ORIGINAL RESEARCH ARTICLE



Using Real-World Data to Inform Value-Based Contracts for Cell and Gene Therapies in Medicaid

Antal Zemplenyi^{1,2} · Jim Leonard³ · Michael J. DiStefano¹ · Kelly E. Anderson¹ · Garth C. Wright¹ · Nicholas D. Mendola¹ · Kavita Nair¹ · R. Brett McQueen¹

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Abstract

Objective High upfront costs and long-term benefit uncertainties of gene therapies challenge Medicaid budgets, making value-based contracts a potential solution. However, value-based contract design is hindered by cost-offset uncertainty. The aim of this study is to determine actual cost-offsets for valoctocogene roxaparvovec (hemophilia A) and etranacogene dezaparvovec (hemophilia B) from Colorado Medicaid's perspective, defining payback periods and its uncertainty from the perspective of Colorado Medicaid.

Methods This cost analysis used 2018–2022 data from the Colorado Department of Health Care Policy & Financing to determine standard-of-care costs and employed cost simulation models to estimate the cost of Medicaid if patients switched to gene therapy versus if they did not. Data encompassed medical and pharmacy expenses of Colorado Medicaid enrollees. Identified cohorts were patients aged 18+ with ICD-10-CM codes D66 (hemophilia A) and D67 (hemophilia B). Severe hemophilia A required \geq 6 claims per year for factor therapies or emicizumab, while moderate/severe hemophilia B necessitated \geq 4 claims per year for factor therapies. Patients were included in the cohort in the year they first met the criteria and were subsequently retained in the cohort for the duration of the observation period. Standard-of-care included factor VIII replacement therapy/emicizumab for hemophilia A and factor IX replacement therapies for hemophilia B. Simulated patients received valoctocogene roxaparvovec or etranacogene dezaparvovec. Main measures were annual standard-of-care costs, cost offset, and breakeven time when using gene therapies.

Results Colorado Medicaid's standard-of-care costs for hemophilia A and B were \$426,000 [standard deviation (SD) \$353,000] and \$546,000 (SD \$542,000) annually, respectively. Substituting standard-of-care with gene therapy for eligible patients yielded 8-year and 6-year average breakeven times, using real-world costs, compared with 5 years with published economic evaluation costs. Substantial variability in real-world standard-of-care costs resulted in a 48% and 59% probability of breakeven within 10 years for hemophilia A and B, respectively. Altering eligibility criteria significantly influenced breakeven time.

Conclusions Real-world data indicates substantial uncertainty and extended payback periods for gene therapy costs. Utilizing real-world data, Medicaid can negotiate value-based contracts to manage budget fluctuations, share risk with manufacturers, and enhance patient access to innovative treatments.

1 Background

The Food and Drug Administration (FDA) has approved over twenty cell and gene therapies (CGT) [1, 2], with expectations of over fifty product indication approvals by 2030 [3, 4]. For state Medicaid programs to qualify for Centers for Medicare and Medicaid Services (CMS) mandated drug rebates, states must cover all nonexcluded FDA-approved therapies from manufacturers that have a mandatory rebate agreement in place with CMS [5]. Many patients affected by diseases targeted by CGTs, such as rare genetic disorders, will depend on Medicaid to access treatment, as Medicaid covers 28% [6] of the US population. As a result, the substantial costs associated with CGTs [3] pose a significant burden on Medicaid's budget.

In most cases, CGT requires a single course of treatment for long-term improvement rather than a lifetime of continuous treatment. Therefore, instead of many smaller payments spread over time for chronic therapy, Medicaid programs face a large one-time payment for a CGT. As CGTs are relatively new and evolving treatments, long-term implications

Extended author information available on the last page of the article

Key Points for Decision Makers

Using real-world data, our study generates markedly different break-even time estimates compared with those obtained from published literature based on clinical trials and cost-effectiveness analyses.

