.jot.2019.07.005

44. Chan WCW, Tan Z, To MKT, Chan D. Regulation and role of transcription factors in osteogenesis. *Int J Mol Sci*. 2021;22:5445.
doi: 10.3390/ijms22115445

45. Song D, He G, Shi Y, Ni J, Long F. Functional interaction between Wnt and Bmp signaling in periosteal bone growth. *Sci Rep*. 2021;11:10782.

doi: 10.1038/s41598-021-90324-1

46. Matsushita Y, Nagata M, Kozloff KM, et al. A Wnt-mediated transformation of the bone marrow stromal cell identity orchestrates skeletal regeneration. *Nat Commun.* 2020;11:332.
doi: 10.1038/s41467-019-14029-w

47. Nelson AL, Mancino C, Gao X, et al. β -catenin mRNA encapsulated in SM-102 lipid nanoparticles enhances bone formation in a murine tibia fracture repair model. *Bioact Mater.* 2024;39:273-286.
doi: 10.1016/j.bioactmat.2024.05.020

48. Oh WT, Yang YS, Xie J, et al. WNT-modulating gene silencers as a gene therapy for osteoporosis, bone fracture, and critical-sized bone defects. *Mol Ther.* 2023;31:435-453.
doi: 10.1016/j.ymthe.2022.09.018

49. Qiu W, Ma X, Lin X, et al. Deficiency of Macf1 in osterix expressing cells decreases bone formation by Bmp2/Smad/Runx2 pathway. *J Cell Mol Med.* 2020;24:317-327.
doi: 10.1111/jcmm.14729

50. Zhang Y, Zhao Y, Xie Z, Li M, Liu Y, Tu X. Activating Wnt/ β -Catenin signaling in osteocytes promotes osteogenic differentiation of BMSCs through BMP-7. *Int J Mol Sci.* 2022;23:16045.
doi: 10.3390/ijms232416045

51. Haffner-Luntzer M, Ragipoglu D, Ahmad M, et al. Wnt1 boosts fracture healing by enhancing bone formation in the fracture callus. *J Bone Miner Res.* 2023;38:749-764.
doi: 10.1002/jbmr.4797

52. Li J, Cui Y, Xu J, et al. Suppressor of fused restraint of Hedgehog activity level is critical for osteogenic proliferation and differentiation during calvarial bone development. *J Biol Chem.* 2017;292:15814-15825.
doi: 10.1074/jbc.M117.777532

53. Luzzi AJ, Ferrer X, Fang F, et al. Hedgehog activation for enhanced rotator cuff tendon-to-bone healing. *Am J Sports Med.* 2023;51:3825-3834.
doi: 10.1177/03635465231203210

54. Lu W, Zheng C, Zhang H, et al. Hedgehog signaling regulates bone homeostasis through orchestrating osteoclast differentiation and osteoclast-osteoblast coupling. *Cell Mol Life Sci.* 2023;80:171.
doi: 10.1007/s00018-023-04821-9

55. Kohara Y, Haraguchi R, Kitazawa R, Imai Y, Kitazawa S. Hedgehog inhibitors suppress osteoclastogenesis in *in vitro* cultures, and deletion of Smo in macrophage/osteoclast lineage prevents age-related bone loss. *Int J Mol Sci.* 2020;21:2745.
doi: 10.3390/ijms21082745

56. Sun J, Shin DY, Eiseman M, et al. SLTRK5 is a negative regulator of hedgehog signaling in osteoblasts. *Nat Commun.* 2021;12:4611.
doi: 10.1038/s41467-021-24819-w

57. Einhorn TA, Gerstenfeld LC. Fracture healing: Mechanisms and interventions. *Nat Rev Rheumatol.* 2015;11:45-54.
doi: 10.1038/nrrheum.2014.16

58. Siddiqui JA, Partridge NC. Physiological bone remodeling: Systemic regulation and growth factor involvement. *Physiology (Bethesda).* 2016;31:233-245.
doi: 10.1152/physiol.00061.2014

59. Kong YY, Yoshida H, Sarosi I, et al. OPGL is a key regulator of osteoclastogenesis, lymphocyte development and lymph-node organogenesis. *Nature.* 1999;397:315-323.

