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GLOBAL MACRO RESEARCH

TOP *of* MIND

2023: 3 THEMES IN CHARTS

In this very special Top of Mind year-end edition,
Charting the story of this year is our mission.
2023 wasn't just about Taylor's wildest dreams,
But also three important themes.

Markets worried first about growth, but then sticky inflation,
Which meant that higher interest rates could be here for the duration.
This **higher-for-longer rate environment** came with consequences galore,
Bringing bank panics, corporate credit concerns, and commercial real estate risks to the fore.

Notable **political and geopolitical developments** also occurred,
Like rising US-China tensions, which makes more decoupling all but assured.
The US hitting its debt limit, which, as usual, set off a political fight,
And the Israel-Hamas war, which thrust the Middle East back into the spotlight.

Amid all that, two **longer-term** questions attracted heated debate:
Can US economic and asset outperformance continue?
And is the potential of generative AI really that great?

We hope you find our favorite 2023 charts on these themes insightful,
And our annual crossword—which you can solve by reading our 2023 pieces—delightful.
Thank you for your readership, and hope your holidays are filled with joy and more,
We can't wait to engage with you again in 2024.

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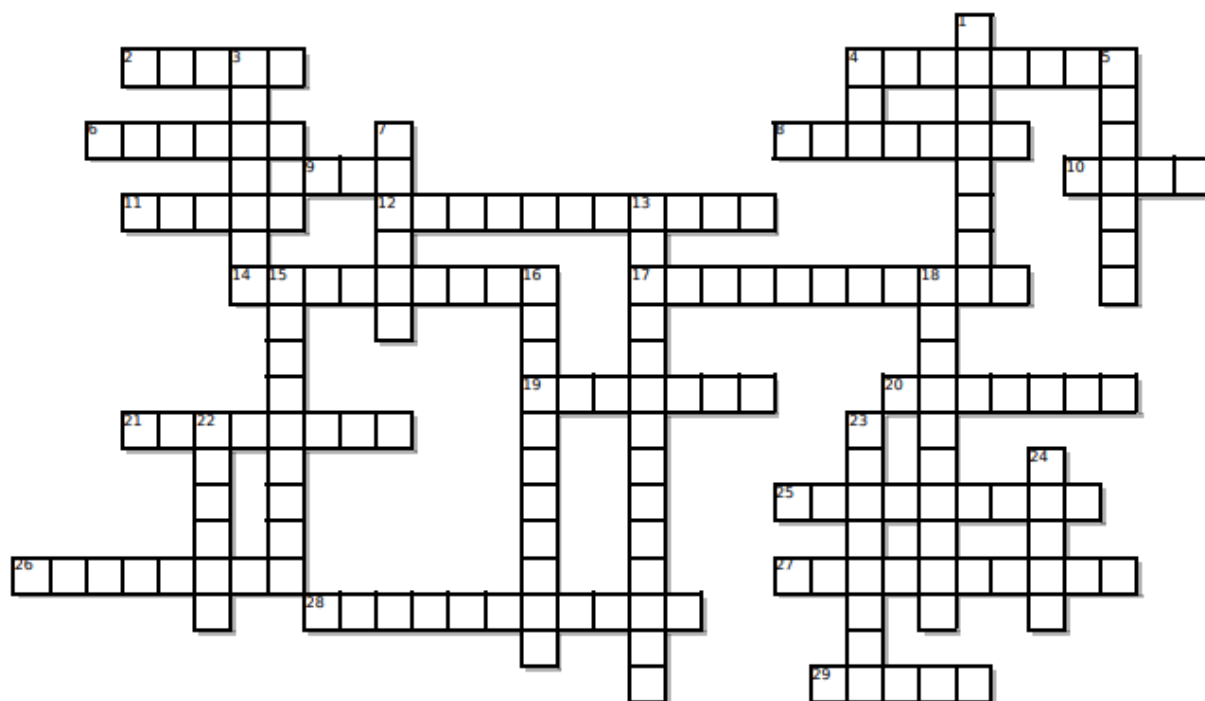
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The Goldman Sachs Group, Inc.

Revisiting 2023 themes, crossword-style



Across:

2. GS MENA economist Farouk Soussa warns that the current war in Gaza will pose challenges for regional economies, with, for example, tourism already hard hit in _____ (Issue 124).
4. GS Chief Global Equity Strategist Peter Oppenheimer argues that US equity outperformance over the last decade likely won't be _____ to the same extent over the next decade (Issue 123).
6. The US corporate debt _____ is relatively light today given that many companies took advantage of extraordinarily low interest rates in the post-GFC period to lock in cheap debt, according to GS US equity strategist Ben Snider (Issue 121).
8. NYU's Gary Marcus argues that we are very far from achieving artificial _____ intelligence (Issue 120).
9. Goldman Sachs economists find that the peak drag on US growth from a tightening in financial conditions occurs after _____ quarters, on average (Issue 115).
10. Heading into 2023, GS multi-asset strategist Christian Mueller-Glissmann made the case that _____ was not trash (Issue 116).
11. Columbia University's Takatoshi Ito characterized the BoJ's December 2022 yield curve control (YCC) adjustment as them putting on their _____ in preparation for exit from their very accommodative monetary policy stance (Issue 116).
12. RXR's Scott Rechler warns that current concerns around office real estate could eventually spread to the _____ sector (Issue 122).
14. The Carlyle Group's David Rubenstein argues that the most successful investors are ones that invest in _____ market conditions (Issue 115).
17. Management focus on _____ returns largely explains superior US equity performance since 2000, according to GS US equity strategists David Kostin and Lily Calcagnini (Issue 123).
19. The debt _____ is a rare feature of the US political system that potentially limits the ability of the executive branch to fund spending that it is legally obligated to spend (Issue 119).
20. The US budget deficit has roughly _____ over the past year (Issue 123).
21. The US Constitution grants the power of issuing debt solely to _____ (Issue 119).
25. GS EM strategist Tadas Gedminas makes the case that structural shifts in Israel's economy over the past two decades have left it more _____ to challenges than in the past (Issue 124).
26. Conviction's Sarah Guo says we're entering an era of "_____ 3.0" in which foundational large language models are now widely available, which makes gen AI technology more accessible and less expensive (Issue 120).
27. Columbia Business School's Stijn Van Nieuwerburgh believes that the crisis in the office real estate market is a _____ in slow motion (Issue 122).

28. BlackRock's Rick Rieder argues that the economy tends to follow the _____ curve over the medium term, only veering from it during periods of extraordinary monetary or fiscal stimulus or an exogenous shock, like the pandemic (Issue 116).
29. In the US, bank loans to the office real estate sector account for roughly _____ percent of total US bank loans (Issue 122).

Down:

1. A supply shock only changes a _____ price, whereas inflation is the phenomenon of all prices and wages rising together, according to Stanford Hoover Institution's John Cochrane (Issue 115).
3. Saba Capital Management's Boaz Weinstein warns that "amend and _____" cannot prevent defaults from eventually occurring (Issue 121).
4. The failure of SVB and Signature Bank was a classic bank _____ say Daniel Tarullo, former Chairman, Federal Reserve Board's Committee on Supervision and Regulation, and Yale's Gary Gorton (Issue 117).
5. David Beers, former Head of Sovereign Credit Ratings at Standard & Poor's, says it is not true that sovereigns can't _____ on their local currency debt (Issue 119).
7. GS credit strategists Michael Puempel and Ben Shumway find that so-called _____ firms—economically unviable firms that survive only thanks to cheap debt—represent only a sliver of US public debt markets (Issue 121).
13. Both Edward Djerejian, former US Ambassador to Israel and Syria, and Emile Hokayem, Director of Regional Security and Senior Fellow for Middle East Security at IISS, worry that a _____ could lead to a wider conflict in the Middle East (Issue 124).
15. A key debate that emerged from the failure of SVB and Signature Bank in March was whether the federal deposit _____ limit should be raised (Issue 117).
16. Harvard's Graham Allison argues that US-China competition today is a classic _____ rivalry, whereby a rapidly rising power is threatening to displace a major ruling power (Issue 118).
18. Rhodium Group's Daniel Rosen argues that the substantial daylight between the economic systems of the US and China means further _____ is likely (Issue 118).
22. _____ networks are mathematical models inspired by the human brain structure (Issue 120).
23. The cause of the 1Q23 US bank failures was an underlying duration _____ between the asset and liability sides of bank balance sheets, according to GS bank analyst Richard Ramsden (Issue 117).
24. A seminal moment in the semiconductor industry occurred in 2010 when _____ opened a chip manufacturing factory in Dalian, China, according to semiconductor industry veteran Richard Hill (Issue 118).

Puzzle made at www.puzzle-maker.com.

Solutions on pg. 41.

In the words of our 2023 interviewees

“Given the role that bank runs played in this episode—and especially the extraordinary speed of deposit outflows—I couldn’t agree more with the calls to review liquidity regulations.”

– Daniel K. Tarullo, former Chairman, Federal Reserve Board’s Committee on Supervision and Regulation

(Issue 117, April 3)

“It’s just not feasible for the US, China, or any place else for that matter to become self-sufficient in semiconductors.”

– Richard Hill, former Chairman of the Board, Marvell

Technology, former CEO and Chairman, Novellus Systems

(Issue 118, May 1)

“Four years ago, I joked that, should you ever find yourself in a situation where the robots are coming for you, just close the door. And it’s still true that robots can’t open doors... We are nowhere near achieving artificial general intelligence (AGI). Those who believe AGI is imminent are almost certainly wrong.”

– Gary Marcus, Professor Emeritus of Psychology and Neural Science,

New York University

(Issue 120, July 5)

“The potential for a miscalculation that turns the conflict into an all-out war remains significant; rational actors can make a strategic decision not to escalate and still become entangled in an escalatory spiral.”

– Emile Hokayem, Director of Regional Security and Senior Fellow for Middle East Security, International Institute for Strategic Studies

(Issue 124, December 5)

“All told, we feel pretty good about the possibility of a soft landing... Many sources of disinflation that we expect are “freebies”, in that they don’t require substantial economic weakness to play out.”

– Jan Hatzius, GS Chief Economist and Head of Global Investment Research

(Issue 115, January 27)

“We’re entering the era of what I think of as “Software 3.0”... companies don’t need to collect nearly as much training data, which suddenly makes [generative AI] technology much more useful, accessible, and less expensive.”

– Sarah Guo, Founder, Conviction, former General Partner, Greyllock

(Issue 120, July 5)

“A supply shock only changes a relative price. Inflation is the phenomenon of all prices and wages rising together, which comes from the government inducing more demand in the face of a supply shock.”

– John Cochrane, Senior Fellow, Hoover Institution at Stanford University

(Issue 115, January 27)

“Central banks can hold the line longer than many people believe. While I don’t agree with YCC and think that negative interest rates don’t make sense given the negative impacts of chronically low rates on capital formation, pension and banking systems, and the economy, I see no limit to the amount of JGBs the BoJ can buy. So, they can stick with the policy for a long time, even if it’s not good policy.”

– Rick Rieder, CIO of Global Fixed Income, BlackRock

(Issue 116, February 23)

“When a rapidly rising power threatens to displace a major ruling power, both become increasingly hostile toward the other... this is a classic Thucydidean rivalry... So, as I wrote in 2016: expect things to get worse before they get worse.”

– Graham Allison, Professor, Harvard University, former US Assistant Secretary of Defense

(Issue 118, May 1)

“Over the next couple of years, the CRE problem won’t just be an office problem—multifamily will almost certainly be an area of stress... all real estate assets will need to come to terms with the higher rate environment.”

– Scott Rechler, Chairman and CEO, RXR

(Issue 122, October 9)

“You can’t solve every problem with higher capital and liquidity requirements. Amid huge demand for safe assets, not enough of them exist to back up all short-term debt.”

– Gary Gorton, Professor, Yale School of Management

(Issue 117, April 3)

“Based on what I know, PE marks are more likely to rise than decline in 2023.”

– David Rubenstein, Co-Founder and Co-Chairman, The Carlyle Group

(Issue 115, January 27)

“It could easily take several years for the office market to stabilize, which is why I’ve referred to all this as a trainwreck in slow motion.”

– Stijn Van Nieuwerburgh, Professor of Real Estate and Finance, Columbia Business School

(Issue 122, October 9)

“The stress tests required under [Dodd-Frank], while valuable, were incorrectly thought to be more useful than understanding that we cannot predict where problems will come from and how they might evolve.”

– Thomas Hoenig, former President, Federal Reserve Bank of Kansas City and former Vice Chairman, FDIC

(Issue 117, April 3)

“Was the December [BoJ] shift actually the first step toward exit? I would say maybe it wasn’t the first step, but perhaps preparation for the first step; I would think of it as the BoJ putting on its shoes.”

– Takatoshi Ito, former Deputy Vice Minister for International Affairs, Japanese Ministry of Finance

(Issue 116, February 23)



“As often as I hear the phrase “amend and extend”, I hear “amend and pretend.” In many cases, financial creativity can be used to forestall the inevitable, but the inevitable ultimately happens.”

– Boaz Weinstein, Founder and CIO, Saba Capital Management

(Issue 121, August 10)

“We must dispense with the illusion that the Palestinian issue can be solved through economic or investment initiatives and return to the negotiating table on the basis of land-for-peace and the two-state solution, which is the only approach that would allow for a democratic Jewish state to peacefully and securely coexist alongside an independent Palestinian sovereign state.”

– Edward P. Djerejian, former US Ambassador to Israel and Syria, former US Assistant Secretary of State for Near Eastern Affairs

(Issue 124, December 5)

Note: All quotes came from interviews that appeared in GS Top of Mind reports in 2023.

Source: Goldman Sachs GIR.

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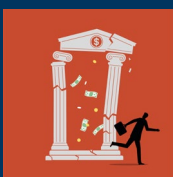
Markets worried first about growth

RECESSION
INFLATION
RECESSION
INFLATION



but then sticky inflation, which meant that higher interest rates could be here for the duration.

This higher-for-longer rate environment came with consequences galore



Bringing bank panics,

corporate credit concerns,



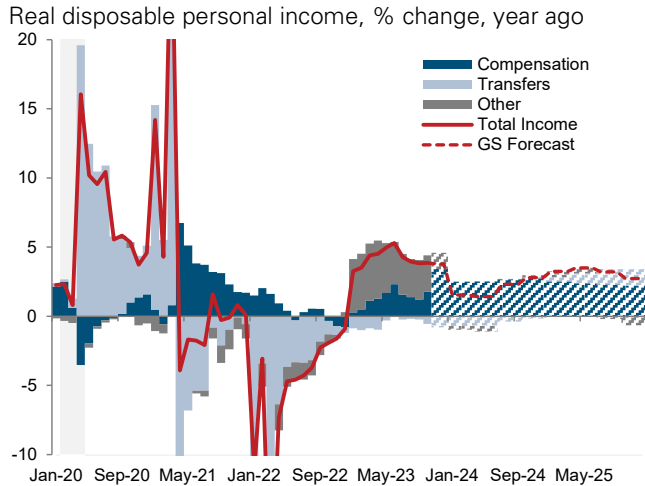
and commercial real estate risks to the fore.

Pgs. 5-17

Ample soft landing evidence (so far)

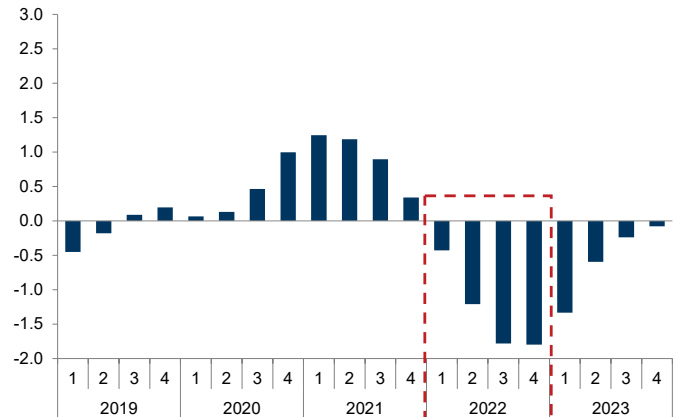
“The title of our [2024] annual outlook report... is that the hard part is over. The reason why I think the hard part is over is that we have proof of concept that we can bring down inflation and rebalance the labor market without having to crush the economy and put the economy into recession, and I think we’ve seen that very clearly in 2023.”
 – Jan Hatzius, Chief Economist and Head of Global Investment Research, Goldman Sachs
 (Bloomberg Odd Lots interview, December 2023)

Real disposable personal income grew at a solid pace this year, as we expected, and we expect continued growth in 2024/25



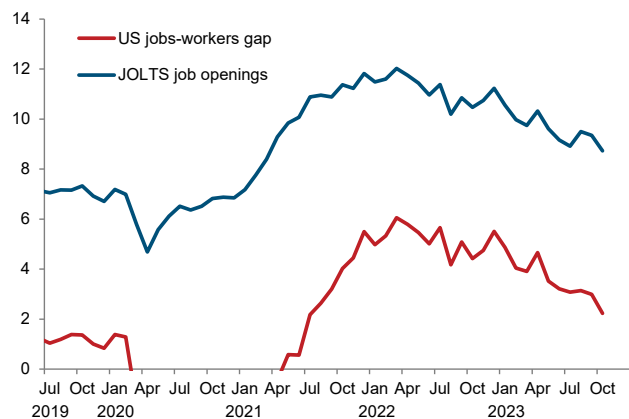
Note: Light grey shading in early 2020 indicates NBER recession. Source: Goldman Sachs GIR.