We highlight the impact of varying eligibility criteria on cost offsets and breakeven time, emphasizing the importance of carefully defining treatment and coverage criteria in the context of value-based contracts.

Our study underscores the considerable cost variation in alternative treatments to cell and gene therapies, adding to the uncertainty surrounding breakeven time estimation and highlighting the importance of addressing them in value-based contracts.

for patients are still being evaluated [7-10]. Additionally, since many CGTs receive expedited regulatory approval, evidence often stems from limited clinical trial populations and restricted time frames [8, 10]. High upfront payments, coupled with uncertainties in the durability of the benefit, shift the financial risk of paying for a potentially failing therapy to the payer. CGTs have the potential to generate considerable cost offsets for Medicaid by eliminating the necessity for costly standard care. Nevertheless, this outcome can only be attained over an extended duration, during which the savings gradually accrue, offsetting the initial high expense of the CGT (breakeven time). Variations in cost offsets, especially with time lag involved, create uncertainty for Medicaid and state decision-makers when projecting budgets. These challenges faced by Medicaid decision-makers necessitate a different payment approach to accommodate the pipeline of CGTs.

Value-based contracts (VBCs) are innovative payment models to link reimbursement to a treatment's real-world performance. VBCs between Medicaid and the manufacturer are a way to spread costs over time based on the therapy's performance, thus alleviating potential budget shocks and ensuring financial risk is shared between Medicaid and the manufacturer [11, 12]. However, key uncertainties may impact negotiations between payers and manufacturers to establish VBCs. A crucial area of uncertainty, extensively discussed in the literature [8–11], relates to long-term durability of the beneficial treatment effect (durability of effect) of CGTs, which influences overall cost of disease management, as higher costs may be incurred when patients fail on a CGT and are forced to switch back to standard of care.

An under-discussed source of uncertainty for developing VBCs include: (1) the heterogeneity in the real-world costs of standard of care (i.e., what was spent by Medicaid in actual costs versus cost estimation in economic evaluations driven by medication usage recommended in clinical guidelines) and (2) how the definition of eligibility criteria for covering gene therapy utilization may influence real-world cost estimates, which then impacts magnitude of cost offsets and breakeven time. While this relationship is not clear from economic evaluations, it can have a large impact on the extent of cost offset achieved by replacing standard of care with a new CGT. To address this uncertainty, incorporating real-world data becomes essential. Such data provides retrospective insights into the real costs paid by Medicaid, the distribution of costs, and the relationship between eligibility and cost offsets. This information serves as the foundation for accurately assessing the financial risk associated with choosing CGT over standard of care so that Medicaid agencies can negotiate risk-neutral or financially beneficial VBCs.

For our study, we selected two CGTs for in-depth investigation to demonstrate how real-world cost data can be used to inform the design of VBCs for CGTs. Etranacogene dezaparvovec received FDA approval in the second half of 2022 [13, 14]. It has a list price of \$3.5 million and targets moderate and severe hemophilia B in adults. Valoctocogene roxaparvovec has a list price of \$2.9 million and is designed to treat severe hemophilia A in adults; it received FDA approval in July 2023 [15, 16].

This study aims to demonstrate how real-world data (RWD)-based cost estimates can inform the design of VBCs, using a case study of hemophilia A and B CGTs, estimating the true expected cost savings, and appropriately defining the payback period and its uncertainty from the perspective of Colorado Medicaid.

2 Methods

To employ RWD-based cost estimates to inform the design of VBCs for CGTs, we first compared the real-world cost of hemophilia A and B treatment for Colorado Medicaid enrollees with literature-based cost estimates commonly used in economic evaluations. This comparison aimed to identify any substantial differences in the magnitude and variation of costs. Next, we assessed how the utilization of RWD influenced the results of cost simulations, specifically comparing the cost of standard care with the cost of gene therapy. Additionally, we examined the relationship between eligibility criteria, the proportion of patients eligible for gene therapy, and the breakeven time associated with utilizing gene therapy instead of standard care.