60. Tatsumi S, Ishii K, Amizuka N, et al. Targeted ablation of osteocytes induces osteoporosis with defective mechanotransduction. *Cell Metab.* 2007;5:464-475.
doi: 10.1016/j.cmet.2007.05.001

61. Lacey DL, Timms E, Tan HL, et al. Osteoprotegerin ligand is a cytokine that regulates osteoclast differentiation and activation. *Cell.* 1998;93:165-176.
doi: 10.1016/s0092-8674(00)81569-x

62. Marahleh A, Kitaura H, Ohori F, et al. TNF- α directly enhances osteocyte RANKL expression and promotes osteoclast formation. *Front Immunol.* 2019;10:2925.
doi: 10.3389/fimmu.2019.02925

63. Nam SY, Kim HY, Min JY, Kim HM, Jeong HJ. An osteoclastogenesis system, the RANKL/RANK signalling pathway, contributes to aggravated allergic inflammation. *Br J Pharmacol.* 2019;176:1664-1679.
doi: 10.1111/bph.14615

64. Place DE, Malireddi RKS, Kim J, Vogel P, Yamamoto M, Kanneganti TD. Osteoclast fusion and bone loss are restricted by interferon inducible guanylate binding proteins. *Nat Commun.* 2021;12:496.
doi: 10.1038/s41467-020-20807-8

65. Bolamperti S, Villa I, Rubinacci, A. Bone remodeling: An operational process ensuring survival and bone mechanical competence. *Bone Res.* 2022;10:48.
doi: 10.1038/s41413-022-00219-8

66. Zhang Q, Pan RL, Wang H, Wang JJ, Lu SH, Zhang M. Nanoporous titanium implant surface accelerates osteogenesis via the Piezo1/Acetyl-CoA/ β -catenin pathway. *Nano Lett.* 2024;24:8257-8267.
doi: 10.1021/acs.nanolett.4c01101

67. Suo J, Feng X, Li J, et al. VGLL4 promotes osteoblast differentiation by antagonizing TEADs-inhibited Runx2 transcription. *Sci Adv.* 2020;6:eaba4147.
doi: 10.1126/sciadv.aba4147

68. Zhang Z, Wang F, Huang X, et al. Engineered sensory nerve guides self-adaptive bone healing via NGF-TrkA signaling pathway. *Adv Sci (Weinh).* 2023;10:2206155.
doi: 10.1002/advs.202206155

69. Ahmad M, Krüger BT, Kroll T, et al. Inhibition of Cdk5 increases osteoblast differentiation and bone mass and improves fracture healing. *Bone Res.* 2022;10:33.
doi: 10.1038/s41413-022-00195-z

70. Zhang J, Zhao C, Sheng R, Lin K, Wang X, Zhang S. Construction of a hierarchical micro-/submicro-/nanostructured 3D-printed Ti6Al4V surface feature to promote osteogenesis: Involvement of sema7A through the ITGB1/FAK/ERK signaling pathway. *ACS Appl Mater Interfaces.* 2022;14:30571-3081.
doi: 10.1021/acsami.2c06454

71. Liu RX, Gu RH, Li ZP, et al. Trim21 depletion alleviates bone loss in osteoporosis via activation of YAP1/ β -catenin signaling. *Bone Res.* 2023;11:56.
doi: 10.1038/s41413-023-00296-3

72. Yan Y, Chen H, Zhang H, et al. Vascularized 3D printed scaffolds for promoting bone regeneration. *Biomaterials.* 2019;190-191:97-110.
doi: 10.1016/j.biomaterials.2018.10.033

73. Liu Y, Zhang Y, Zheng Z, et al. Incorporation of NGR1 promotes bone regeneration of injectable HA/nHAp hydrogels by anti-inflammation regulation via a MAPK/ERK signaling pathway. *Front Bioeng Biotechnol.* 2022;10:992961.
doi: 10.3389/fbioe.2022.992961

74. Marino S, Hannemann N, Bishop RT, et al. Anti-inflammatory, but not osteoprotective, effect of the TRAF6/CD40 inhibitor 6877002 in rodent models of local and systemic osteolysis. *Biochem Pharmacol.* 2022;195:114869.
doi: 10.1016/j.bcp.2021.114869

75. Kamal NH, Heikal LA, Ali MM, Aly RG, Abdallah OY. Development and evaluation of local regenerative biomimetic bone-extracellular matrix scaffold loaded with nano-formulated quercetin for orthopedic fractures. *Biomater Adv.* 2023;145:213249.
doi: 10.1016/j.bioadv.2022.213249

76. Feng L, Yang Z, Hou N, et al. Long non-coding RNA malat1 increases the rescuing effect of quercetin on TNF α -impaired bone marrow stem cell osteogenesis and ovariectomy-induced osteoporosis. *Int J Mol Sci.* 2023;24:5965.
doi: 10.3390/ijms24065965

77. Shah SR, Werlang CA, Kasper FK, Mikos AG. Novel applications of statins for bone regeneration. *Natl Sci Rev.* 2015;2:85-99.
doi: 10.1093/nsr/nwu028

78. Awale G, Kan HM, Laurencin CT, Lo KWH. Molecular mechanisms underlying the short-term intervention of forskolin-mediated bone regeneration. *Regen Eng Transl Med.* 2022;9:375-383.
doi: 10.1007/s40883-022-00285-8

79. Awale GM, Barajaa MA, Kan HM, et al. Regenerative engineering of long bones using the small molecule forskolin. *Proc Natl Acad Sci U S A.* 2023;120:e2219756120.
doi: 10.1073/pnas.2219756120

80. Menger MM, Bleimehl M, Bauer D, et al. Cilostazol promotes blood vessel formation and bone regeneration in a murine non-union model.