We have long held that the lags from financial conditions on GDP growth are relatively short, meaning that the US economy bore the brunt of the 2022 tightening in financial conditions that year



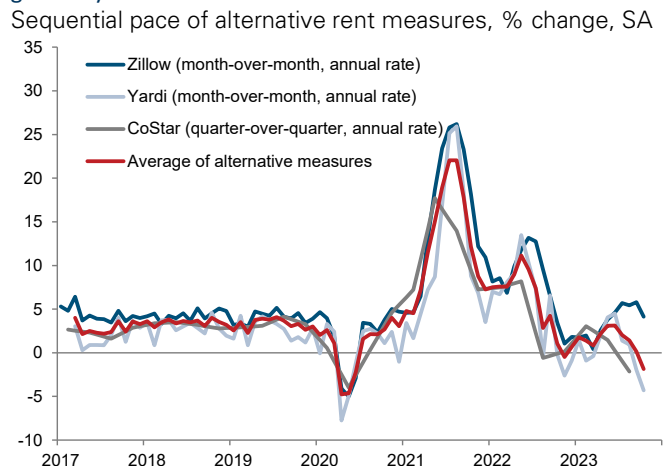
Source: Goldman Sachs GIR.

As we expected, the jobs-workers gap shrank mainly through a decline in job openings without a sharp rise in unemployment



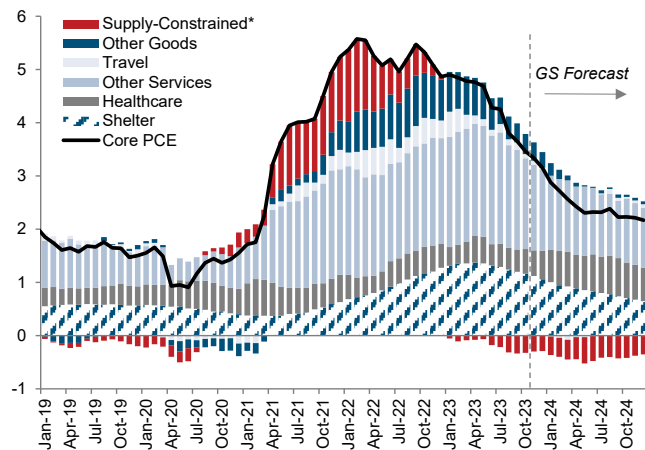
Source: Department of Labor, Goldman Sachs GIR.

The best alternative measures of new lease rent growth have generally continued to slow



Source: Department of Commerce, Census Bureau, CoStar, Zillow, REIS, GS GIR.

Core PCE inflation declined sharply this year, as we expected... Contributions to yoy core PCE inflation, % change, year ago



*New, used, and rental cars, furniture, sporting equipment, household appliances, sports and rec vehicles, video, audio, photo, and info. equipment. Source: Department of Commerce, Goldman Sachs GIR.

...and we forecast core PCE inflation will decline further to 2.2% by YE24

	Weight	GS Bottom-up Core PCE Forecast				
		Oct 2023	Dec 2023	Dec 2024	Dec 2024	
	YoY	YoY	Contribution to Change	YoY	Contribution to Change	
Core PCE	100.0	3.5	3.2	-0.3	2.2	-1.3
Core Goods	26.0	0.3	0.1	0.0	-1.2	-0.4
New Vehicles	2.4	1.9	0.6	0.0	-1.7	-0.1
Used Vehicles	1.5	-7.1	-6.2	0.0	-6.6	0.0
Household Appliances	0.5	-8.1	-9.1	0.0	-3.4	0.0
Video, Audio, Computers	2.5	-6.8	-5.9	0.0	-9.1	0.0
Recreational Vehicles	0.7	0.3	0.9	0.0	1.0	0.0
Jewelry, Watches	0.6	3.0	0.1	0.0	0.8	0.0
Clothing & Footwear	3.1	2.5	2.2	0.0	-0.1	-0.1
Pharma & Medical	4.0	4.1	4.0	0.0	1.9	-0.1
Pets Products	0.7	3.5	3.3	0.0	1.5	0.0
Expenditures Abroad	0.1	12.5	10.0	0.0	0.0	0.0
Residual Core Goods	10.0	0.6	0.4	0.0	-0.6	-0.1
Core Services	74.0	4.6	4.2	-0.3	3.3	-1.0
Housing	17.5	6.9	6.3	-0.1	3.8	-0.5
Ground Transportation	0.4	1.9	1.6	0.0	1.6	0.0
Air Transportation	1.2	2.2	-1.9	0.0	0.0	0.0
Food Services & Accommodation	8.4	4.7	4.5	0.0	3.0	-0.1
Financial Services & Insurance	8.1	4.6	4.2	0.0	3.2	-0.1
Medical Services	18.4	2.6	3.0	0.1	3.3	0.1
Foreign Travel	1.5	-1.9	-2.8	0.0	2.7	0.1
Residual Core Services	18.5	5.2	4.5	-0.1	3.2	-0.4

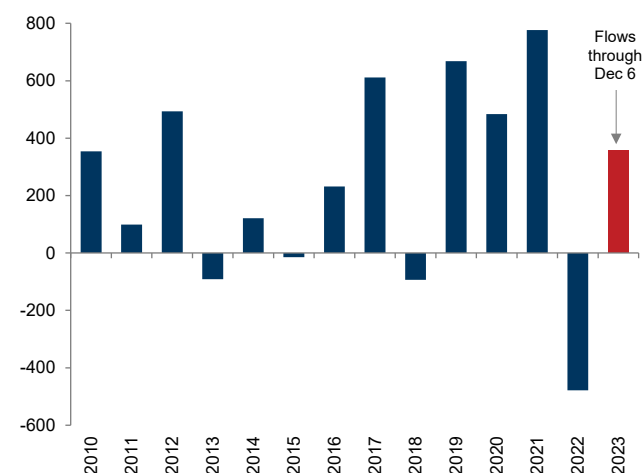
Source: Goldman Sachs GIR.

Special thanks to US economics team for charts.

Bonds are back...

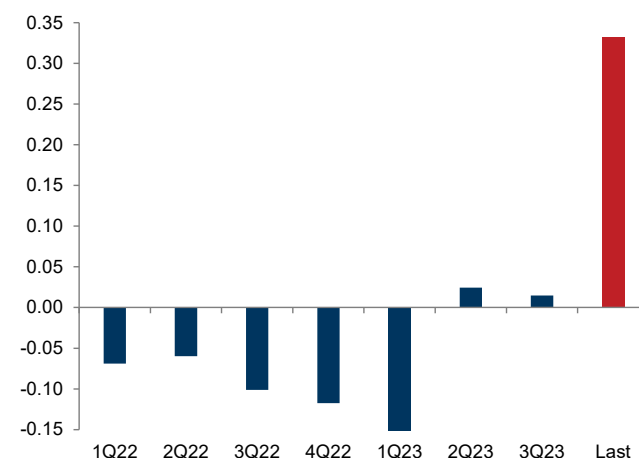
Bond flows have turned positive this year after large outflows last year...

Global flows into bond funds, \$bn



Note: 2023 figure subject to revision.
Source: EPFR, Goldman Sachs GIR.

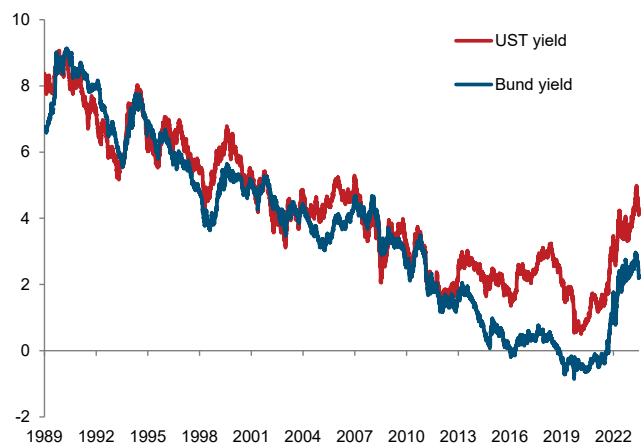
...as investors have increased their duration overweights, with the recent spike seemingly driven by some of the largest funds
Asset-weighted duration beta (negative values indicate underweight duration bias vs. the Bloomberg Agg)



Source: Goldman Sachs GIR.

The value proposition of bonds has increased further as yields continued to move higher over the course of this year...

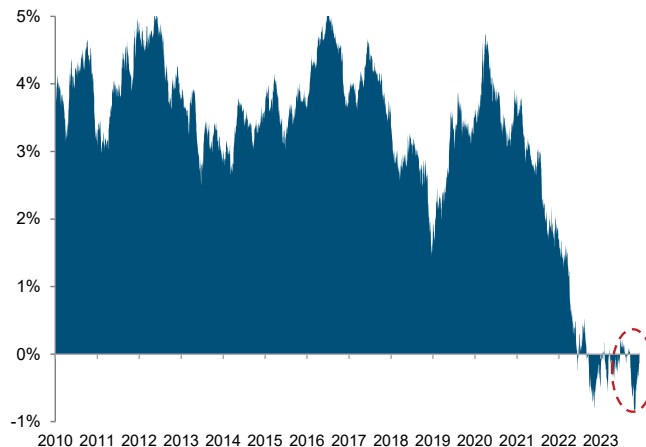
US Treasury and German Bund yields, %



Source: Bloomberg, Goldman Sachs GIR.

...but cash has generally continued to outperform bonds, leaving it as the better alternative

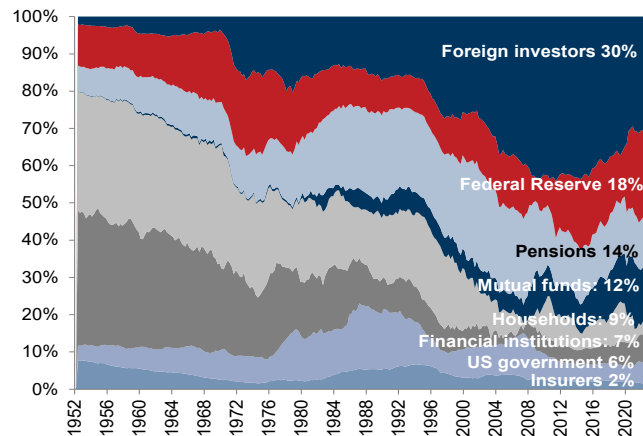
Performance of 10y vs. 3m UST



Note: US 3m is 3m T-bills, which are used as a proxy for cash.
Source: Haver Analytics, Goldman Sachs GIR.

Foreign investors remain the largest owners of US Treasuries...

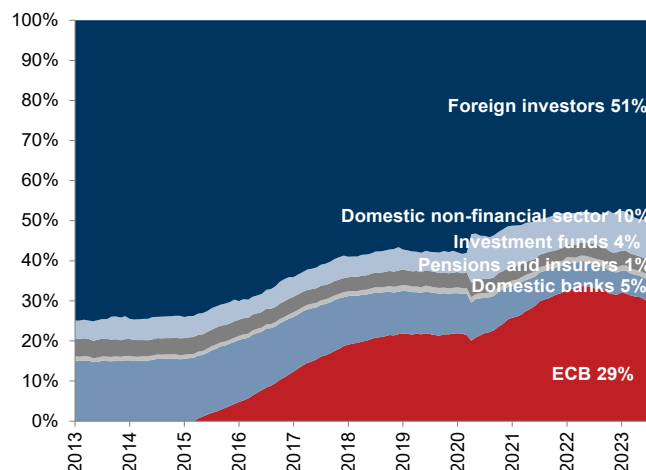
Ownership of US government bond market, %



Source: Federal Reserve, Goldman Sachs GIR.

...as well as of German Bunds

Ownership as a share of total debt securities outstanding

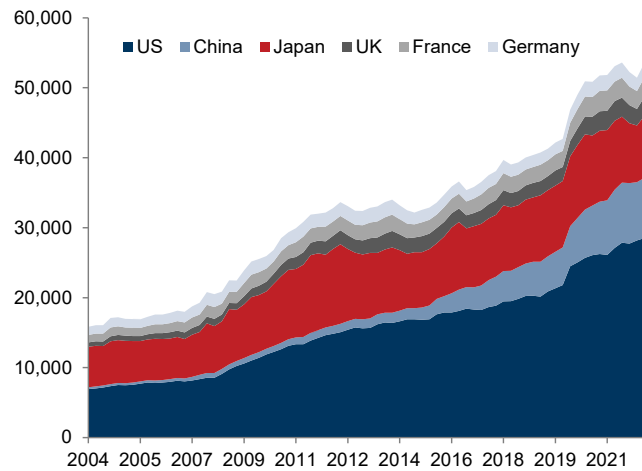


Source: Bundesbank, Goldman Sachs GIR.

...and JGBs are still in focus

The JGB market is the third largest sovereign bond market in the world

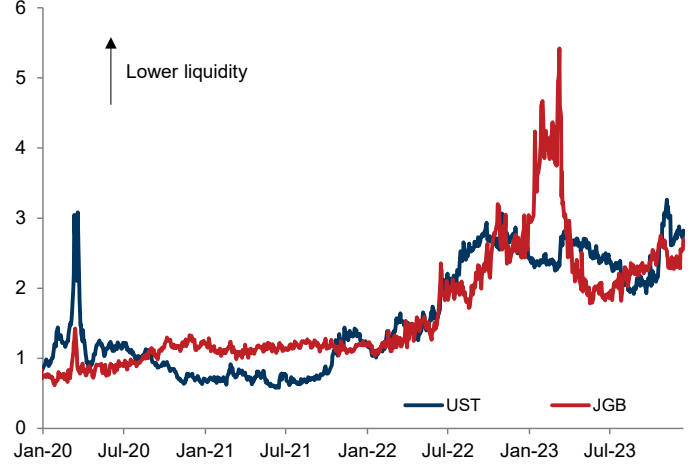
Government debt securities, \$bn



Source: Haver Analytics, Goldman Sachs GIR.

Japanese bond market liquidity has recovered from poor conditions earlier in the year

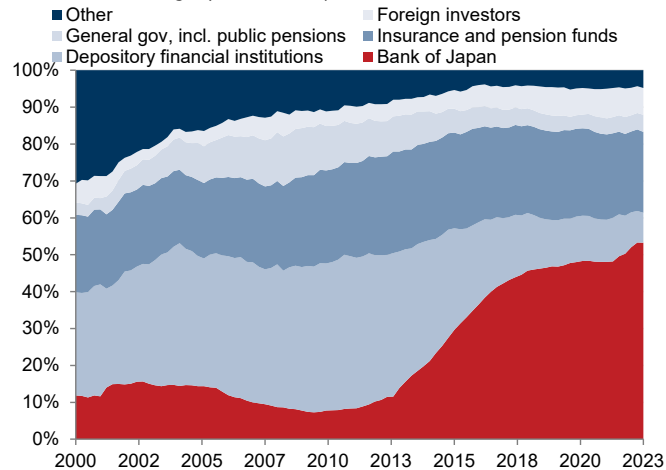
Bloomberg Government Securities Liquidity Index



Source: Bloomberg, Goldman Sachs GIR.