2.1 Identifying Literature-Based Cost Estimates

Cost estimates used in economic evaluations were identified by a targeted review of the literature. We retrieved economic evaluations related to hemophilia A and B from the Tufts Cost-Effective Analysis (CEA) registry [17] and excluded studies published over 10 years ago because the treatment landscape and spending on these disease areas have changed considerably since. Additionally, we searched the Institute for Clinical and Economic Review [18] website to find economic evaluations that specifically compared the CGTs of interest against standard of care. From economic evaluations we reviewed, we extracted key cost inputs, including resource utilization and unit costs, that had a substantial impact on the overall expenses of the standard of care. The health benefits (including quality-adjusted life years) were not extracted from the economic evaluations reviewed and have not been used in any way in this study. For hemophilia A and B, the primary cost is factor replacement therapy, which involves regular infusion of clotting factor concentrates or use of bispecific monoclonal antibody (emicizumab). These account for more than 90% of total cost of prophylaxis in patients without factor inhibitors [19-21].

2.2 Real-World Cost Estimation

We accessed the Colorado Department of Health Care Policy & Financing (HCPF) database to extract cost data for Medicaid-enrolled patients diagnosed with paid claims for hemophilia A and B using ICD-10-CM codes. The data spanned from 2018 to 2022. The analysis focused on actual care, determined based on disease-related prescriptions and medical procedure codes (Online Resource 1). Extracted data included age, sex, treatment, number of claims, and the total amount paid by Medicaid.

To estimate average cost of standard of care as a reference point in our analysis, we identified cohorts of patients aged 18+ who were potentially eligible for CGTs. The use of specific ICD-10-CM codes (D66 for hemophilia A and D67 for hemophilia B) was not sufficient for precise identification of patients with severe hemophilia A and B (who would be eligible for the new CGTs) as the codes encompass all cases of the disease, including various severity levels. To address this, we used criteria from recent studies [19, 22]. Croteau et al. [19] suggest that the criterion of four or more claims per year captures patients regularly filling prescriptions for factor concentrate on 90-day supply. Shorter schedules (e.g., 60-day or 30-day supply) would require more frequent claims. The algorithm suggested by Buckner et al. [22] recommends four to five factor claims for moderate-to-severe profile and six or more claims for severe profile patients. We adopted these criteria for our base case analysis. Severe hemophilia A was defined as having a minimum of six claims of factor replacement therapies or emicizumab per year, while moderate and severe hemophilia B required at least four claims of factor replacement therapies to reflect regular prophylaxis. Patients were included in the cohort in the year they first met the criteria and were subsequently retained in the cohort for the duration of the observation period. We conducted sensitivity analyses around the definition of the eligible population to identify how the frequency of factor (and emicizumab) utilization influences annual costs. By pooling individual patient-level costs within identified cohorts, we derived estimates of average costs of care for these specific groups. All costs were reported in 2022 US dollars and adjusted for healthcare cost inflation [23].

2.3 Cost Simulation Model

In Microsoft Excel, we constructed two-state partitioned survival models (alive, dead) for conducting cost simulations in the context of hemophilia A and B. We compared the costs of standard care and CGT over a lifetime horizon. We accounted for durability of effect of CGT and assumed that patients would revert to standard of care if CGT was ineffective. We validated the models by using the inputs from the literature and comparing the results to the cost estimates generated by models in the literature [24, 25]. One of the authors (R.B.M), who was not directly involved in the model's development, conducted a thorough review of the model. We used assumptions from the literature regarding the durability of the effect and assigned an increasing probability of switching to standard care per year, such that 50% of patients with hemophilia A switched after 11 years [24] and 20% of patients with hemophilia B switched 25.5 years after infusion [26]. The inputs used in the model are listed in Table 1. The model considered two scenarios incorporating treatment costs from different sources: (1) findings from a literature review and (2) results from a cost analysis using RWD from the HCPF database. A probabilistic sensitivity analysis was conducted by varying the cost of standard care using the standard deviation of actual costs. To determine probability of breakeven at 5 years and 10 years, a Monte Carlo simulation with 1000 trials was run, employing probabilistic value of the standard-of-care cost as input. Further information on the cost simulation model, including model structure and key assumptions can be found in Online Resources 2 and 3.