Biomed Pharmacother. 2023;168:115697.
doi: 10.1016/j.biopha.2023.115697

81. Menger MM, Emmerich M, Scheuer C, et al. Cilostazol stimulates angiogenesis and accelerates fracture healing in aged male and female mice by increasing the expression of PI3K and RUNX2. *Int J Mol Sci.* 2024;25:755.
doi: 10.3390/ijms25020755
82. Chen C, Yan S, Geng Z, Wang, Z. Fracture repair by IOX2: Regulation of the hypoxia inducible factor-1 α signaling pathway and BMSCs. *Eur J Pharmacol.* 2022;921:174864.
doi: 10.1016/j.ejphar.2022.174864
83. Liu H, Li K, Yi D, Ding Y, Gao Y, Zheng X. Deferoxamine-loaded chitosan-based hydrogel on bone implants showing enhanced bond strength and pro-angiogenic effects. *J Funct Biomater.* 2024;15:112.
doi: 10.3390/jfb15040112
84. Guo Q, Yang J, Chen Y, et al. Salidroside improves angiogenesis-osteogenesis coupling by regulating the HIF-1 α /VEGF signalling pathway in the bone environment. *Eur J Pharmacol.* 2020;884:173394.
doi: 10.1016/j.ejphar.2020.173394
85. Tao ZS, Li TL, Xu HG, Yang M. Hydrogel contained valproic acid accelerates bone-defect repair via activating Notch signaling pathway in ovariectomized rats. *J Mater Sci Mater Med.* 2021;33:4.
86. Alverdy AK, Pakvasa M, Zhao C, et al. Imiquimod acts synergistically with BMP9 through the Notch pathway as an osteoinductive agent *in vitro*. *Plast Reconstr Surg.* 2019;144:1094-1103.
doi: 10.1097/PRS.0000000000006159
87. Helmi SA, Rohani L, Zaher AR, El Hawary YM, Rancourt DE. Enhanced osteogenic differentiation of pluripotent stem cells via γ -secretase inhibition. *Int J Mol Sci.* 2021;22:5215.
doi: 10.3390/ijms22105215
88. Tang Z, Wei J, Yu Y, et al. γ -Secretase inhibitor reverts the Notch signaling attenuation of osteogenic differentiation in aged bone marrow mesenchymal stem cells. *Cell Biol Int.* 2016;40:439-447.
doi: 10.1002/cbin.10583
89. Najafi S, Barasa L, Huang SY, Yoganathan S, Perron JC. Discovery of a novel class of benzimidazoles as highly effective agonists of bone morphogenetic protein (BMP) receptor signaling. *Sci Rep.* 2022;12:12146.
doi: 10.1038/s41598-022-16394-x
90. Kim B, Lee JH, Jin WJ, Kim HH, Ha H, Lee ZH. Trapidil induces osteogenesis by upregulating the signaling of bone morphogenetic proteins. *Cell Signal.* 2018;49:68-78.
doi: 10.1016/j.cellsig.2018.06.001
91. Andracia Harrer J, Fulton TM, Sangadala S, et al. Local FK506 delivery induces osteogenesis in rat bone defect and rabbit spine fusion models. *Bone.* 2024;187:117195.
doi: 10.1016/j.bone.2024.117195
92. Sangadala S, Devereaux EJ, Presciutti SM, Boden SD, Willet NJ. FK506 induces ligand-independent activation of the bone morphogenetic protein pathway and osteogenesis. *Int J Mol Sci.* 2019;20:1900.
doi: 10.3390/ijms20081900
93. Klemmer VA, Khera N, Siegenthaler BM, Bhattacharya I, Weber FE, Ghayor C. Effect of N-Vinyl-2-Pyrrolidone (NVP), a bromodomain-binding small chemical, on osteoblast and osteoclast differentiation and its potential application for bone regeneration. *Int J Mol Sci.* 2021;22:11052.
doi: 10.3390/ijms22011052
94. Kuttappan S, Jo JI, Sabu CK, Menon D, Tabata Y, Nair MB. Bioinspired nanocomposite fibrous scaffold mediated delivery of ONO-1301 and BMP2 enhance bone regeneration in critical sized defect. *Mater Sci Eng C Mater Biol Appl.* 2020;110:110591.
doi: 10.1016/j.msec.2019.110591
95. Srinaath N, Balagangadharan K, Pooja V, Paarkavi U, Trishla A, Selvamurugan N. Osteogenic potential of zingerone, a phenolic compound in mouse mesenchymal stem cells. *Biofactors.* 2019;45:575-582.
doi: 10.1002/biof.1515
96. Gao Y, Zou Y, Sokolowskei D, et al. Nr4a1 enhances Wnt4 transcription to promote mesenchymal stem cell osteogenesis and alleviates inflammation-inhibited bone regeneration. *Mol Ther.* 2024;32:1479-1496.
doi: 10.1016/j.mtthe.2024.02.034