The BoJ owns roughly 50% of the JGB market and around 95% of bonds are held domestically

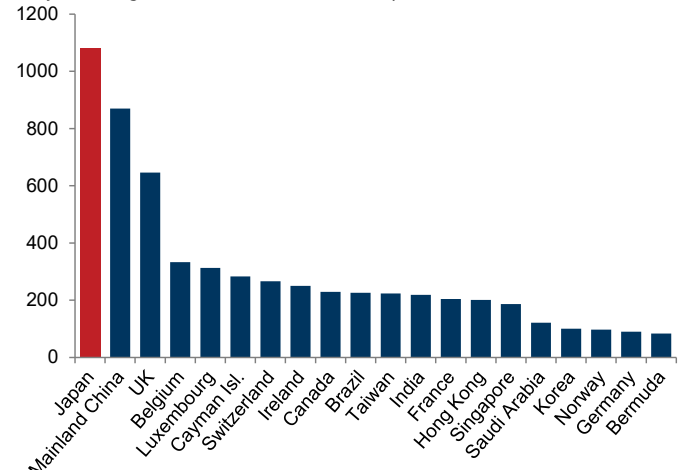
JGB outstanding by ownership, %



Source: Haver Analytics, Goldman Sachs GIR.

Japanese investors have been the biggest foreign investors into DM sovereign bond markets, including US Treasuries

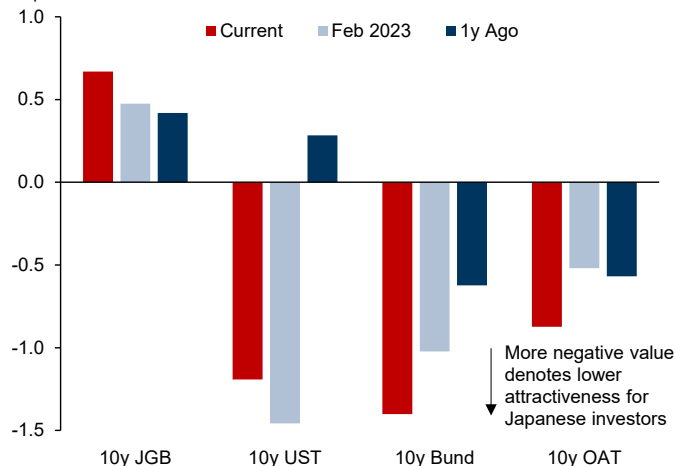
Major foreign holders of US Treasury Securities, \$bn



Source: Haver Analytics, Goldman Sachs GIR.

Foreign bonds are still relatively unattractive investments compared to JGBs as the cost of hedging FX exposure for Japanese investors has risen, though USTs have become somewhat less unattractive...

10y JGB yield compared to FX-hedged foreign bond yields for Japanese investors, %



Note: FX-hedged yield assumes that JPY-based investors hedge their foreign currency risk by selling the foreign currency forward. Assumes 1y rolling hedge. Source: Bloomberg, Goldman Sachs GIR.

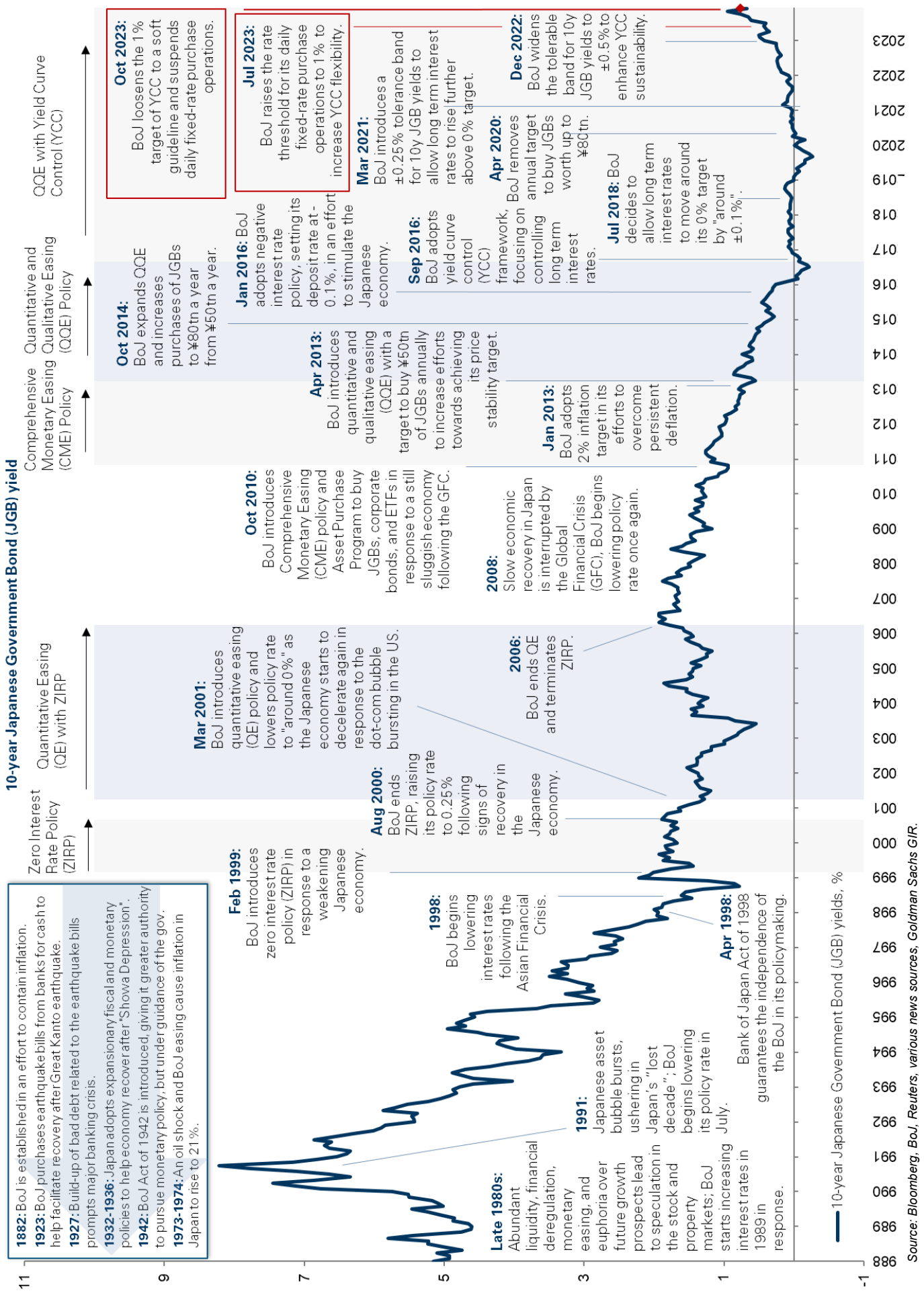
...and Japanese investors have recently turned into net buyers of US Treasuries

Cumulative net acquisition of USTs by Japanese investors since 2016, ¥tn



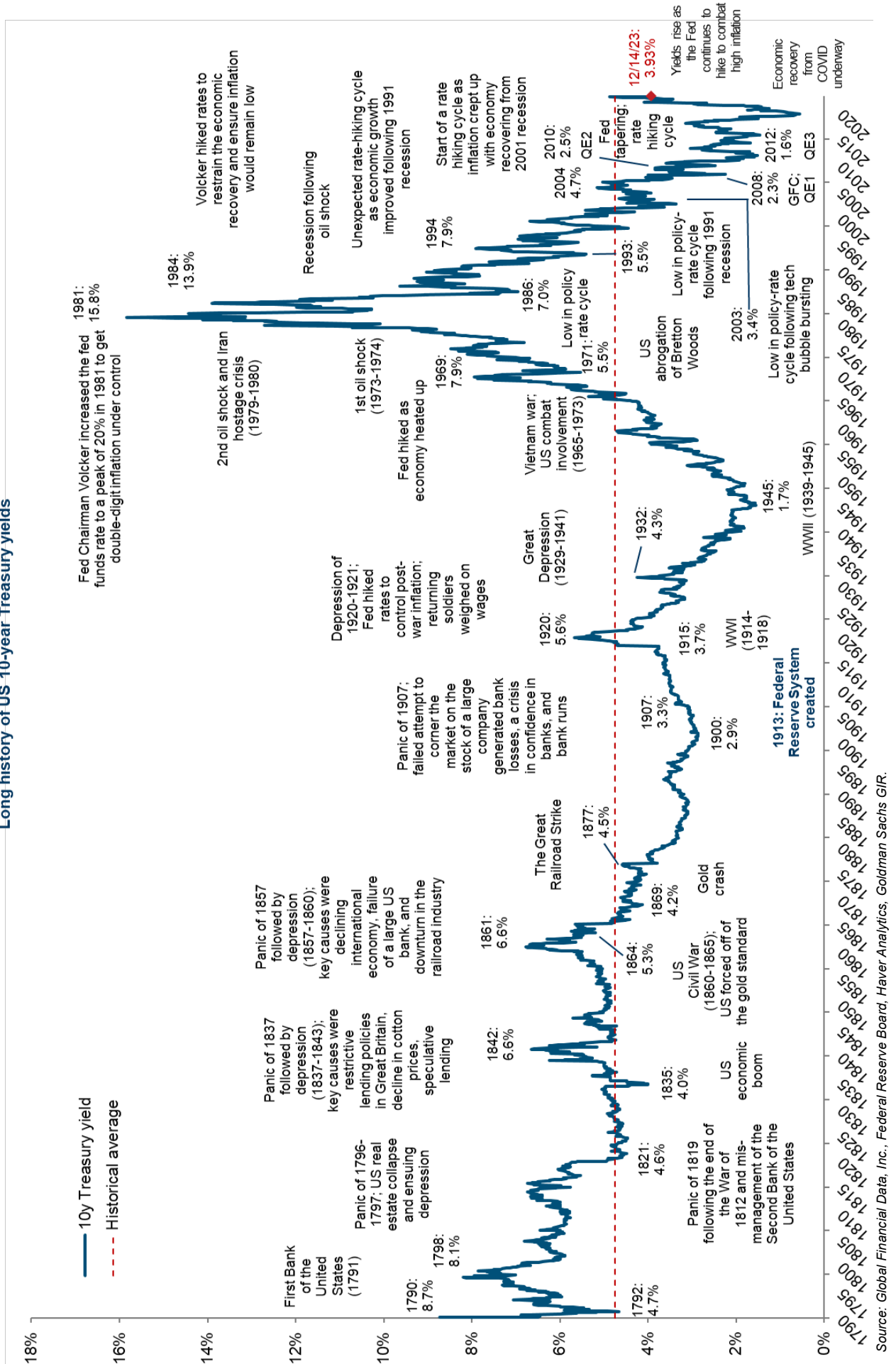
Source: BoJ, Goldman Sachs GIR.

JGB yields: higher, but still low



UST yields: higher, but near average

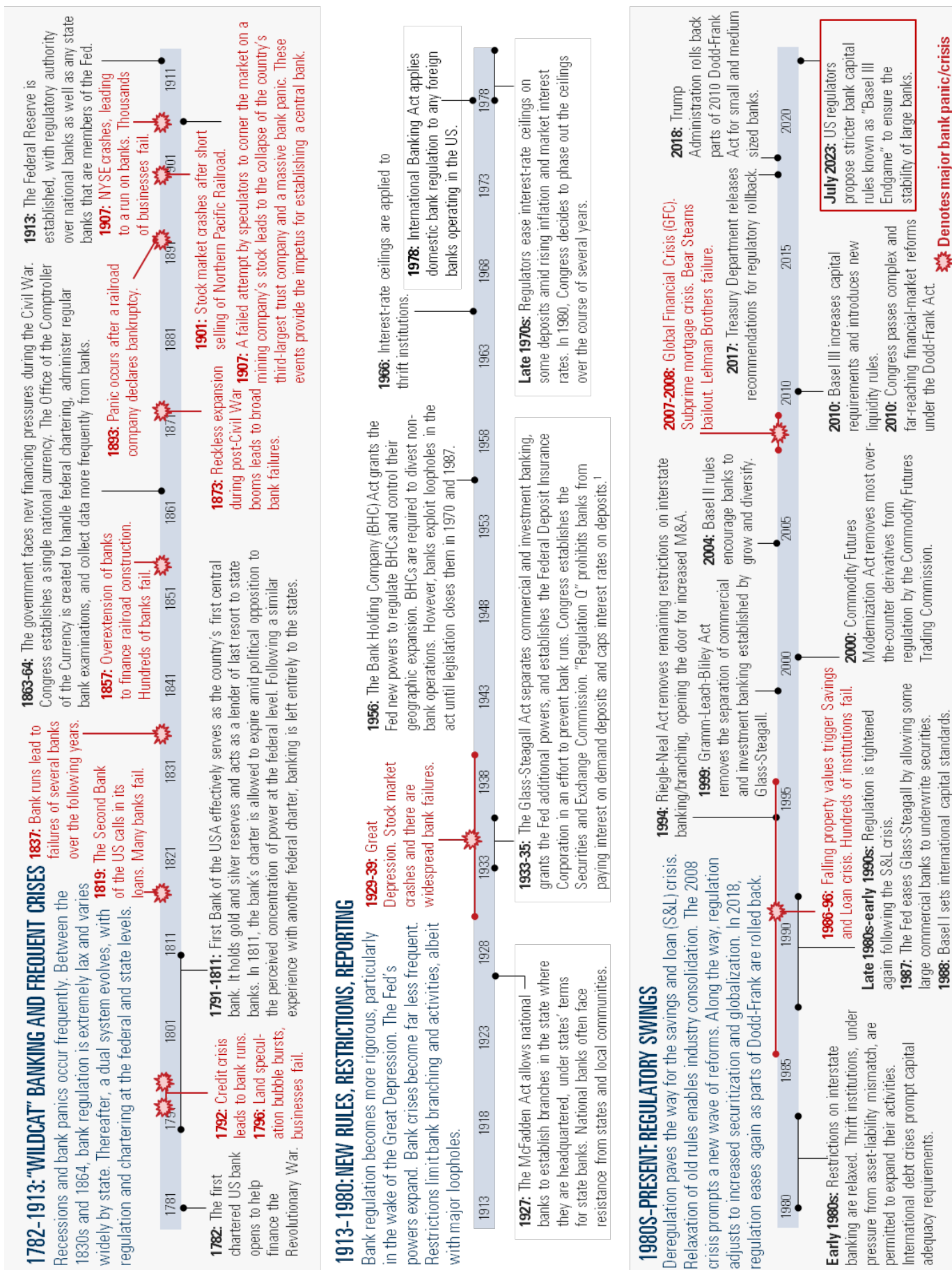
Long history of US 10-year Treasury yields



Source: Global Financial Data, Inc., Federal Reserve Board, Haver Analytics, Goldman Sachs GIR.

Higher-for-longer: banking tremors...

Long history of US bank crises and banking regulation



¹These restrictions were aimed at encouraging banks to provide credit to their communities rather than invest it with larger banks. They also sought to prevent banks from competing up the rates paid on deposits, which was thought to encourage riskier activity to compensate for the hit to profits. The ban on paying interest on demand deposits remained in effect until 2011. Source: Dean Anderson, "Summing it Up: A Brief History of the Economy, Regulations and Bank Data," Federal Reserve Bank of Atlanta, December 6, 2016; FDIC, Federal Reserve History; compiled by Goldman Sachs GRI.

Short history of the 2023 regional banking crisis

March 2023: Banking stresses emerge, regulators intervene

Banking stresses emerge in the US and Europe. Silicon Valley Bank (SVB) and Signature Bank fail after rapid runs on deposits. Federal regulators enact emergency measures to shore up the banking system.

Mar 9: SVB's stock crashes when the market opens. Shares of the four largest US banks also fall amid increased banking system concerns. Depositors at SVB begin rapidly pulling money out, attempting to withdraw \$42bn throughout the day.

Feb 24: KPMG gives SVB's parent company, SVB Financial, a clean bill of health for 2022.

What's happened since:

Late April: The Fed releases a report on SVB's failure that says banking supervisors failed "to take forceful enough action" to address SVB's problems. The FDIC releases a report faulting Signature Bank for poor management and insufficient risk policing. **May:** Federal regulators seize First Republic Bank—making it the second-largest bank by assets to fail in the US after Washington Mutual's collapse in 2008—and announce the sale of most of its deposits and assets to JPMorgan Chase. **July:** The Fed, OCC, and FDIC propose stricter bank capital rules in the US known as "Basel III Endgame" to ensure the stability of large banks.

Mar 11: Tech startups who had deposits at SVB scramble to find alternate funding sources for payroll and daily operations. **Mar 13:** President Biden tells the nation that the banking system is safe, trying to restore confidence in the financial system. Shares of First Republic Bank as well as other regional banks continue to slide amid fears of contagion. The Fed launches a review of SVB's failure.

Mar 15: Credit Suisse shares fall sharply and CDS widens. Overnight, Credit Suisse announces it will access up to CHF50bn from the Swiss National Bank to bolster its liquidity.