3 Results

3.1 Annual Costs of Standard Care in Economic Evaluations

Table 2 presents the annual costs of factor VIII, emicizumab, and factor IX therapies in economic evaluations for

Table 1 Model inputs

Description	Value in the model	Source
Hemophilia A specific inputs		
Valoctocogene roxaparvovec cost, one time	\$2,900,000	[29]
Actual annual cost of standard of care	\$426,347	Analysis of HCPF claims data 2018-2022
Literature based annual cost of standard of care	\$659,052	Estimated based on literature (Table 2)
Valoctocogene roxaparvovec ABR per cycle	Time-dependent (0-2.52 per cycle)	[24]
Standard of care ABR per cycle	0.65	[24]
The proportion of gene therapy patients still on standard of care after 3 years	8%	[30]
Median durability	11 years	[24]
Hemophilia B specific inputs		
Etranacogene dezaparvovec cost, one time	\$3,500,000	[31]
Actual annual cost of standard of care	\$545,711	Analysis of HCPF claims data 2018-2022
Literature based annual cost of standard of care	\$688,941	Estimated based on literature (Table 2)
Etranacogene dezaparvovec ABR per cycle	0.42	[25]
Standard of care ABR per cycle	4.5	[25]
The proportion of patients switching per cycle (value calibrated to reach 20% at 25.5 years)	0.45%	[26]
Cost inputs in both models		
Drug costs of a bleed for an 81.4 kg male	\$7,253	[25]
Nondrug costs per bleed: ages 18-45	\$4,832	[25]
Nondrug costs per bleed: ages > 45	\$7,198	[25]
Infusion cost per bleed	\$533	[32]
Follow-up costs of patients with arthropathy per cycle	\$649	[25]
Probability of surgery (two per lifetime)	0.0175	[33]
Cost of surgery per event	\$46,932	[25]
Hemophilia-specific standardized mortality ratio	1.4	[34]
All-cause mortality for males	Age-dependent (0.001-0.097)	[35]

ABR annual bleed rate

hemophilia A and B. All studies were published in the last 5 years. Cost variations can be attributed to differences in the specific drug considered as standard care, assumptions made about dosage, frequency of use, the average weight of patients, and unit costs (refer to Online Resources 4 and 5).

3.2 Results of the Cost Analysis from Real-World Data

The study analyzed a cohort of 238 Colorado Medicaid patients with hemophilia A (ICD-10-CM code D66) between 2018–2022. Fifty-nine (25%) of them had at least one factor VIII or emicizumab claim in the study period (Table 3). The mean age of this cohort was 34.3 (SD 14.8) years. Patients with at least six claims for factor VIII or emicizumab (N = 36, 15%) had an annual mean cost of \$426,000 (SD \$353,000). The mean annual drug cost suggested by the literature (\$633,000) was only representative of about the top 5% of all patients with the highest costs. For further information regarding the distribution of patients and costs across different subgroups defined by resource utilization criteria, refer to Online Resources 6 and 7.

Between 2018–2022, a cohort of 54 patients with hemophilia B (ICD-10-CM code D67) was analyzed in the study (Table 3). The mean age of the cohort having at least one factor IX claim during that period was 33.5 (SD 12.9) years. Among patients with at least four claims for factor IX, the average annual cost was \$546,000 (SD \$542,000). The mean annual drug cost reported in the literature (\$689,000) was representative of approximately the top 13% of all patients with the highest costs. For more detailed information on the distribution of patients and costs across various subgroups based on resource utilization criteria, refer to Online Resources 8 and 9.