97. Senarath-Yapa K, Li S, Walmsley GG, et al. Small molecule inhibition of transforming growth factor beta signaling enables the endogenous regenerative potential of the Mammalian Calvarium. *Tissue Eng Part A.* 2016;22:707-720.
doi: 10.1089/ten.TEA.2015.0527
98. Shi A, Heinayati A, Bao D, et al. Small molecule inhibitor of TGF- β signaling enables robust osteogenesis of autologous GMSCs to successfully repair minipig severe maxillofacial bone defects. *Stem Cell Res Ther.* 2019;10:172.
doi: 10.1186/s13287-019-1281-2
99. Breathwaite E, Weaver J, Odanga J, Dela Pena-Ponce M, Lee JB. 3D Bioprinted osteogenic tissue models for *in vitro* drug screening. *Molecules.* 2020;25:3442.
doi: 10.3390/molecules25153442
100. Lee CS, Kim S, Fan J, Hwang HS, Aghaloo T, Lee M. Smoothened agonist sterosome immobilized hybrid scaffold for bone regeneration. *Sci Adv.* 2020;6:eaaaz7822.
doi: 10.1126/sciadv.aaz7822
101. Lee S, Shen J, Pan HC, et al. Calvarial defect healing induced by small molecule smoothened agonist. *Tissue Eng Part A.* 2016;22:1357-1366.
doi: 10.1089/ten.TEA.2016.0167
102. Rundle CH, Gomez GA, Pourteymoor S, Mohan S. Sequential application of small molecule therapy enhances chondrogenesis and angiogenesis in murine segmental defect bone repair. *J Orthop Res.* 2023;41:1471-1481.
doi: 10.1002/jor.25493
103. AlMuraikhi N, Binhamdan S, Alaskar H, et al. Inhibition of GSK-3 β enhances osteoblast differentiation of human mesenchymal stem cells through Wnt signalling overexpressing Runx2. *Int J Mol Sci.* 2023;24:7164.
doi: 10.3390/ijms24087164
104. Wang B, Khan S, Wang P, et al. A highly selective GSK-3 β inhibitor CHIR99021 promotes osteogenesis by activating canonical and autophagy-mediated Wnt signalling. *Front Endocrinol (Lausanne).* 2022;13:926622.
doi: 10.3389/fendo.2022.926622
105. Sangadala S, Kim CH, Fernandes LM, et al. Sclerostin small-molecule inhibitors promote osteogenesis by activating canonical Wnt and BMP pathways. *eLife.* 2023;12:e63402.
doi: 10.7554/eLife.63402
106. Li Z, Xing X, Gomez-Salazar MA, et al. Pharmacological inhibition of DKK1 promotes spine fusion in an ovariectomized rat model. *Bone.* 2022;162:116456.
doi: 10.1016/j.bone.2022.116456
107. Wu L, Pei X, Dou Q, et al. 3D printed calcium phosphate physiochemically dual-regulating pro-osteogenesis and antiosteolysis for enhancing bone tissue regeneration. *ACS Appl Mater Interfaces.* 2024;16:37007-37016.
doi: 10.1021/acsami.4c06318
108. Wu L, Luo Z, Liu Y, et al. Aspirin inhibits RANKL-induced osteoclast differentiation in dendritic cells by suppressing NF- κ B and NFATc1 activation. *Stem Cell Res Ther.* 2019;10:375.
doi: 10.1186/s13287-019-1500-x
109. Almasoud N, Binhamdan S, Younis G, et al. Tankyrase inhibitor XAV-939 enhances osteoblastogenesis and mineralization of human skeletal (mesenchymal) stem cells. *Sci Rep.* 2020;10:16746.
doi: 10.1038/s41598-020-73439-9
110. Kou Y, Li C, Yang P, et al. The W9 peptide inhibits osteoclastogenesis and osteoclast activity by downregulating osteoclast autophagy and promoting osteoclast apoptosis. *J Mol Histol.* 2022;53:27-38.
doi: 10.1007/s10735-021-10030-0
111. Sawa M, Wakitani S, Kamei N, Kotaka S, Adachi N, Ochi M. Local administration of WP9QY (W9) peptide promotes bone formation in a rat femur delayed-union model. *J Bone Miner Metab.* 2018;36:383-391.
doi: 10.1007/s00774-017-0852-5
112. Chen G, Goeddel DV. TNF-R1 signaling: A beautiful pathway. *Science.* 2002;296:1634-1635.
doi: 10.1126/science.1071924
113. Mo Q, Zhang W, Zhu A, Backman LJ, Chen J. Regulation of osteogenic differentiation by the pro-inflammatory cytokines IL-1 β and TNF- α : Current conclusions and controversies. *Hum Cell.* 2022;35:957-971.
doi: 10.1007/s13577-022-00711-7
114. Sun X, Xie Z, Ma Y, et al. TGF- β inhibits osteogenesis by upregulating