Mar 8: Crypto bank Silvergate Capital announces that it plans to shut down operations and liquidate its assets after a run on deposits. SVB announces it will take a \$1.8bn loss after selling some of its investments. SVB makes plans to raise \$2.25bn through stock sales. Moody's downgrades SVB Financial shortly after.

Mar 10: Shares of SVB are halted in the morning after a large premarket selloff. Shortly after, federal regulators announce they have taken control of SVB. At the time, SVB's failure marks the second largest bank failure ever in the US. FDIC announces that insured deposits would be available Monday, March 13.

Mar 12: Signature Bank becomes the second bank to fail and is shut by regulators. Federal Reserve, US Treasury, and FDIC announce emergency measures to stem deposit outflows and stabilize the banking system, including protecting uninsured depositors at SVB and Signature Bank and creating the Bank Term Funding Program (BTFP).

Mar 14: Justice Dept and SEC reportedly begin investigations into SVB collapse. Shares of regional banks rally amid hopes that the banking crisis may be contained.

Mar 19: UBS agrees to take over Credit Suisse for over \$3bn. The SNB announces up to CHF200bn of additional liquidity assistance to both UBS and CS to support the deal. As part of the deal, Credit Suisse's CHF15.8bn in AT1s bonds will be completely written down by FINMA. FDIC announces deal to sell 40 branches of Signature Bank.

Mar 17: SVB's parent company, SVB Financial, files for Chapter 11 bankruptcy protection. Credit Suisse and First Republic shares continue to fall as concerns remain high.

Mar 21: First Republic Bank shares rise over 30% amid increasing optimism about the banking system. US Treasury Secretary Yellen says regulators could protect deposits at other banks if needed.

Mar 24: Investors spark a selloff in Deutsche Bank over sentiment contagion.

Mar 16: US federal regulators announce that 11 banks have deposited roughly \$30bn into First Republic Bank to shore up its liquidity. Federal Reserve data show that banks had borrowed \$11.9bn from the BTFP. US Treasury Secretary Yellen says that the US banking system is "sound". ECB hikes rates by 50bp despite banking stress. ECB President Lagarde says the Euro area banking sector is resilient.

Mar 20: First Republic Bank shares continue to decline despite the fresh inflow of deposits. CEOs of large banks discuss additional efforts to stabilize First Republic Bank.

Mar 22: Fed raises rates by 25bp. Chair Powell says the US banking system is "sound and resilient" and that "all depositors' savings and the banking system are safe". Shortly after, US Treasury Secretary Yellen says she has "not considered or discussed anything having to do with blanket insurance or guarantees of deposits".

Mar 27: First Citizens acquires all of SVB's deposits, loans, and branches. FDIC agrees to provide First Citizens with a \$35bn loan and share any losses or gains on SVB's commercial loans.

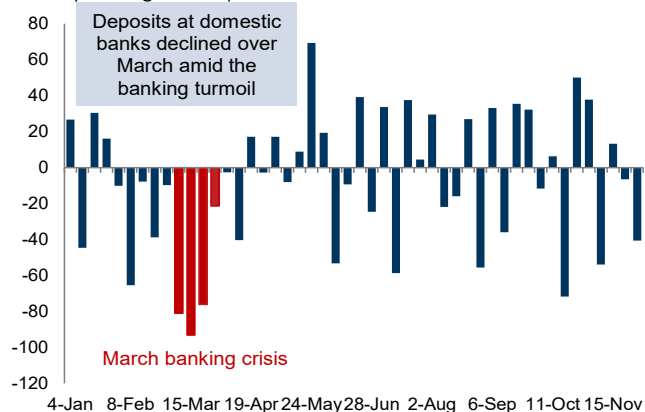
Source: Wall Street Journal, various news sources, Goldman Sachs GIR.

...have since subsided

Stress in the banking system has subsided since the turmoil in March—bank deposit outflows have stabilized from the large outflows seen in the peak weeks of stress and usage of Fed facilities has declined, though remains above the pre-March levels as banks use the facilities for inexpensive funding. And bank lending growth has stopped declining, although lending growth remains slower than it was before March.

Deposit outflows at US banks have stabilized following the consecutive weeks of decline in March...

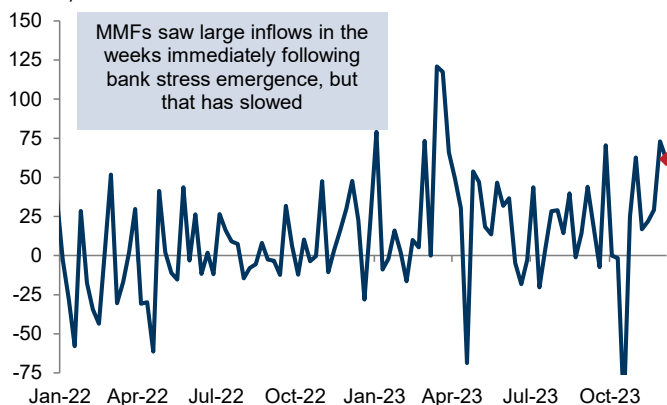
Weekly change in deposits at US banks, \$bn



Source: Federal Reserve, Goldman Sachs GIR.

...and flows to money market funds—a likely destination for bank deposit outflows—has slowed...

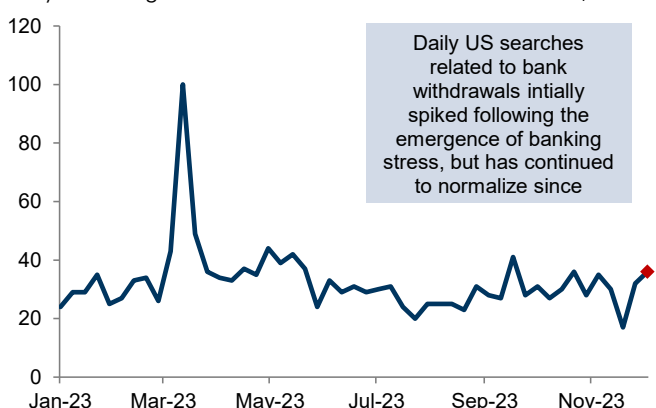
Money market fund (MMF) net flows, \$bn



Source: Morningstar, Goldman Sachs GIR.

...and internet searches for withdrawal-related words have declined to pre-banking stress levels

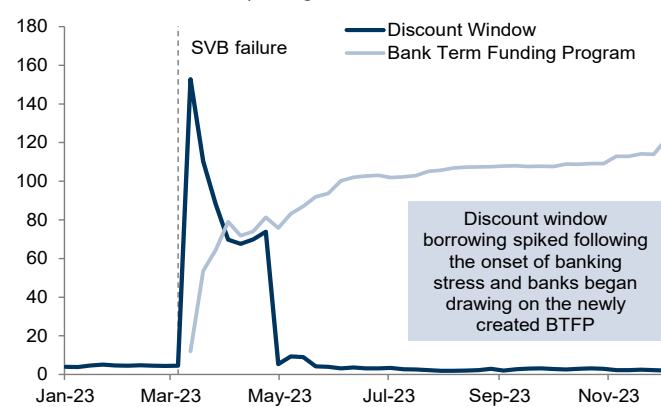
Daily US Google searches related to bank withdrawals, index



Source: Google Trends (<https://www.google.com/trends>), Goldman Sachs GIR.

Usage of the Fed's Discount Window has fallen back to near zero levels, although banks have continued to use the Bank Term Funding Program (BTFP)

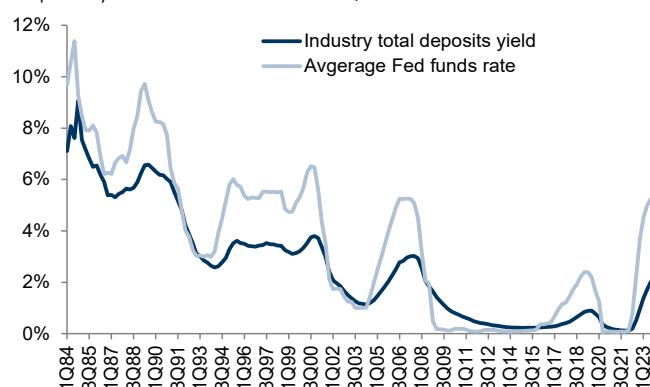
Federal Reserve facility usage, \$bn



Source: Federal Reserve, Goldman Sachs GIR.

Since the deposit outflows seen in March, banks have responded by paying higher yields on deposits to prevent renewed outflows

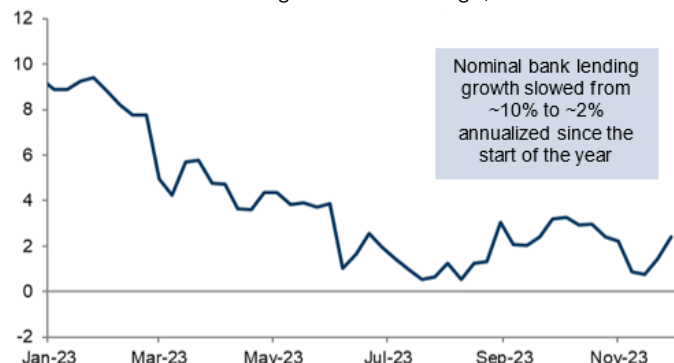
Deposit yield and Fed funds rate, %



Note: Industry total deposits yield calculated based on US domestic deposit interest income. Data as of 3Q23.
Source: FDIC, Goldman Sachs GIR.

Bank lending growth has stopped declining, although lending growth remains slower than it was at the start of the year

12-week annualized change in bank lending*, %



*Sum of real estate, C&I, and consumer loans. The week of Mar 22 is adjusted by \$60bn for divestment of loans from a bank in receivership to nonbank institutions that aren't included in the H.8. Mergers & acquisitions occasionally cause jumps.
Source: Haver Analytics, Goldman Sachs GIR.

Special thanks to GS equity research analyst James Yaro, GS Chief US Economist David Mericle, and GS structured product strategist Vinay Viswanathan.

...but new bank regulation is on the way

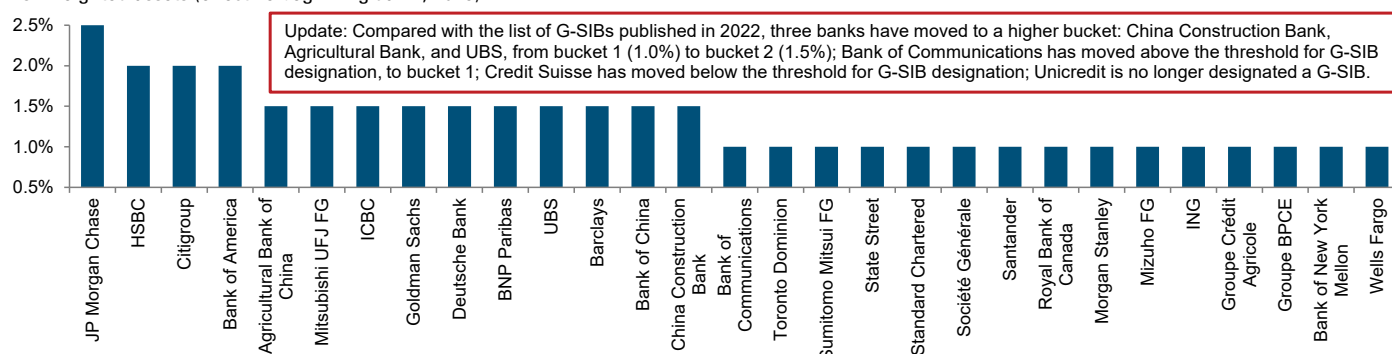
Which US banks are subject to which regulatory requirements?

Category	Category I	Category II	Category III	Category IV	Other
Thresholds	US G-SIBs	≥\$700bn in assets or ≥\$75bn in cross-jurisdictional activity	≥\$250bn in assets or ≥\$100bn in assets and ≥\$75bn weighted short-term wholesale funding, nonbank assets, or off-balance-sheet exposure	\$100bn to \$250bn in assets	\$50bn to \$100bn in assets
Banks	BAC, BK, C, GS, JPM, MS, STT, WFC	NTRS	COF, SCHW, PNC, USB, TFC	ALLY, AXP, CFG, DFS, FITB, HBAN, KEY, MTB, RF	CMA, SNV, RJF, ZION
Capital	G-SIB surcharge				
	TLAC				
	Required to recognize elements of AOCI in regulatory capital	Required to recognize elements of AOCI in regulatory capital	May opt out of recognizing AOCI in regulatory capital Under Basel III Endgame as currently proposed, the AOCI opt-out would be removed, and these banks would be required to recognize unrealized gains and losses in their AFS securities portfolio		May opt out of recognizing AOCI in regulatory capital
	Countercyclical capital buffer	Countercyclical capital buffer	Countercyclical capital buffer	Under Basel III Endgame as currently proposed, these banks would be subject to the countercyclical capital buffer	
	Advanced (except for US Intermediate Holding Companies) and Standardized Approach to calculating risk-based capital ratios Under Basel III Endgame as currently proposed, the Advanced Approach would be substituted for an "expanded risk-based approach" to calculating risk-weighted assets		Standardized Approach to calculating risk-based capital ratios	Standardized Approach to calculating risk-based capital ratios	Standardized Approach to calculating risk-based capital ratios
	Under Basel III Endgame as currently proposed, CET1 requirements would increase ~19% for Category I and II banks, and ~6% for Category III and IV banks				
Stress testing	Stress Capital Buffer	Stress Capital Buffer	Stress Capital Buffer	Stress Capital Buffer	
	Annual company run stress tests	Annual company run stress tests	Company run stress tests every other year		
	Annual CCAR	Annual CCAR	Annual CCAR	CCAR every other year	
Leverage	Annual capital plan submission	Annual capital plan submission	Annual capital plan submission	Annual capital plan submission	
	Enhanced SLR	SLR	SLR	Under Basel III Endgame as currently proposed, these banks would be subject to SLR	
Liquidity	US leverage ratio	US leverage ratio	US leverage ratio	US leverage ratio	US leverage ratio
	Full LCR	Full LCR	Full LCR for banks w/ ≥\$75bn weighted short-term wholesale funding, reduced LCR for <\$75bn (85% of full)	Reduced LCR for banks with \$50bn-\$75bn in weighted short-term wholesale funding (70% of full LCR), no LCR for <\$50bn	
	Full NSFR	Full NSFR	Full NSFR for banks w/ ≥\$75bn weighted short-term wholesale funding, reduced NSFR for <\$75bn (85% of full)	Reduced NSFR for banks with \$50bn-\$75bn weighted short-term wholesale funding (70% of full LCR), no NSFR for <\$50bn	
	Resolution planning				

Source: Federal Reserve, US Department of Treasury, Congressional Research Service, Goldman Sachs GIR (original published version here).

Which global banks are considered systemically important?

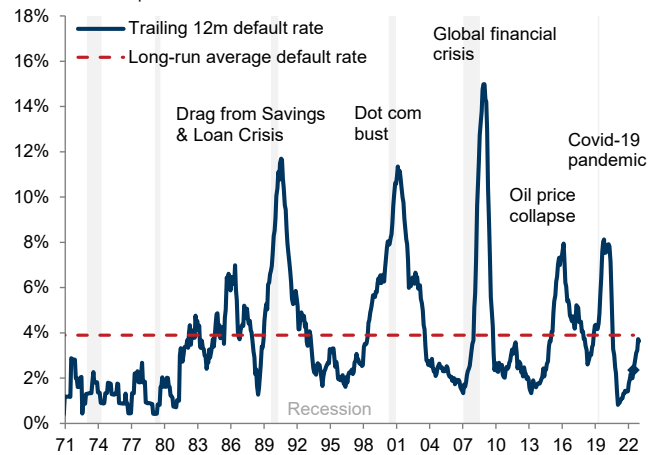
Financial Stability Board/Base1 Committee on Banking Supervision's Nov 2023 global list of G-SIBs by additional common equity capital requirement as a % of risk-weighted assets (effective beginning Jan 1, 2025).



Source: Financial Stability Board, Goldman Sachs GIR.