3.3 Results of the Cost-Simulations

The analysis reveals that based on the point estimate of realworld costs, the upfront cost of valoctocogene roxaparvovec

Table 2The annual cost offactor VIII, emicizumab, andfactor IX therapies in economicevaluations	Disease	Source	Year	Treatment	Annual cost
	Hemophilia A	Machin et al. [33]	2018	Recombinant FVIII	\$453,108
		Croteau et al. [19]	2019	Standard half-life FVIII	\$690,144
				Extended half-life FVIII	\$753,480
		Cook et al. [36]	2020	Standard half-life FVIII	\$917,442
		Rind et al. (ICER) [24]	2020	Advate	\$542,539
				Eloctate	\$858,026
				Factor VIII average ^a	\$633,462
				Emicizumab	\$569,105
		Tice et al. (ICER) [25]	2022	Emicizumab	\$639,543
	Hemophilia B	Croteau et al. [19]	2019	Standard half-life FIX	\$697,497
				Extended half-life FIX	\$1,015,560
		Bolous et al. [37]	2021	Alprolix	\$776,331
				Benefix	\$559,779
		Tice et al. (ICER) [25]	2022	Alprolix	\$744,303
				Benefix	\$565,391
				Idelvion	\$753,353
				Rebinyn	\$713,552
				Factor IX averageb	\$688,941

The economic evaluation literature demonstrates a diverse range of annual costs associated with factor VIII and factor IX replacement therapies for hemophilia A and hemophilia B, respectively. Factor VIII therapies in hemophilia A range from \$453,000 to \$917,000, with the most recent estimate of \$633,000 to \$640,000. In the case of hemophilia B, factor IX treatments' annual costs also vary, ranging from \$560,000 to \$1,016,000. The most recent estimate indicates an average cost of \$689,000

^aRind et al. [24] assumed proportions of 71.18% for Advate and 28.82% for Eloctate to calculate the average cost of factor VIII replacement therapies

^bTice et al. [25] considered proportions of 32.26% for Alprolix, 32.26% for BeneFix, 33.33% for Idelvion, and 2.15% for Rebinyn to determine the average cost of factor IX replacement therapies

Table 3 Characteristics and cost of patients with her	emophilia B between 2018 and 2022
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Cohort	Ν	Average age (SD)	Average annual cost (SD)
Hemophilia A			
Patients with claims	238	40.4 (16.6)	\$105,000 (\$246,000)
Patients with factor VIII or emicizumab utilization	59	34.3 (14.8)	\$298,000 (\$338,000)
Patients on prophylaxis (≥ 6 relevant claims per year)	36	30.8 (12.3)	\$426,000 (\$353,000)
Hemophilia B			
Patients with claims	54	36.8 (12.9)	\$151,000 (\$353,000)
Patients with factor IX utilization	< 30	33.5 (12.9)	\$301,000 (\$451,000)
Patients on prophylaxis (\geq 4 relevant claims per year)	< 30	30.6 (12.8)	\$546,000 (\$542,000)

Sample size below 30 and distribution by sex cannot be reported due to Medicaid's data protection regulation

to treat hemophilia A can be recouped in approximately 8 years, with a balance of – \$880,000 at 5 years and \$481,000 at 10 years. When accounting for uncertainty in these estimates through probabilistic sensitivity analysis, simulation results indicate a 23% probability of reaching breakeven within 5 years and a 48% probability within 10 years. In contrast, when employing literature-based cost inputs in the simulation, results indicate a projected return of \$191,000

over a 5-year period and \$2,246,000 over a 10-year period, with breakeven achieved in 5 years (Fig. 1).