the expression of ubiquitin ligase SMURF1 via MAPK-ERK signaling. *J Cell Physiol*. 2018;233:596-606.
doi: 10.1002/jcp.25920

115. Stegen S, Carmeliet G. The skeletal vascular system-breathing life into bone tissue. *Bone*. 2018;115:50-58.
doi: 10.1016/j.bone.2017.08.022

116. Hu K, Olsen BR. The roles of vascular endothelial growth factor in bone repair and regeneration. *Bone*. 2016;91:30-38.
doi: 10.1016/j.bone.2016.06.013

117. Tzavlaiki K, Moustakas A. TGF- β signaling. *Biomolecules*. 2020;10:487.
doi: 10.3390/biom10030487

118. Shi Y, Massagué J. Mechanisms of TGF-beta signaling from cell membrane to the nucleus. *Cell*. 2003;113:685-700.
doi: 10.1016/s0092-8674(03)00432-x

119. Huang P, Nedelcu D, Watanabe M, et al. Cellular cholesterol directly activates smoothed in hedgehog signaling. *Cell*. 2016;166:1176.e14-1187.e14.
doi: 10.1016/j.cell.2016.08.003

120. Zhou H, Zhang L, Chen Y, Zhu CH, Chen FM, Li A. Research progress on the hedgehog signalling pathway in regulating bone formation and homeostasis. *Cell Prolif*. 2022;55:e13162.
doi: 10.1111/cpr.13162

121. Boyle WJ, Simonet WS, Lacey DL. Osteoclast differentiation and activation. *Nature*. 2003;423:337-342.
doi: 10.1038/nature01658

122. Xia Y, Jing X, Wu X, Zhuang P, Guo X, Dai H. 3D-printed dual-ion chronological release functional platform reconstructs neuro-vascularization network for critical-sized bone defect regeneration. *Chem Eng J*. 2023;465:143015.
doi: 10.1016/j.cej.2023.143015

123. Zhang W, Shi W, Wu S, et al. 3D printed composite scaffolds with dual small molecule delivery for mandibular bone regeneration. *Biofabrication*. 2020;12:035020.
doi: 10.1088/1758-5090/ab906e

124. Lee JK, Kim DS, Park SY, et al. Osteoporotic bone regeneration via plenished biomimetic PLGA scaffold with sequential release system. *Small*. 2024;20:e2310734.
doi: 10.1002/smll.202310734

125. Sun T, Meng C, Ding Q, et al. In situ bone regeneration with sequential delivery of aptamer and BMP2 from an ECM-based scaffold fabricated by cryogenic free-form extrusion. *Bioact Mater*. 2021;6:4163-4175.
doi: 10.1016/j.bioactmat.2021.04.013

126. Lee D, Wu Fuer M, Kim I, et al. Sequential dual-drug delivery of BMP-2 and alendronate from hydroxyapatite-collagen scaffolds for enhanced bone regeneration. *Sci Rep*. 2021;11:746.
doi: 10.1038/s41598-020-80608-3

127. Hao L, Tianyuan Z, Zhen Y, et al. Biofabrication of cell-free dual drug-releasing biomimetic scaffolds for meniscal regeneration. *Biofabrication*. 2021;14:015001.
doi: 10.1088/1758-5090/ac2cd7

128. Zhang W, Ling C, Zhang A, et al. An all-silk-derived functional nanosphere matrix for sequential biomolecule delivery and in situ osteochondral regeneration. *Bioact Mater*. 2020;5:832-843.
doi: 10.1016/j.bioactmat.2020.05.003

129. Xue S, Li X, Li S, et al. Bone fracture microenvironment responsive hydrogel for timing sequential release of cargoes. *Colloids Surf A Physicochem Eng Aspects*. 2021;629:127413.
doi: 10.1016/j.colsurfa.2021.127413

130. Zha K, Hu W, Xiong Y, et al. Nanoarchitecture-integrated hydrogel boosts angiogenesis-osteogenesis-neurogenesis tripling for infected bone fracture healing. *Adv Sci (Weinh)*. 2024;11:2406439.
doi: 10.1002/advs.202406439