Higher-for-longer: credit still holding up

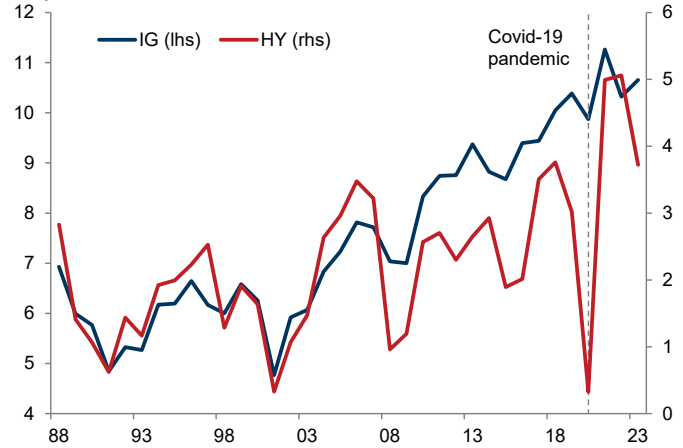
Default rates among HY-rated US non-financial corporations have continued to rise and are now near historical averages
Issuer-weighted annual default rate for HY-rated US non-financial corporations, %



Note: Default rate for IG-rated US non-financial corporations is 0%.
Source: Moody's, Goldman Sachs GIR.

Fundamentals for both US IG and HY bond issuers remain relatively healthy as net profit margins have increased over recent years...

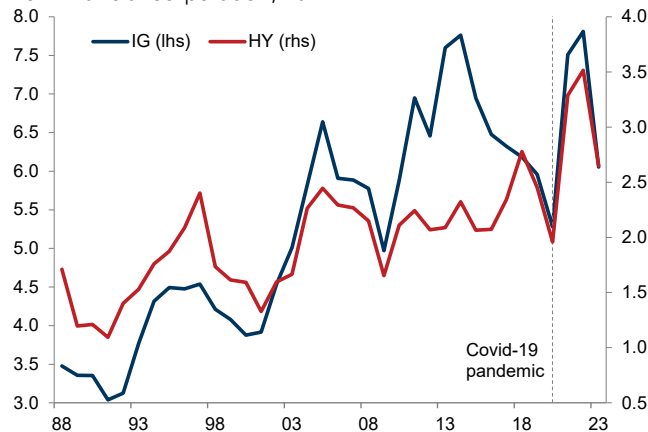
Net margins for the median HY and IG-rated US non-financial corporation, %



Note: Data is annual, 2023 is as of Q3.
Source: FactSet, Goldman Sachs GIR.

...as have interest coverage ratios, although they have come down more recently

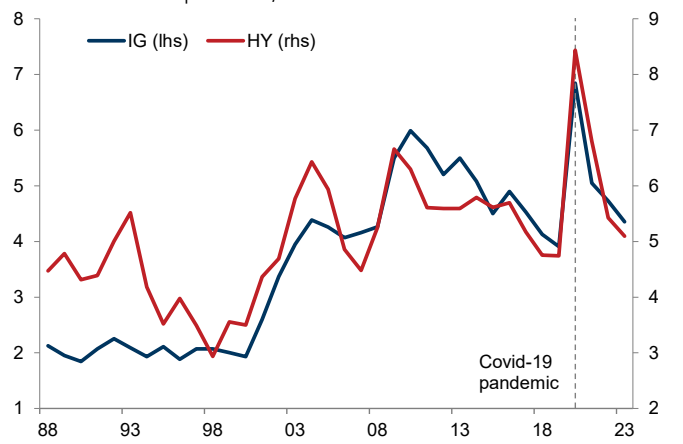
Interest coverage ratios for the median HY and IG-rated US non-financial corporation, %



Note: Data is annual, 2023 is as of Q3.
Source: FactSet, Goldman Sachs GIR.

...and liquidity positions on balance sheets are still strong by historical standards, despite recent erosion

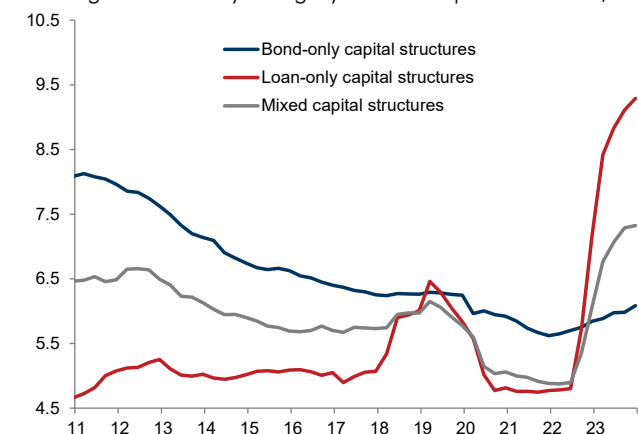
Cash-to-total assets ratios for the median HY and IG-rated US non-financial corporation, %



Note: Data is annual, 2023 is as of Q3.
Source: FactSet, Goldman Sachs GIR.

However, we continue to see signs of distress in the leveraged loan market, which has seen a larger increase in interest expenses amid the higher rate environment...

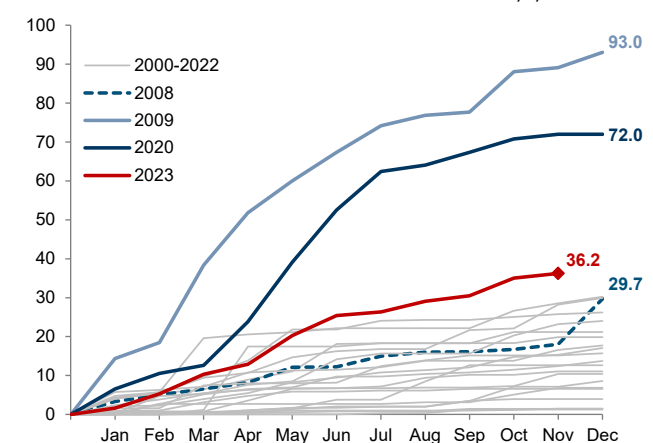
Weighted-average coupon for HY-rated USD bond and leveraged issuers by category of debt capital structure, %



Source: Bloomberg, Goldman Sachs GIR.

...and 2023 is still on track to be the third most severe default year in history for leveraged loans, with the pace of defaults likely to remain elevated

Cumulative notional value of defaulted loans by year, \$bn



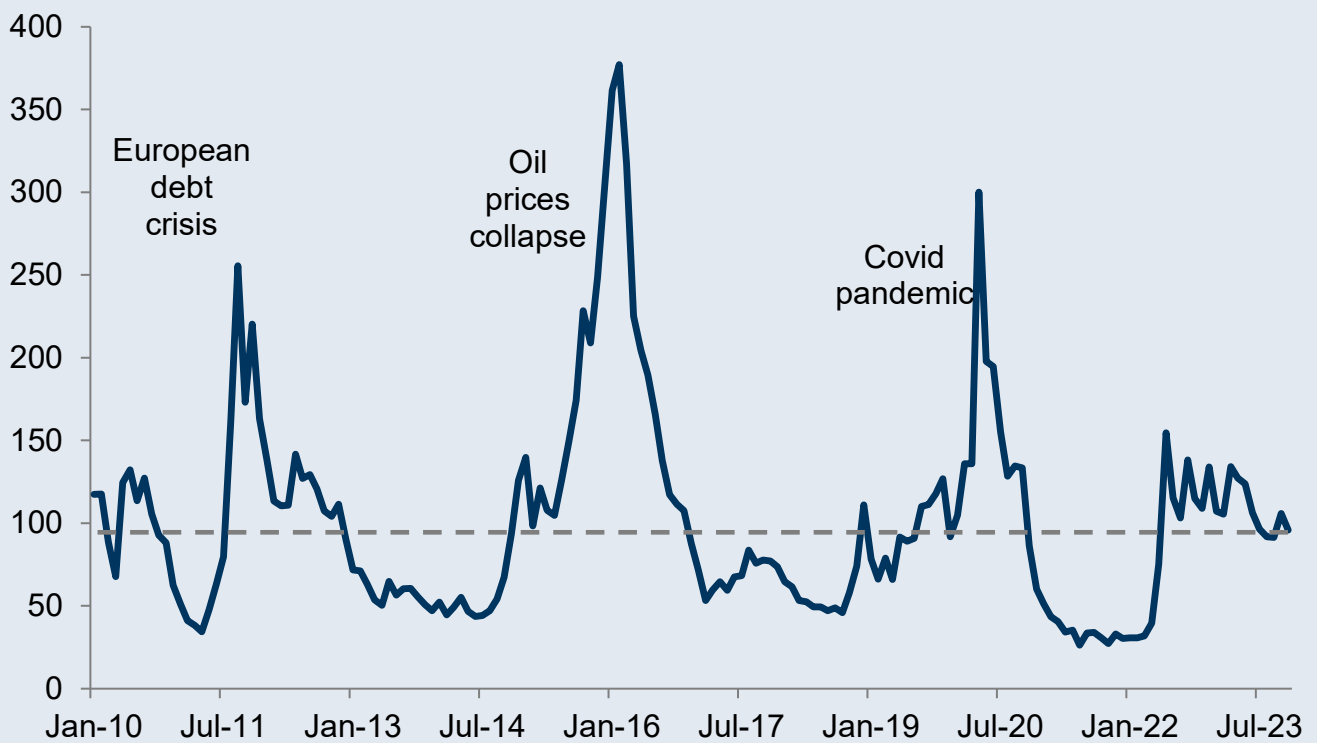
Source: PitchBook LCD, Goldman Sachs GIR.

Special thanks to GS credit strategists Sienna Mori and Spencer Rogers for charts.

...but leveraged loans still one to watch

High-yield bonds continue to face distress levels in line with those of a typical late-cycle backdrop...

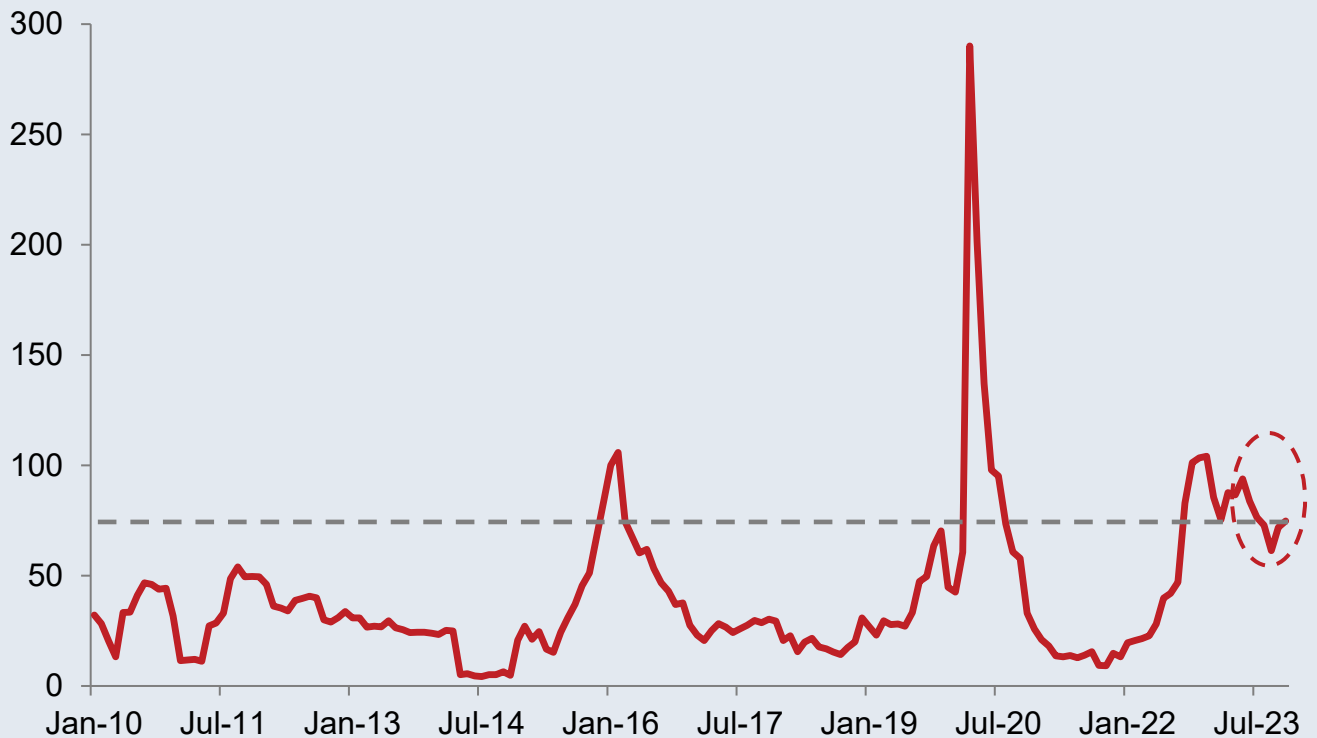
Aggregate face value of distressed high-yield bonds, \$bn



Note: Distressed bonds are classified as those trading at spreads >1000; data as of 11/30/2023.
Source: ICE BAML Distressed Index, Goldman Sachs GIR.

...while leveraged loan distress levels remain elevated relative to non-recessionary periods

Total outstanding value of distressed leveraged loans, \$bn



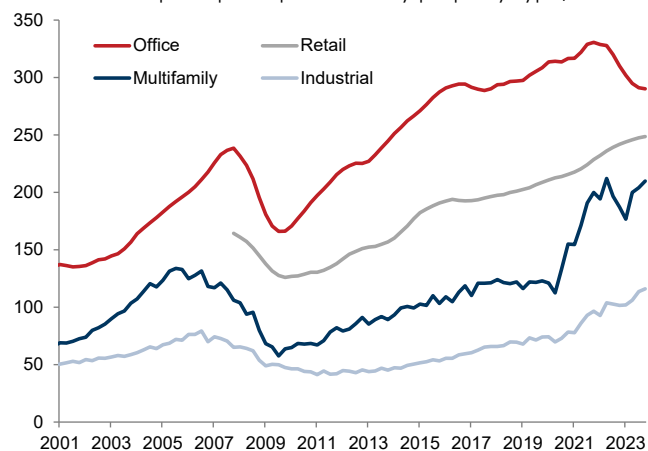
Note: Distressed loans are classified as those trading at prices <80; data as of 11/30/2023.
Source: Pitchbook LCD, Goldman Sachs GIR.

Special thanks to GS credit strategist Michael Puempel for data and guidance.

Higher-for-longer: CRE still under stress

While some sectors of commercial real estate (CRE) have held up relatively well, prices have fallen for the office sector...

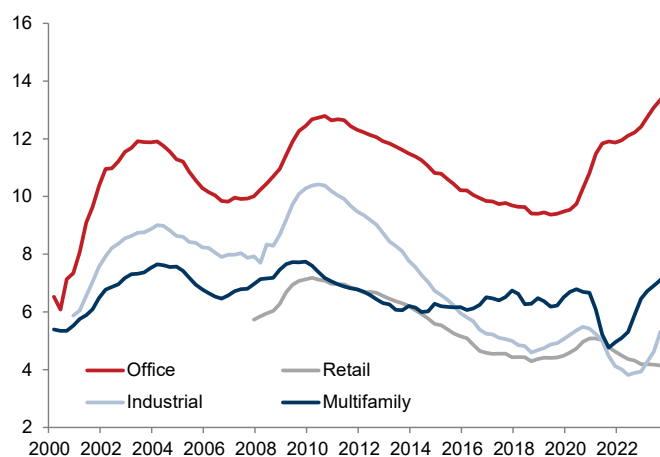
Median sales price per square foot by property type, \$



Source: CoStar, Goldman Sachs GIR.

...and vacancy rates have increased more for the office sector, with office vacancies above 25-year highs

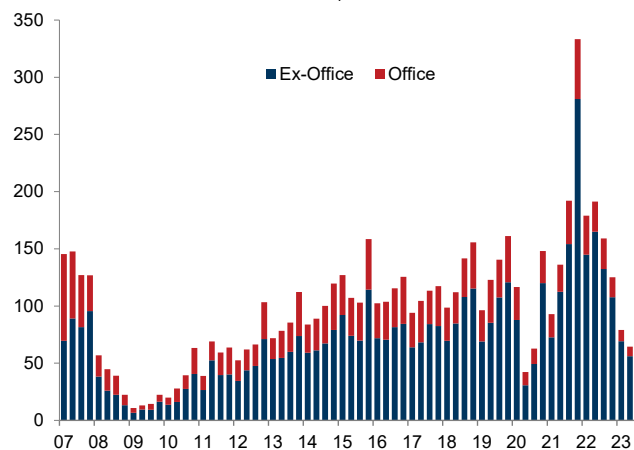
Vacancy rates by CRE sector, %



Source: CoStar, Goldman Sachs GIR.

Overall CRE transaction volumes have contracted, with transaction volumes for office falling to multi-year lows...