Similarly, for etranacogene dezaparvovec, based on the point estimate of real-world costs, the upfront cost to treat hemophilia B was estimated to be recovered in approximately 6 years, with a balance of - \$429,000 at 5 years and \$2,490,000 at 10 years. When accounting for uncertainty in these estimates, simulation results show a 32% probability of reaching break-even within 5 years and a 59% probability

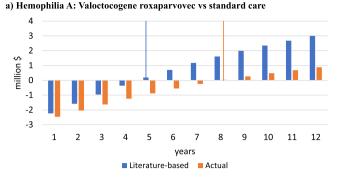


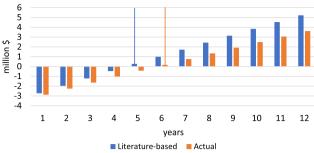
Fig. 1 Cumulative cost difference: gene therapy versus standard care estimated using real-world Medicaid data compared to estimates from the literature. These panels provide an overview of the long-term financial risk associated with upfront gene therapy payments. They illustrate the cumulative difference in treatment costs between gene therapy options and standard care. Moreover, they demonstrate how the estimated financial risk varies based on assumptions about the cost of standard care treatments. a Presents the cumulative difference in treatment costs between valoctocogene roxaparvovec and

within 10 years. In contrast, utilization of literature-based cost inputs in the simulation leads to projected returns of \$266,000 over a 5-year period and \$3,841,000 over a 10-year period. These findings also demonstrate a break-even point achieved in less than 5 years (Fig. 1).

By varying eligibility criteria for the CGT based on the number of claims of factor replacement therapy or emicizumab per year, the proportion of patients who would be eligible for the CGT and paid for through a VBC would vary, influencing the financial balance and probability of payback over 5 and 10 years (Table 4)

4 Discussion

Payers, such as state Medicaid programs and commercial insurers, face significant financial challenges in covering CGTs due to high upfront costs for these treatments and uncertain long-term effectiveness [3, 27]. Using a case study of paying for CGTs for hemophilia A and B for a state Medicaid program (Colorado), our study has three main findings that can inform how insurers determine coverage and negotiate payment rates for CGTs. First, using real-world data generates very different estimates of breakeven times relative to published literature on clinical trials and cost-effectiveness analyses. Second, estimated costs, cost offsets, and breakeven times depend upon the eligibility criteria for treatment, such as disease severity. Third, as CGTs are often used to treat relatively rare conditions, there is substantial variation in the cost of treatment prior to gene therapy, which increases uncertainty about breakeven time. To address the challenges of paying for CGTs, state Medicaid agencies, as well as some commercial payers, are considering alternative b) Hemophilia B: Etranacogene dezaparvovec vs standard care



standard care. This calculation is based on a literature-based estimate of \$633,000 per year, compared to the actual Medicaid costs of \$426,000 per year for standard care of patients with \geq 6 factor utilization. **b** Displays the cumulative difference in treatment costs between Etranacogene dezaparvovec and standard care. The estimation for Etranacogene dezaparvovec is based on a literature-based estimate of \$689,000 per year, while the actual Medicaid cost for standard care is \$546,000 per year of patients with \geq 4 factor utilization.

payment models such as VBCs to spread payment over time and tie payment to longer-term treatment performance. However, setting appropriate contract terms requires accurate estimates of the actual costs of the standard of care.

By comparing the impact of using actual or literaturebased cost inputs in the simulation, for hemophilia A and B, we find literature-based cost inputs for current treatments are higher. Medicaid real-world data indicate that only 5% of patients with hemophilia A and 13% of patients with hemophilia B are associated with the costs of standard care suggested by the economic evaluations (around \$633,000 for hemophilia A and \$689,000 for hemophilia B). This leads to an overly optimistic expectation regarding breakeven time and thus an underestimation of financial risks for the payer of covering CGT. This is likely because economic evaluations rely on cost estimates assuming protocol-based use of the drug and prices that do not reflect Medicaid payments. The reviewed economic evaluations (Online Resources 4 and 5) rely on medication protocols for dosage and frequency, patient weights based on US averages, and unit costs from sources such as Redbook and Medi-Span Price Rx Basic. The lower RWD costs might be attributed to several factors. Prices tend to fluctuate over time, whereas economic evaluations typically rely on constant prices. Additionally, existing literature often assumes complete adherence to prophylaxis, whereas our observations reveal variations in patient-level utilization. Furthermore, the types and share of factor therapies utilized in this study differ from the assumptions made in the literature.