131. Xu X, Song J. Segmental long bone regeneration guided by degradable synthetic polymeric scaffolds. *Biomater Transl*. 2020;1:33-45.
doi: 10.3877/cma.j.issn.2096-112X.2020.01.004

132. Bao F, Yi J, Liu Y, et al. Free or fixed state of nHAP differentially regulates hBMSC morphology and osteogenesis through the valve role of ITGA7. *Bioact Mater*. 2022;18:539-551.
doi: 10.1016/j.bioactmat.2022.03.016

133. Xiong Z, Hong F, Wu Z, et al. Gradient scaffolds for osteochondral tissue engineering and regeneration. *Chem Eng J*. 2024;498:154797.
doi: 10.1016/j.cej.2024.154797

134. Naghavi SA, Sun C, Hejazi M, et al. On the mechanical aspect of additive manufactured polyether-ether-ketone scaffold for repair of large bone defects. *Biomater Transl*. 2022;3:142-151.
doi: 10.12336/biomatertransl.2022.02.006

135. Deepanjali M, Prasad TS, Manodh P. Efficacy of simvastatin in bone regeneration after surgical removal of mandibular third molars. *Oral Maxillofac Surg*. 2023;27:427-432.
doi: 10.1007/s10006-022-01081-y

136. Diniz JA, Barbirato DS, Nascimento EHL, Pontual ADA, Dourado ACAG, Laureano Filho JR. Tomographic evaluation of the effect of simvastatin topical use on alveolar bone microarchitecture, pain and swelling after mandibular third molar extraction: A randomized controlled trial. *Clin Oral Investig*. 2022;26:3533-3545.
doi: 10.1007/s00784-021-04322-8

137. Maheshwaran KS, Banu RF, Kumar VA, Mohamed K. Comparative evaluation of simvastatin gel in enhancing periimplant osteoblastic activity during the osseointegration phase using bone scintigraphy: A prospective case-control double-blinded study. *Int J Oral Maxillofac Implants*. 2024;39:707-712.
doi: 10.11607/jomi.10741

138. Churilla BM, Perera S, Greenspan SL, Resnick NM, Kotlarczyk MP. Zoledronic acid and bone health in older adults with cognitive impairment. *Osteoporos Int*. 2022;33:293-298.
doi: 10.1007/s00198-021-06063-6

139. Hu Q, Wang Q, Liu F, Yao L, Zhang L, Chen G. Combination of calcitriol and zoledronic acid on PINP and β -CTX in postoperative patients with diabetic osteoporosis: A randomized controlled trial. *Dis Markers*. 2022;2022:6053410.
doi: 10.1155/2022/6053410

140. Riva A, Ronchi M, Petrangolini G, Bosisio S, Allegrini P. Improved oral absorption of quercetin from quercetin phytosome®, a new delivery system based on food grade lecithin. *Eur J Drug Metab Pharmacokinet*. 2019;44:169-177.
doi: 10.1007/s13318-018-0517-3

141. Van Houdt CIA, Gabbai-Armelin PR, Lopez-Perez PM, et al. Alendronate release from calcium phosphate cement for bone regeneration in osteoporotic conditions. *Sci Rep*. 2018;8:15398.
doi: 10.1038/s41598-018-33692-5

142. Della Bella E, Buetti-Dinh A, Licandro G, et al. Dexamethasone induces changes in osteogenic differentiation of human mesenchymal stromal cells via SOX9 and PPARG, but not RUNX2. *Int J Mol Sci*. 2021;22:4785.
doi: 10.3390/ijms22094785

143. Doorn J, Siddappa R, Van Blitterswijk CA, Boer J. Forskolin enhances in vivo bone formation by human mesenchymal stromal cells. *Tissue Eng Part A*. 2012;18:558-567.
doi: 10.1089/ten.tea.2011.0312

144. Daughton CG, Ruhoy IS. Lower-dose prescribing: Minimizing “side effects” of pharmaceuticals on society and the environment. *Sci Total Environ*. 2013;443:324-337.
doi: 10.1016/j.scitotenv.2012.10.092

145. Awale GM, Barajaa MA, Kan HM, Lo KWH, Laurencin CT. Single-dose induction of osteogenic differentiation of mesenchymal stem cells using a cyclic AMP activator, forskolin. *Regen Eng Transl Med*. 2023;9:97-107.
doi: 10.1007/s40883-022-00262-1

146. Liu M, Tan J, Li S, et al. Psoralen synergies with zinc implants to promote bone repair by regulating ZIP4 in rats with bone defect. *Biomater Res*. 2023;27:129.
doi: 10.1186/s40824-023-00472-w

147. Jiang M, Wang X, Lv B, et al. Psoralen induces hepatotoxicity by covalently binding to glutathione-S-transferases and the hepatic cytochrome P450. *Phytomedicine*. 2022;104:154165.
doi: 10.1016/j.phymed.2022.154165

148. Oryan A, Sahviev S. Effects of bisphosphonates on osteoporosis: Focus on zoledronate. *Life Sci*. 2021;264:118681.
doi: 10.1016/j.lfs.2020.118681

149. Chen Y, Zheng G, Bian Y, et al. Hybrid multilayer coating as the psoralen delivery vehicle promoting bone regeneration on titanium mesh scaffolds in a Posterolateral Spinal Fusion model. *Appl Mater Today*.