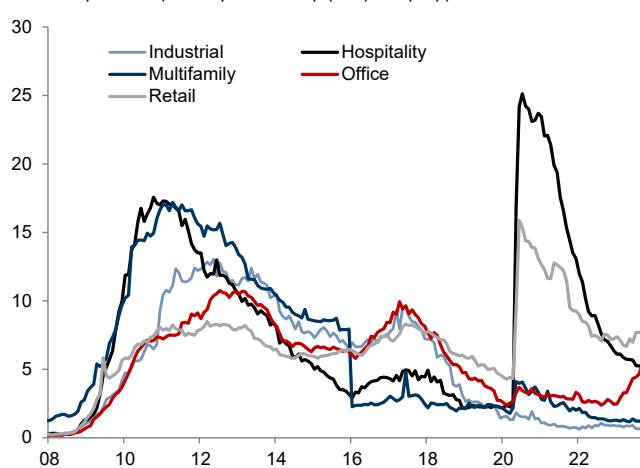
Total CRE transaction volumes, \$bn



Source: RCA, Goldman Sachs GIR.

...and delinquency rates have risen for office properties, while remaining contained for most other CRE property types

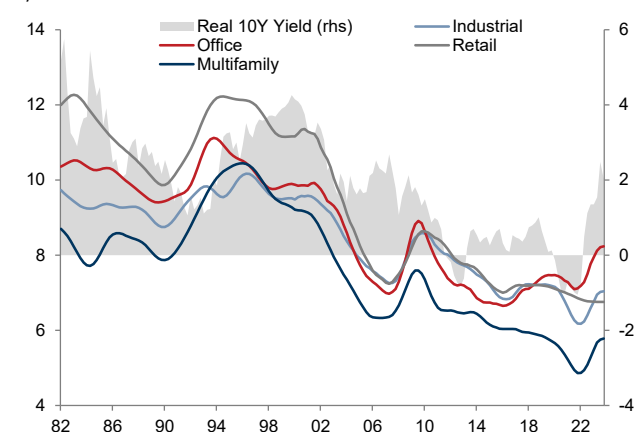
30+ day delinquency rates by property type, %



Source: Trepp, Goldman Sachs GIR.

CRE valuations should continue to face pressure as cap rates have widened less than 10-year real yields

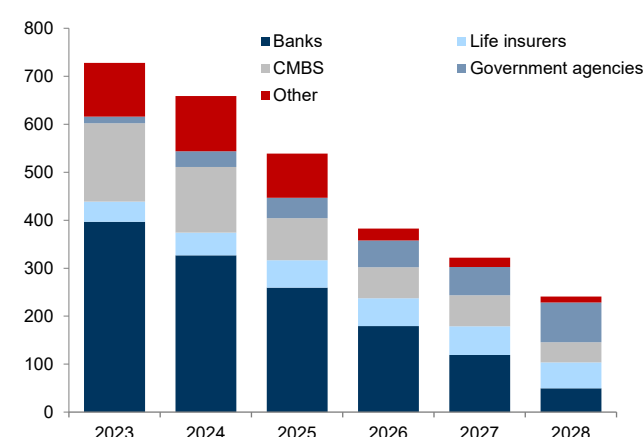
Modeled cap rates on all income-producing CRE by property segments vs. real 10-year inflation-indexed yield, %



Source: Bloomberg, CoStar, Goldman Sachs GIR.

And refinancing needs for CRE borrowers are set to remain high, with roughly \$1.2tn in maturities coming due over 2024 and 2025

Annual maturity wall on CRE loans by lender group, \$bn

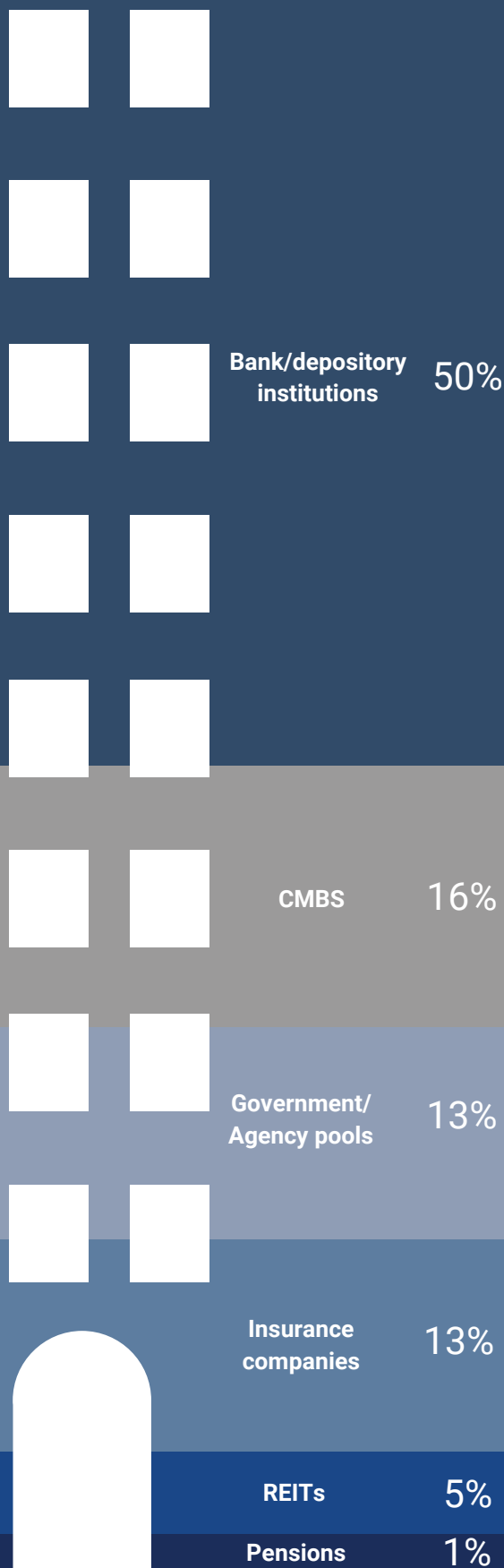


Note: Other includes credit companies, warehouses, and other investors. Source: RCA, Goldman Sachs GIR.

Special thanks to GS structured product strategist Vinay Viswanathan for charts.

...with banks still the most exposed

Who owns the debt in US commercial real estate?



Banks/depository institutions include US-chartered depository institutions, foreign banking offices in the US, banks in US-affiliated areas, and credit unions. They own **50%** of all CRE debt.

Commercial mortgage-backed securities (CMBS) include asset-backed securities (ABS) and agency and GSE-backed mortgage pools.

They own **16%** of all CRE debt.

CMBS loans are secured by a first-position mortgage on a commercial property. They are typically offered by commercial banks, conduit lenders, and investment banks, and once they are issued are packaged and sold to other investors, including asset managers, banks, hedge funds, and private equity firms.

Several different types of CMBS loans exist: (1) **Conduit**, which are diversified pools of mortgages on commercial properties; (2) **Single-asset, single-borrower (SASB)**, which are secured by one large loan or a portfolio of assets owned by the same borrower; (3) **Agency**, which are CMBS and pass-through securities issued primarily by Fannie Mae or Freddie Mac and backed by multifamily mortgages; (4) **CRE collateralized loan obligations (CLOs)**, which are pools of mortgages typically secured by transitional properties in need of short-term bridge financing. CRE CLOs are actively managed, and asset managers can add/remove loans from the portfolio during the reinvestment period.

Government/Agency pools include federal, state, and local governments, as well as government sponsored enterprises (GSEs). They own **13%** of all CRE debt. Federal, state, and local governments own 2%, and GSEs (who own only multifamily residential) own the remaining 11%.

Insurance companies include property-casualty and life insurance companies. They own **13%** of all CRE debt.

Commercial mortgages represent a significant portion of US insurers' investment portfolios, with life insurance companies owning the bulk of commercial mortgage loans held by insurance companies.

Real Estate Investment Trusts (REITs) own **5%** of all CRE debt.

A REIT is a company that owns and, typically, operates income-producing real estate or related assets. A REIT does not develop real estate properties to resell them, but rather buys and develops properties primarily to operate them as part of its investment portfolio. Two main types of REITs exist: (1) **equity REITs**, which invest in commercial properties and whose incomes are mainly generated from the rental incomes on their holdings; (2) **mortgage REITs**, which provide financing for income-producing real estate by purchasing or originating mortgages and earning income from the interest on these.

REITs registered with the SEC and publicly traded on an exchange are known as **publicly traded REITs**. SEC-registered but not publicly traded REITs are known as **non-traded REITs**. **Private REITs** are real estate funds or companies that are exempt from SEC registration and whose shares don't trade on exchanges.

Pensions includes private pension funds and state and local government employee retirement funds. They own **1%** of all CRE debt.



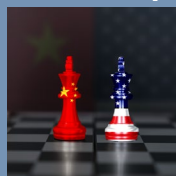
Note: Debt ownership shares calculated based on Federal reserve Flow of Funds data by summing commercial mortgages and multifamily residential mortgages for each category; data as of 3Q23; data for REITs as of 2Q23, reflecting latest data available.

Source: Federal Reserve Board, Haver Analytics, various research sources, Goldman Sachs GIR.

Notable *political and geopolitical developments* also occurred,

2

The US hitting its debt limit, which, as usual, set off a political fight,



Like rising US-China tensions, which makes more decoupling all but assured,



And the Israel-Hamas war, which thrust the Middle East back into the spotlight.

Pgs. 19-31

US-China relations: on the mend?

“

“We have to ensure that competition does not veer into conflict. And we also have to manage it responsibly—that competition. That’s what the United States wants and what we intend to do.”

- President Biden, November 2023

"I've made clear with President Xi that we seek competition, not conflict... I'm committed to work with China where we can advance American interests and benefit the world... Make no mistake: as we made clear last week, if China threatens our sovereignty, we will act to protect our country. And we did."

- President Biden, February 2023

"We seek competition, but not conflict or confrontation... Everything that has happened in the last week and a half is, we believe, very consistent with our stated approach."

- Kamala Harris, US Vice President, February 2023 on Chinese balloon incident

"One of my greatest worries about the future is that we fall behind Communist China. The fact of the matter is—the danger posed by our dependence on China is dire."

- Kevin McCarthy, US House Speaker, January 2023

"We don't seek to block China from its role as a major power, nor to stop China—or any other country, for that matter—from growing their economy or advancing the interests of their people. But we will defend and strengthen the international law, agreements, principles, and institutions that maintain peace and security, protect the rights of individuals and sovereign nations, and make it possible for all countries—including the United States and China—to coexist and cooperate."

- Antony Blinken, US Secretary of State, May 2022

"The National Defense Strategy is clear-eyed about our main competitors. And that starts with the People's Republic of China... the PRC is the only country with both the will and, increasingly, the power to reshape its region and the international order to suit its authoritarian preferences. So let me be clear: we will not let that happen."

- Lloyd Austin III, US Secretary of Defense, December 2022

“China is ready to be a partner and friend of the United States... The fundamental principles that we follow in handling China-U.S. relations are mutual respect, peaceful coexistence and win-win cooperation.”

- President Xi, November 2023

"Western countries, led by the U.S., have implemented all-round containment, encirclement and suppression against us, bringing unprecedentedly severe challenges to our country's development... In the face of fierce international competition, we must carve out new tracks for development, create new momentum and develop new strengths."

- President Xi, March 2023

"The Chinese and American economies have benefited from each other's development... China and the United States can and should cooperate, and there is great potential for Sino-US cooperation."

- Li Qiang, Premier of China, March 2023

"In this case the United States' perception and views of China are seriously distorted. It regards China as its primary rival and the most consequential geopolitical challenge... This is like the first button in a shirt being put wrong and the result is that the US-China policy has entirely deviated from the rational and sound track."

- Qin Gang, Foreign Minister of China, March 2023

"China will work with the US to find a way of promoting peaceful co-existence and mutually beneficial cooperation. We hope the US side will embrace a more open and inclusive approach when viewing China's development, work with us to manage differences in a spirit of equality and mutual respect, and adhere to the principles of coordination, cooperation and stability in bilateral ties."

- Wang Yi, Director of the Office of the Central Foreign Affairs Commission, February 2023

"China does not shy away from or fear competition, but we oppose using competition to define the entire China-US relationship."

- Mao Ning, spokesperson for China's Foreign Ministry, February 2023

”

Source: The White House, South China Morning Post, Various new sources, Goldman Sachs GIR.

Old tensions resurfaced...

Long history of US-China relations

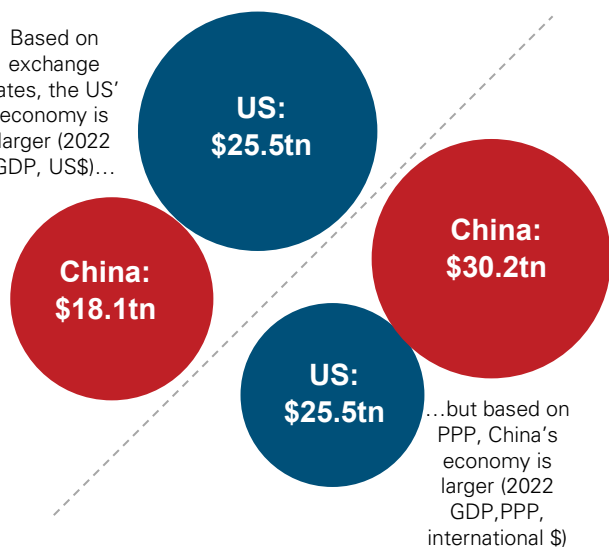


Source: US State Department; Council on Foreign Relations; Columbia University; PIRE; various news sources; Goldman Sachs GIR.

US and China: two big economies...

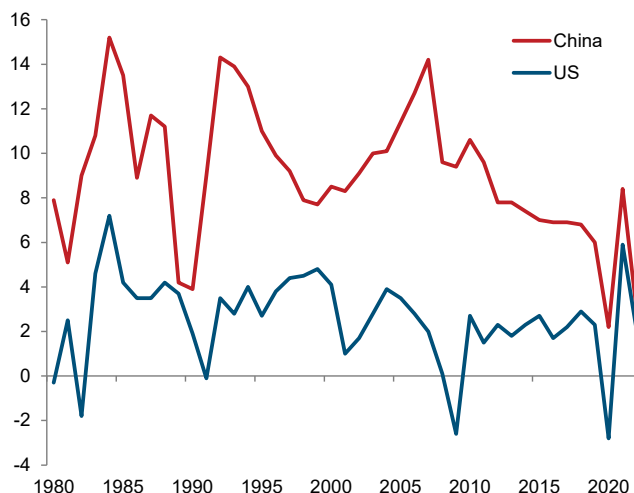
The US', or China's, economy is larger, depending on measure

Based on exchange rates, the US' economy is larger (2022 GDP, US\$)...



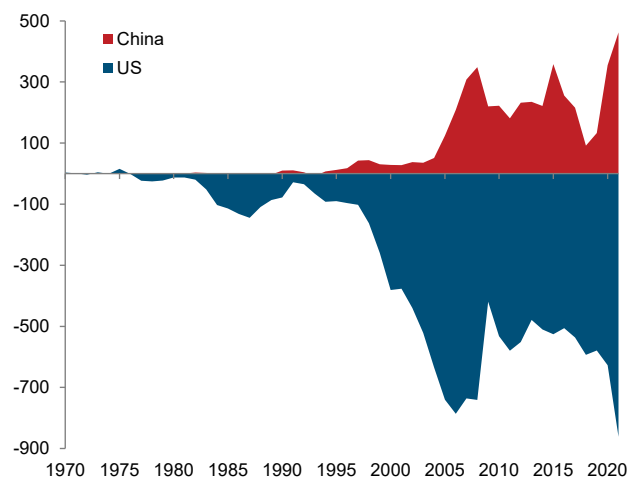
Source: IMF, Goldman Sachs GIR.

China grew faster than the US over the last several decades
Real GDP growth, annual % change (through 2022)



Source: IMF, Goldman Sachs GIR.

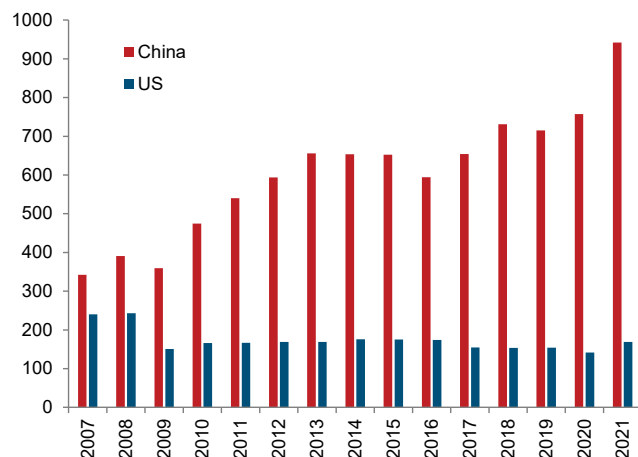
The US has long been a net importer, and China a net exporter
Trade balance (exports-imports), US\$bn (through 2021)



Note: Includes both goods and services trade.