Varying assumptions about eligibility for a CGT change estimated breakeven time and budget impact of paying for these therapies. While clinical expertise should inform the determination of eligibility criteria, VBCs should be Table 4Variation in theproportion of eligible patientsand financial outcomes forvaloctocogene roxaparvovecand etranacogene dezaparvovecacross different eligibilityscenarios

Eligibility, claims per year ^a	Reaching breakeven (years)	Balance, per patient		Probability of breakeven	
		5 years	10 years	5 years (%)	10 years (%)
Valoctocogene roxaparvovec	(hemophilia A)				
≥ 4	10	- \$1,048,548	\$187,315	18	40
≥ 5	9	- \$941,415	\$373,983	22	45
\geq 6 (base case)	8	- \$880,280	\$480,506	23	48
≥ 7	8	- \$828,862	\$570,098	25	50
≥ 8	7	- \$663,862	\$857,594	29	55
≥ 9	7	- \$479,092	\$1,179,540	30	58
≥ 10	6	- \$371,746	\$1,366,580	33	60
≥ 15	5	\$204,654	\$2,370,904	45	77
≥ 20	4	\$1,682,565	\$4,946,028	81	97
Etranacogene dezaparvovec	(hemophilia B)				
\geq 4 (base case)	6	- \$428,742	\$2,490,018	32	59
≥ 5	6	- \$428,742	\$2,490,018	32	60
≥ 6	6	- \$12,407	\$3,299,490	38	70
≥ 7	5	\$123,867	\$3,564,444	42	71
≥ 8	4	\$918,720	\$5,109,862	57	87
≥9	4	\$1,199,590	\$5,655,952	61	90
≥ 10	4	\$1,199,590	\$5,655,952	60	91
≥ 15	3	\$3,450,253	\$10,031,870	99	100
≥ 20	3	\$3,981,483	\$11,064,729	100	100

^aHemophilia A eligibility refers to the number of factor VIII or emicizumab claims; hemophilia B eligibility refers to the number of factor IX claims. The table presents eligibility thresholds (≥ 4 , ≥ 5 , ≥ 6 , etc.) based on the minimum claims per year for inclusion. It shows patient proportions for each threshold. "Reaching breakeven (years)" indicates the time to achieve zero or positive balance. Shorter times are more favorable. The "balance" column shows cumulative balance, negative for net costs and positive for savings. "Probability of breakeven" indicates the likelihood of reaching neutrality or savings in 5 or 10 years. Higher probabilities indicate greater chances of cost neutrality or savings

designed with consideration for the associated breakeven point, driven by the eligibility criteria. We used the requirement of at least six claims for factor therapies or emicizumab for individuals with hemophilia A and a minimum of four claims for factor therapies for hemophilia B to identify potentially eligible patients. For this population, the base case results suggest a longer payback period than what is indicated by cost estimates derived from the current body of literature. However, altering this criterion has significant implications for spending and the budget, leading to substantial impacts on estimated breakeven time and how Medicaid should structure VBCs.

State Medicaid agencies should also design VBCs to account for substantial variations in the costs of treatment that serve as alternatives to CGT. The magnitude of standard deviation we observed (83–99% of the mean cost) in hemophilia A and B aligns with the findings of previous studies utilizing claims data [30, 31]. This underscores the importance of accounting for cost variations in cost simulations, as point estimates in economic evaluations often fail to capture these variations adequately. Although our estimation suggests an average breakeven period of 8 and 6 years when providing gene therapy to patients with hemophilia A or B, respectively, taking into account uncertainty reveals that the likelihood of reaching breakeven within 10 years is approximately 48% for hemophilia A and 59% for hemophilia B. One option to address uncertainty is to pool risk with other state Medicaid programs by developing VBCs that encompass several states. The CMS Centers for Medicare & Medicaid Innovation (CMMI) will test a model to achieve this type of risk pooling, or states may independently choose to pool together [28]. A second option is to construct a more financially conservative VBC where reimbursement to the drug manufacturer is lower or a warranty for refund is set over a longer time period.