2022;28:101530.
doi: 10.1016/j.apmt.2022.101530

150. Boluk A, Guzelipek M, Savli H, Temel I, Ozişik HI, Kaygusuz A. The effect of valproate on bone mineral density in adult epileptic patients. *Pharmacol Res.* 2004;50:93-97.
doi: 10.1016/j.phrs.2003.11.011

151. Hakami T, O'Brien TJ, Petty SJ, et al. Monotherapy with levetiracetam versus older AEDs: A randomized comparative trial of effects on bone health. *Calcif Tissue Int.* 2016;98:556-565.
doi: 10.1007/s00223-016-0109-7

152. Krishnamoorthy G, Nair R, Sundar U, Kini P, Shrivastava M. Early predisposition to osteomalacia in Indian adults on phenytoin or valproate monotherapy and effective prophylaxis by simultaneous supplementation with calcium and 25-hydroxy vitamin D at recommended daily allowance dosage: A prospective study. *Neurol India.* 2010;58:213-219.
doi: 10.4103/0028-3886.63796

153. Oner N, Kaya M, Karasalihoglu S, Karaca H, Cetlik C, Tütüncüler F. Bone mineral metabolism changes in epileptic children receiving valproic acid. *J Paediatr Child Health.* 2004;40:470-473.
doi: 10.1111/j.1440-1754.2004.00431.x

154. Xie X, Cheng P, Hu L, et al. Bone-targeting engineered small extracellular vesicles carrying anti-miR-6359-CGGGAGC prevent valproic acid-induced bone loss. *Signal Transduct Target Ther.* 2024;9:24.
doi: 10.1038/s41392-023-01726-8

155. Li X, Li L, Wang D, et al. Fabrication of polymeric microspheres for biomedical applications. *Mater Horiz.* 2024;11:2820-2855.
doi: 10.1039/d3mh01641b

156. Navarro J, Clohessy RM, Holder RC, et al. *In vivo* evaluation of three-dimensional printed, keratin-based hydrogels in a porcine thermal burn model. *Tissue Eng Part A.* 2020;26:265-278.
doi: 10.1089/ten.TEA.2019.0181

157. Kim JH, Ryu CH, Chon CH, et al. Three months extended-release microspheres prepared by multi-microchannel microfluidics in beagle dog models. *Int J Pharm.* 2021;608:121039.
doi: 10.1016/j.ijpharm.2021.121039

158. Hao H, Teng P, Liu C, Liu G. The correlation between osteoporotic vertebral fracture and paravertebral muscle condition and its clinical treatment. *Nano Biomed Eng.* 2024;16:203-218.
doi: 10.26599/NBE.2024.9290051

159. Zhao Y, Kang H, Wu X, et al. Multifunctional scaffold for osteoporotic pathophysiological microenvironment improvement and vascularized bone defect regeneration. *Adv Healthc Mater.* 2023;12:e2203099.
doi: 10.1002/adhm.202203099

160. Li G, Sun B, Li Y, Luo C, He Z, Sun J. Small-molecule prodrug nanoassemblies: An emerging nanoplatform for anticancer drug delivery. *Small.* 2021;17:e2101460.
doi: 10.1002/smll.202101460

161. Li C, Zhang D, Pan Y, Chen B. Human serum albumin based nanodrug delivery systems: Recent advances and future perspective. *Polymers (Basel).* 2023;15:3354.
doi: 10.3390/polym15163354

162. Li, G, Sun, B, Li, Y, Luo, C, He, Z, Sun, J. Small-molecule prodrug nanoassemblies: An emerging nanoplatform for anticancer drug delivery. *Small.* 2021;17:e2101460.