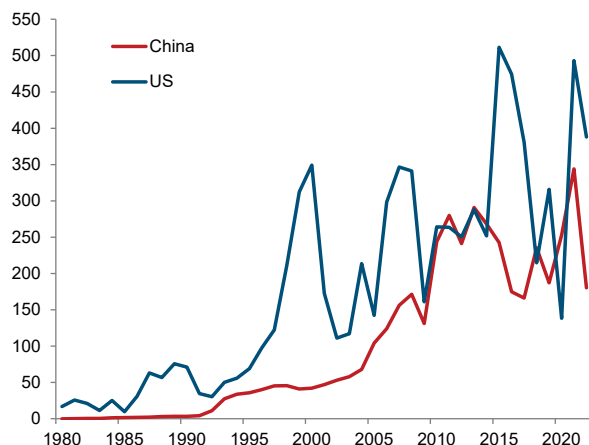
Source: World Bank, Goldman Sachs GIR.

China exports significantly more high-tech products than the US
High-technology exports, US\$bn



High-tech exports are products with high R&D intensity, such as aerospace, computers, pharmaceuticals, scientific instruments, and electrical machinery.
Source: World Bank, Goldman Sachs GIR.

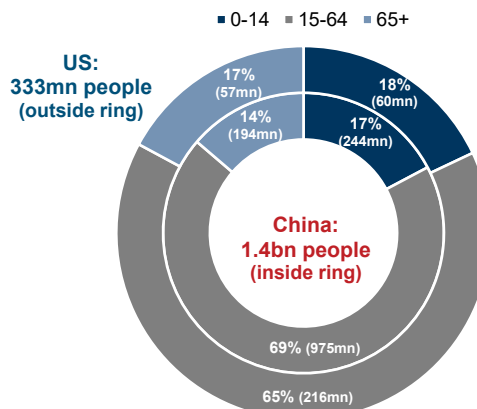
The US was a larger recipient of foreign direct investment (FDI) than China in 2022, for the second consecutive year
FDI net inflows (BoP, US\$bn) (through 2022)



Source: World Bank, Goldman Sachs GIR.

The demographic breakdowns of the US and China continue to look quite similar

Population by age group, % of total population (2022)
(total population in parentheses)

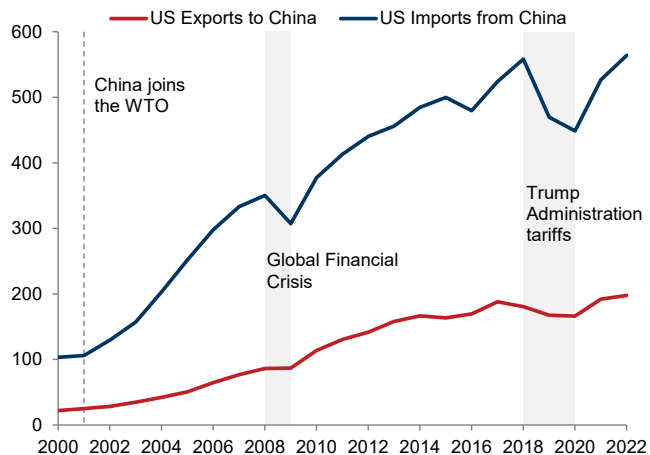


Total population includes all residents regardless of legal status/citizenship.
Source: World Bank, Goldman Sachs GIR.

...that remain closely linked

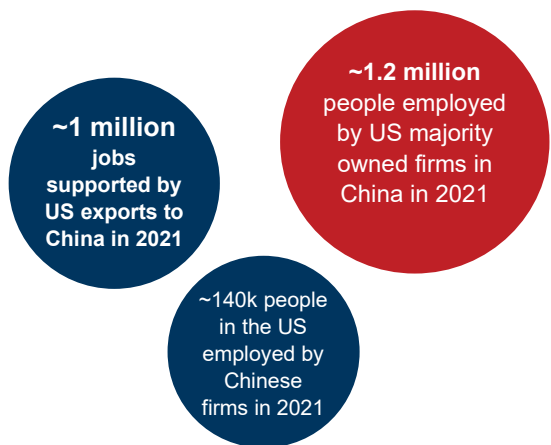
The US and China are one of each other's main trading partners and the value of US exports and imports to and from China has steadily risen over the last two decades

Trade in goods and services between the US and China, \$bn



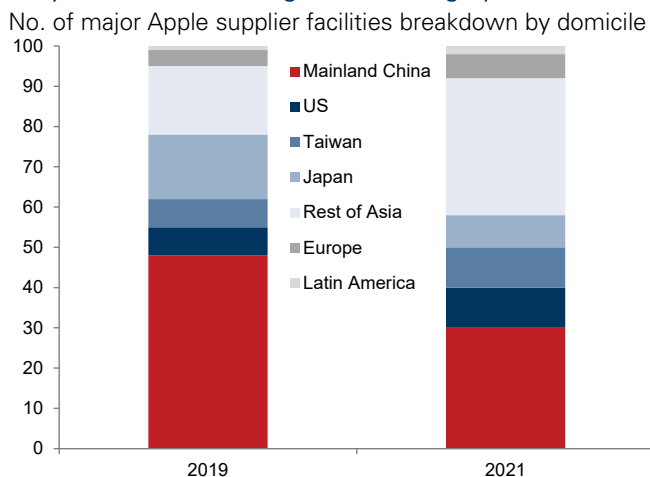
Source: US Bureau of Economic Analysis, Goldman Sachs GIR.

Jobs in the US and China rely on their trading partnership and expansion of US and Chinese multinational corporations



Source: US-China Business Council, Bureau of Economic Analysis, Rhodium Group, Goldman Sachs GIR.

...and rely on manufacturing facilities in Mainland China, though recently some have tried to diversify their supply chain away from Mainland China given increased geopolitical tensions



Source: Apple, Goldman Sachs GIR.

US agricultural exports to China reached a record high in 2022 and the US imported large amounts of electronic equipment and machinery from China

US exports and imports of goods to/from China in 2022

US Main Imports of Goods from China		
	\$bn	% of total imports from China
Electrical, electronic equipment	145.8	27%
Machinery, nuclear reactors, boilers	112.7	21%
Toys, games, sports requisites	42.8	8%
Chemicals	35.0	7%
Furniture, lighting signs, prefabricated buildings	29.7	6%
Plastics	26.4	5%
Total imports from China	536.8	
US Main Exports of Goods to China		
	\$bn	% of total exports to China
Agricultural products (ex. livestock, forestry, and marine products)	38.2	25%
Chemicals	25.7	17%
Medical equipment, Pharmaceutical products	20.2	13%
Electrical, electronic equipment	16.0	10%
Machinery, nuclear reactors, boilers	14.9	10%
Oil and gas	11.0	7%
Total exports to China	153.8	

Source: U.S. Census Bureau Trade Data, Goldman Sachs GIR.

A large number of US companies derive a significant portion of their revenues from China...

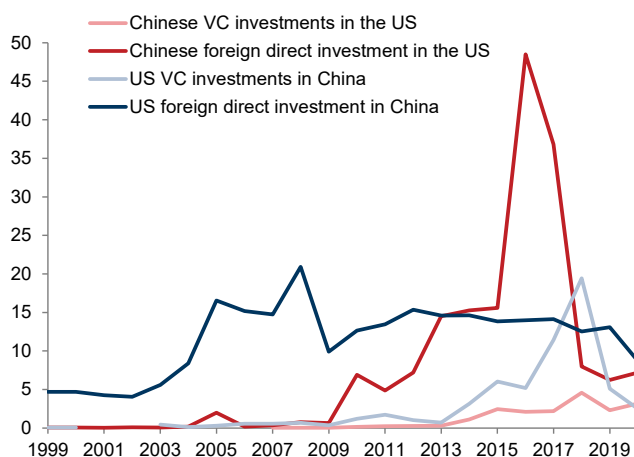
Selected US companies' revenue exposure to China in 2022

	Share of revenues from China	Revenue exposure to China (\$mn)
Qualcomm	64%	28,119
Texas Instruments	49%	9,844
Marvell Technology	42%	2,486
Broadcom	35%	11,621
Applied Materials	28%	7,254
Intel	27%	17,125
NVIDIA	26%	7,111
Tesla	22%	18,145
Apple	19%	74,200
Nike	17%	7,547

Source: Company 10k filings, Goldman Sachs GIR.

...and investment flows between the US and China have also decreased in recent years as bilateral tensions have escalated

US-China investment flows, \$bn

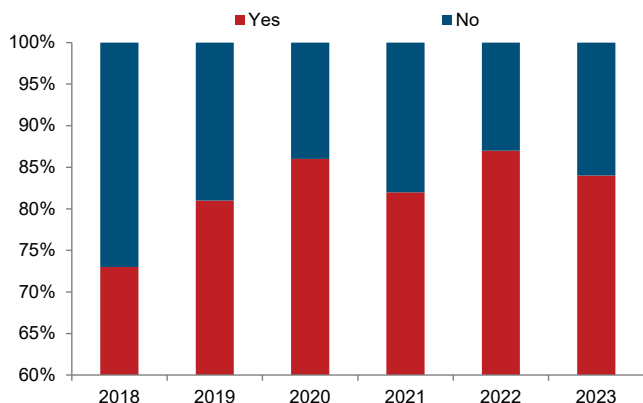


Source: Rhodium Group, Goldman Sachs GIR.

But US-China sentiment...

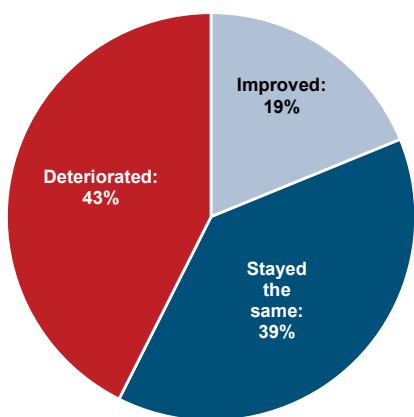
US companies doing business in China continue to be affected by US-China tensions...

% of member companies that responded yes/no to the question "has your company's business with China been affected by US-China tensions?" (2018-22) and "have US-China tensions impacted your business in China?" (2023)



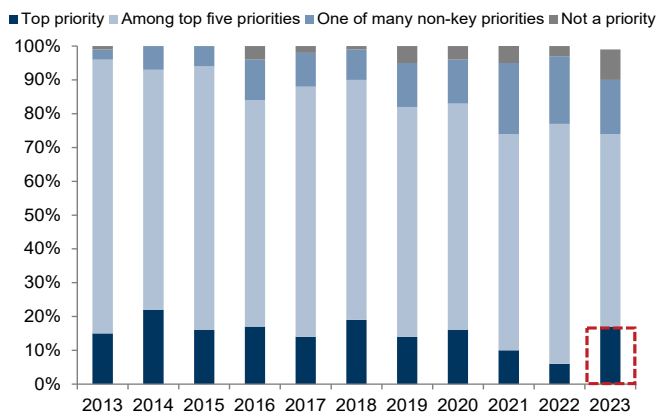
Around 40% of US companies say the business climate in China has deteriorated over the last year...

% of member companies that gave each answer to "over the last 12 months, China's business environment has..."



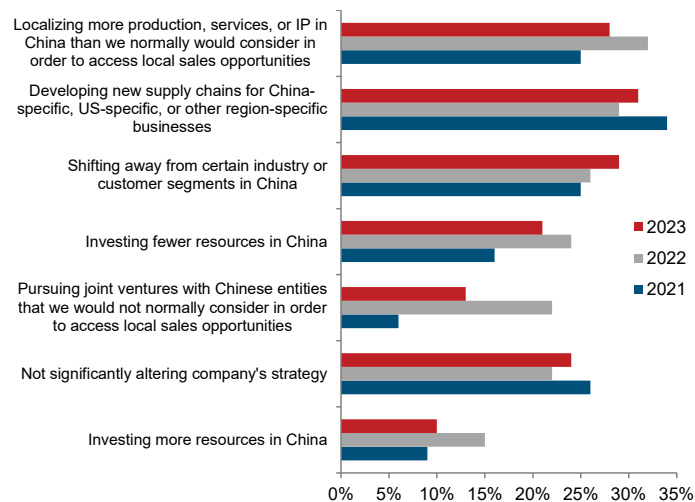
More companies have reported that China is a top priority in their company strategy...

% of member companies on how "China's prominence in overall company strategy" has evolved

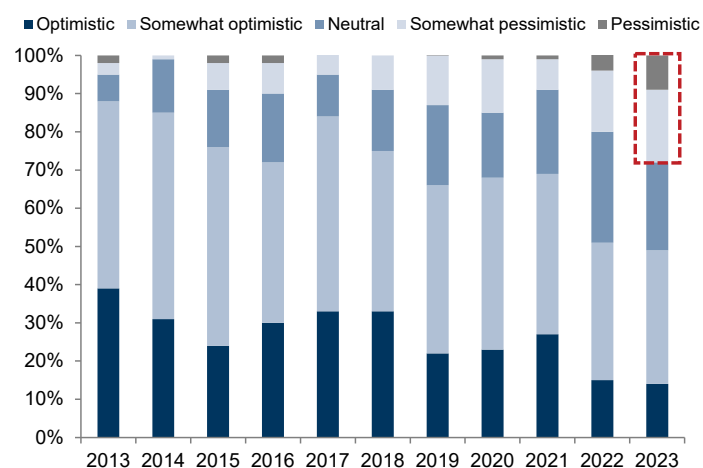


Source for all exhibits: *US-China Business Council's 2022 Member Survey conducted in June 2022 and 2023 Member Survey conducted in June-July 2023*; survey draws from a pool of 117 member companies; majority of respondents (2/3) have operated in China for more than 20 years.

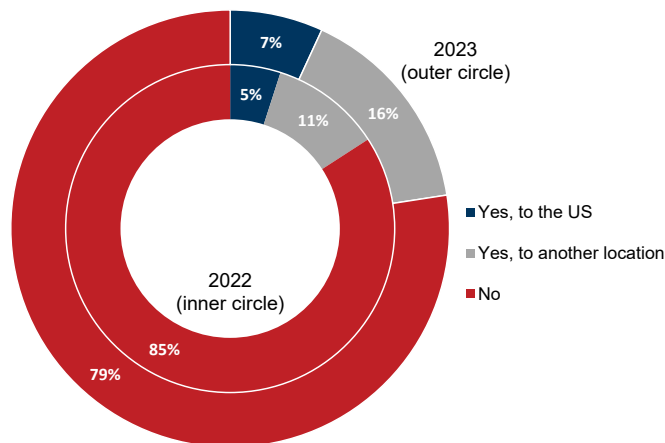
...and many have continued to respond by altering their strategies % of member companies that reported taking each action "due to the impact of tensions"



...and more firms have become pessimistic on the five-year outlook % of member companies on their view of the "five-year outlook for business in China"



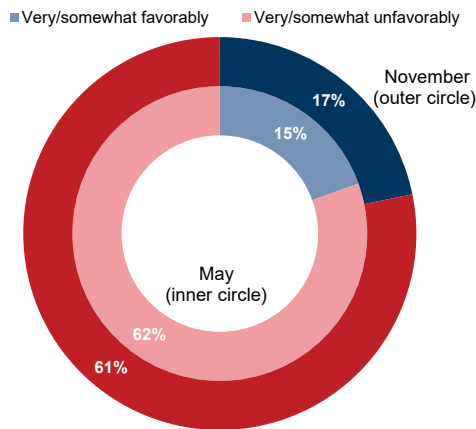
...though more firms have or are planning to move operations out % of member companies answering each to "has your company moved or does it plan to move any operations out of China?"



...remains mutually unfavorable

A large majority of Americans continue to view China unfavorably...