Our findings have direct implications for designing VBCs. In the examples provided for CGTs in hemophilia A or B, since the payment is made up front, Medicaid does not have the opportunity to link the payment to expected outcomes over time. A VBC ensures patient access to the gene therapy offering a payback or refund mechanism if the therapy does not deliver the expected results. To enter into a VBC, Medicaid must first understand the cost-offset potential of the CGT, which is a function of the uncertainty around eligibility for the CGT, and the heterogeneity in costs spent on usual care. A deep understanding of how these sources of uncertainty and heterogeneity can provide Medicaid with trade-offs when evaluating the terms of a VBC. For a generic example applicable to CGTs that have large cost offsets, these trade-offs may include higher (lower) refund amounts with shorter (longer) contract durations evaluated at varying levels of eligibility.

4.1 Limitations

Our analysis has certain limitations. The data we used was specific to Colorado, and therefore may not be representative of the experience of other state Medicaid plans. However, we believe the methodology is transferable to other states and can be used by other Medicaid organizations to design VBCs. The analysis did not account for loss to follow-up. Therefore, it should be acknowledged that savings projected in our simulations may not be fully realized by Medicaid only, as patients have the potential to switch to another payer, such as Colorado's state healthcare exchange or employersponsored insurance. These savings will then be realized at a broader health system level. We recognize that the number of factor claims does not necessarily correspond to the utilization of prophylactic therapy. If available for analysis, the total international units of factor replacement products administered during a specific timeframe may offer a more precise metric for use in value-based agreements. Nevertheless, based on the literature we have reviewed, the number of claims appears to serve as a reliable proxy for indicating the requirement for regular treatment (prophylaxis) and may be indicative of a more severe disease.

5 Conclusion

The rising number of approved CGTs and their high up-front costs pose significant challenges for Medicaid budgets. To address these challenges, VBCs have been proposed as a way to share financial risk between Medicaid and manufacturers. However, uncertainties regarding the durability of the effects of CGTs and the real-world costs of standard care create obstacles for establishing VBCs. Our study revealed three key findings that can assist states in constructing VBCs for CGTs. These findings were derived by comparing real-world cost data to literature-based estimates, analyzing cost variations, and evaluating the influence of eligibility criteria on cost offsets and breakeven time. First, real-world data yields substantially different breakeven time estimates compared with those derived from published clinical trials and costeffectiveness analyses. Second, estimated costs, cost offsets, and breakeven times are contingent upon treatment eligibility criteria, including factor utilization, which is a proxy for prophylaxis and disease severity. Third, given CGTs are

commonly employed for treating rare conditions, there is considerable variation in cost of treatment prior to CGT, which adds to uncertainty surrounding break-even time. In conclusion, incorporating real-world data into the design of VBCs for CGTs can provide Medicaid agencies with a more accurate understanding of costs and cost offsets associated with these therapies. By leveraging RWD, Medicaid can negotiate VBCs that mitigate budget shocks, share financial risk with manufacturers, and ensure patients have access to these innovative treatments.

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Declarations

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Authors and Affiliations

Antal Zemplenyi^{1,2} · Jim Leonard³ · Michael J. DiStefano¹ · Kelly E. Anderson¹ · Garth C. Wright¹ · Nicholas D. Mendola¹ · Kavita Nair¹ · R. Brett McQueen¹

Antal Zemplenyi antal.zemplenyi@cuanschutz.edu

- ¹ Skaggs School of Pharmacy and Pharmaceutical Sciences, University of Colorado Anschutz Medical Campus, Aurora, CO, USA
- ² Faculty of Pharmacy, Center for Health Technology Assessment and Pharmacoeconomic Research, University of Pecs, Pecs, Hungary
- ³ Colorado Department of Health Care Policy and Finance, Denver, CO, USA