163. Xiang J, Liu X, Yuan G, et al. Nanomedicine from amphiphilized prodrugs: Concept and clinical translation. *Adv Drug Deliv Rev.* 2021;179:114027.
doi: 10.1016/j.addr.2021.114027

164. Du Y, Jamasb AR, Guo J, et al. Machine learning-aided generative molecular design. *Nat Mach Intell.* 2024;6:589-604.
doi: 10.1038/s42256-024-00843-5

165. Jayatunga MK, Ayers M, Bruens L, Jayanth D, Meier C. How successful are AI-discovered drugs in clinical trials? A first analysis and emerging lessons. *Drug Discov Today.* 2024;29:104009.
doi: 10.1016/j.drudis.2024.104009

166. Jiang M, Liu R, Liu L, et al. Identification of osteogenic progenitor cell-targeted peptides that augment bone formation. *Nat Commun.* 2020;11:4278.
doi: 10.1038/s41467-020-17417-9

167. Wei X, Qiu J, Lai R, et al. A human organoid drug screen identifies α 2-adrenergic receptor signaling as a therapeutic target for cartilage regeneration. *Cell Stem Cell.* 2024;31:1813.e8-1830.e8.
doi: 10.1016/j.stem.2024.09.001

168. Hesse J, Boldini D, Sieber SA. Machine learning-driven data valuation for optimizing high-throughput screening pipelines. *J Chem Inf Model.* 2024;64:8142-8152.
doi: 10.1021/acs.jcim.4c01547

169. Tosh C, Tec M, White JB, et al. A Bayesian active learning platform for scalable combination drug screens. *Nat Commun.* 2025;16:156.
doi: 10.1038/s41467-024-55287-7

170. Zhang W, Ning R, Ran T, et al. Development of 3-acetylindole derivatives that selectively target BRPF1 as new inhibitors of receptor activator of NF- κ B ligand (RANKL)-Induced osteoclastogenesis. *Bioorg Med Chem.* 2023;96:117440.
doi: 10.1016/j.bmc.2023.117440

171. Fu H, Chen H, Blazhynska M, et al. Accurate determination of protein: Ligand standard binding free energies from molecular dynamics simulations. *Nat Protoc.* 2022;17:1114-1141.
doi: 10.1038/s41596-021-00676-1

172. Mohan S, Muthusamy K, Nagamani S, Kesavan C. Computational prediction of small molecules with predicted binding to FGFR3 and testing biological effects in bone cells. *Exp Biol Med (Maywood).* 2021;246:1660-1667.
doi: 10.1177/15353702211002181

173. Velmurugan Y, Natarajan SR, Chakkrapani N, Jayaraman S, Madhukar H, Venkatachalam R. *In silico* and *in vitro* studies for the identification of small molecular inhibitors from *Euphorbia hirta* Linn for rheumatoid arthritis: Targeting TNF- α -mediated inflammation. *Mol Divers.* 2024;29:1189-1206.
doi: 10.1007/s11030-024-10900-1

174. Zhou G, Rusnac DV, Park H, et al. An artificial intelligence accelerated virtual screening platform for drug discovery. *Nat Commun.* 2024;15:7761.
doi: 10.1038/s41467-024-52061-7

175. Gentile F, Yaacoub JC, Gleave J, et al. Artificial intelligence-enabled virtual screening of ultra-large chemical libraries with deep docking. *Nat Protoc.* 2022;17:672-697.
doi: 10.1038/s41596-021-00659-2

176. Gupta R, Srivastava D, Sahu M, Tiwari S, Ambasta RK, Kumar P. Artificial intelligence to deep learning: Machine intelligence approach for drug discovery. *Mol Divers.* 2021;25:1315-1360.
doi: 10.1007/s11030-021-10217-3

177. Zhao C, Huang D, Li R, et al. Identifying novel anti-osteoporosis leads with a chemotype-assembly approach. *J Med Chem.* 2019;62:5885-5900.
doi: 10.1021/acs.jmedchem.9b00517

178. Ajay Kumar TV, Athavan AAS, Loganathan C, Saravanan K, Kabilan S, Parthasarathy V. Design, 3D QSAR modeling and docking of TGF- β type I inhibitors to target cancer. *Comput Biol Chem.* 2018;76:232-244.
doi: 10.1016/j.compbiochem.2018.07.011

179. Li X, Fourches D. Inductive transfer learning for molecular activity prediction: Next-Gen QSAR Models with MolPMoFiT. *J Cheminform.* 2020;12:27.
doi: 10.1186/s13321-020-00430-x

180. Moret M, Pachon Angona I, Cotos L, et al. Leveraging molecular structure and bioactivity with chemical language models for *de novo* drug design. *Nat Commun.* 2023;14:114.
doi: 10.1038/s41467-022-35692-6

181. Peterson AA, Liu DR. Small-molecule discovery through DNA-encoded libraries. *Nat Rev Drug Discov.* 2023;22:699-722.
doi: 10.1038/s41573-023-00713-6

182. Suo Y, Qian X, Xiong Z, et al. Enhancing the predictive power of machine learning models through a chemical space complementary DEL screening strategy. *J Med Chem.* 2024;67:18969-18980.
doi: 10.1021/acs.jmedchem.4c01416

Received: December 10, 2024

Revised: February 19, 2025

Accepted: March 11, 2025

Available online: April 30, 2025