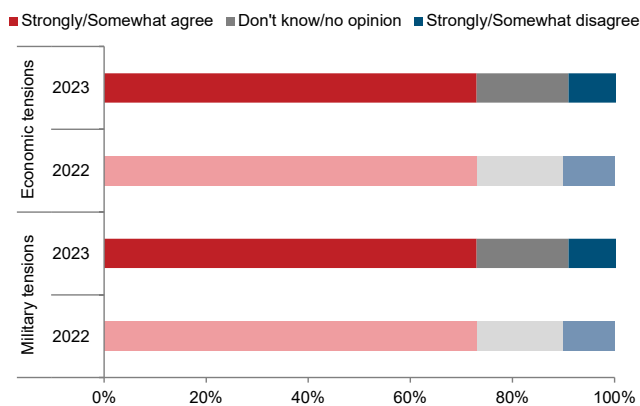
Shares indicating how US respondents view China (May 1 and November 1 2023 data)



Source: *Morning Consult's US-China Relations Barometer*, Goldman Sachs GIR.

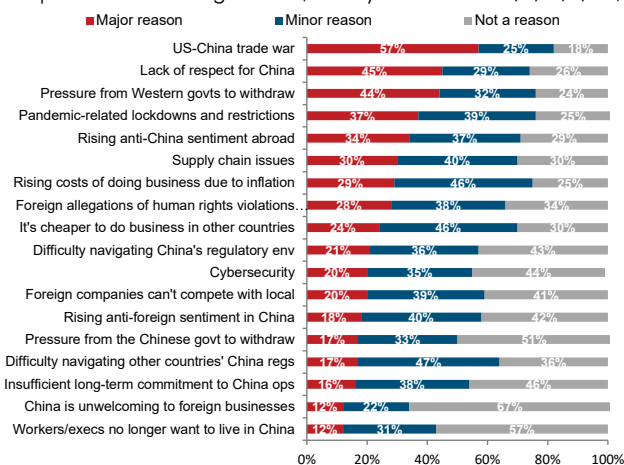
A majority of Americans continue to believe that the US and China should work together to reduce bilateral tensions...

US share reporting that the US and China should work together to reduce the below tensions (2022 figures from survey conducted 11/2-11/3/22, 2023 figures as of Oct 23)



Chinese consumers view foreign companies' decisions to exit China as being primarily driven by geopolitical considerations...

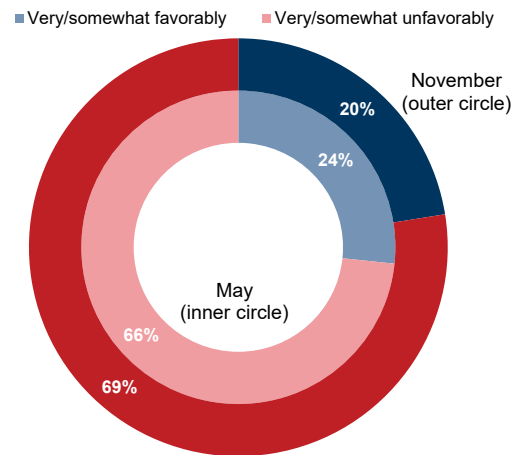
China internet-using share reporting why they believe foreign companies are exiting China (survey conducted 6/1-6/6/22)



Source for charts 3-6: *November 2023 and December 2022 Morning Consult Survey on the state of US-China relations* (survey among representative samples of roughly 1k adults in each country), Goldman Sachs GIR.

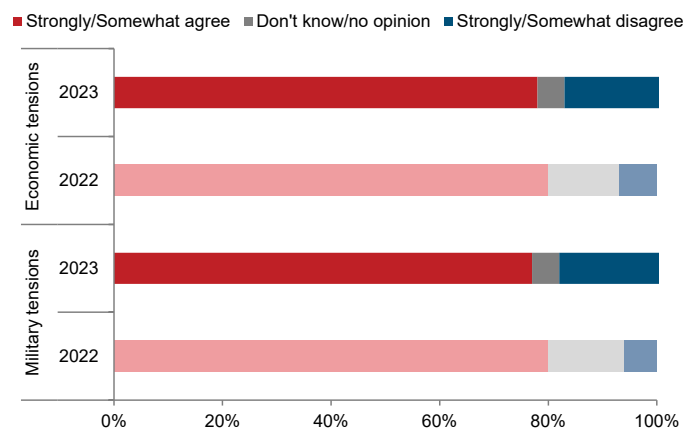
...as do a large majority of Chinese

Shares indicating how Chinese respondents view the US (May 1 and November 1 2023 data)



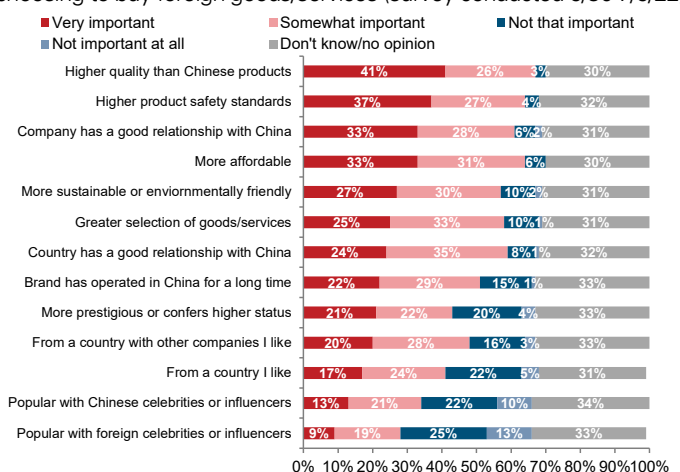
Source: *Morning Consult's US-China Relations Barometer*, Goldman Sachs GIR.

...as do a majority of Chinese, though share who disagree has risen China internet-using share reporting that the US and China should work together to reduce the below tensions (2022 figures from survey conducted 11/2-11/6/22, 2023 figures as of Oct 23)

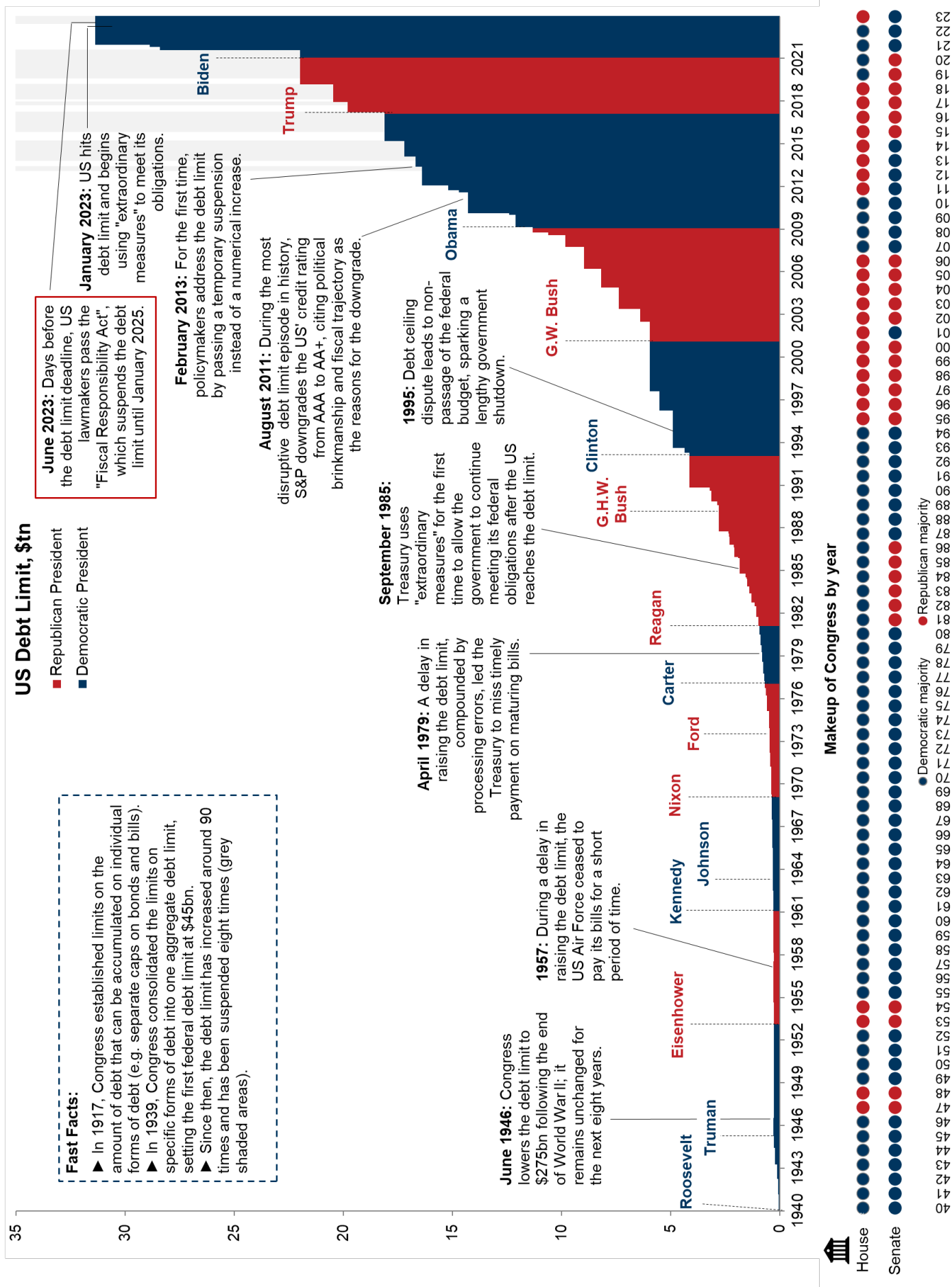


...yet other factors trump geopolitical considerations as the main drivers of Chinese demand for foreign goods and services

China internet-using share reporting the importance of each when choosing to buy foreign goods/services (survey conducted 6/30-7/6/22)



US debt limit debacle postponed...



Note: Grey bars indicate periods when the debt ceiling was suspended.

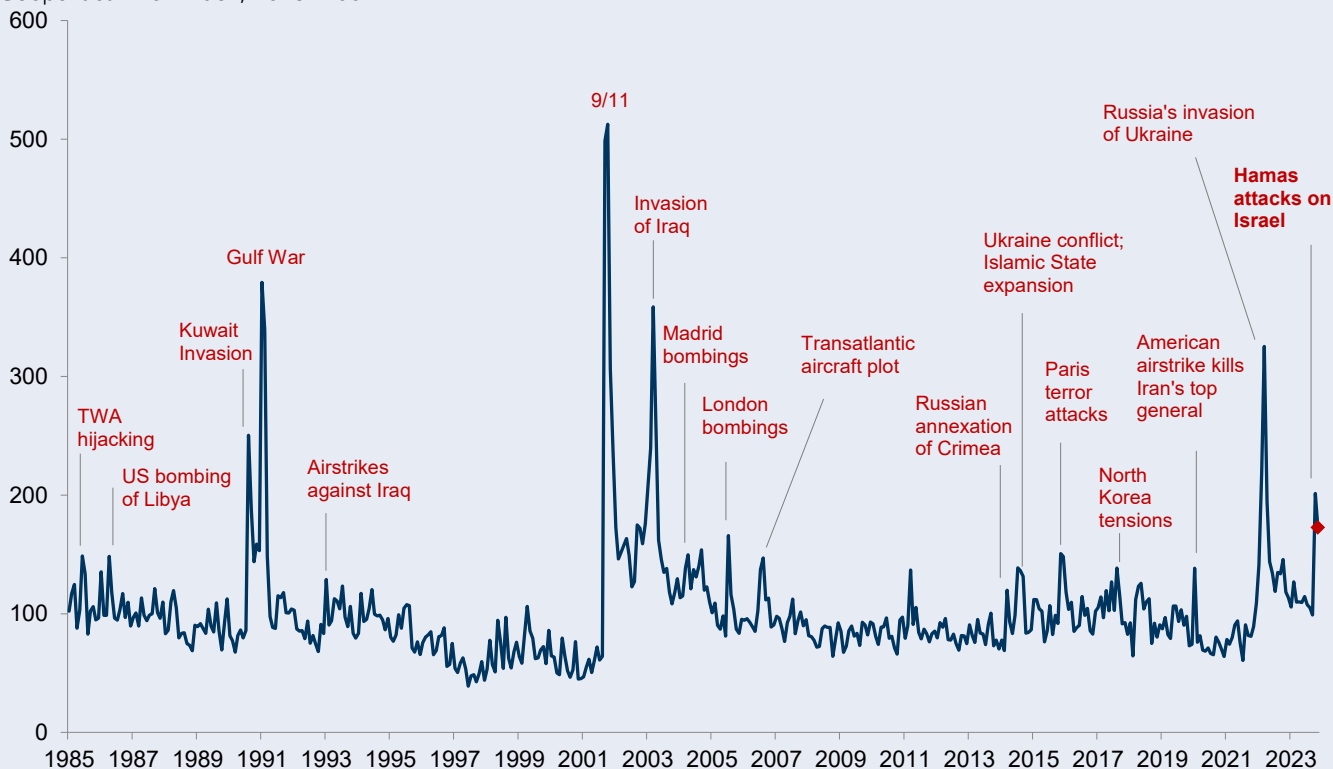
Source: Bipartisan Policy Center, Haver Analytics, White House History, US Senate, Goldman Sachs GIR.

...but global geopolitical risk has risen

Geopolitical tensions, which take many different forms, are difficult to measure. One proxy for assessing the geopolitical environment is the news-based Geopolitical Risk Index developed by economists from the Federal Reserve Board.

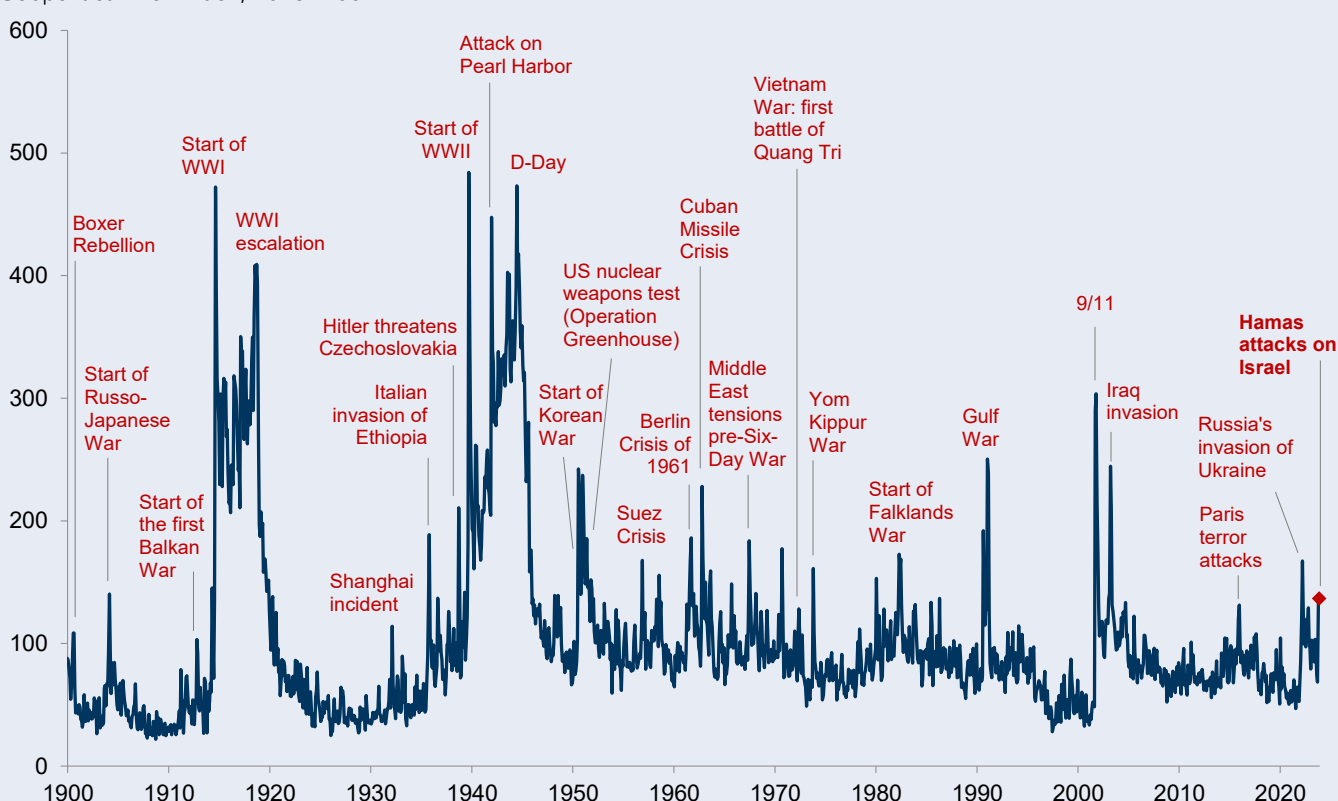
1985-Present

Geopolitical Risk Index, 2019=100



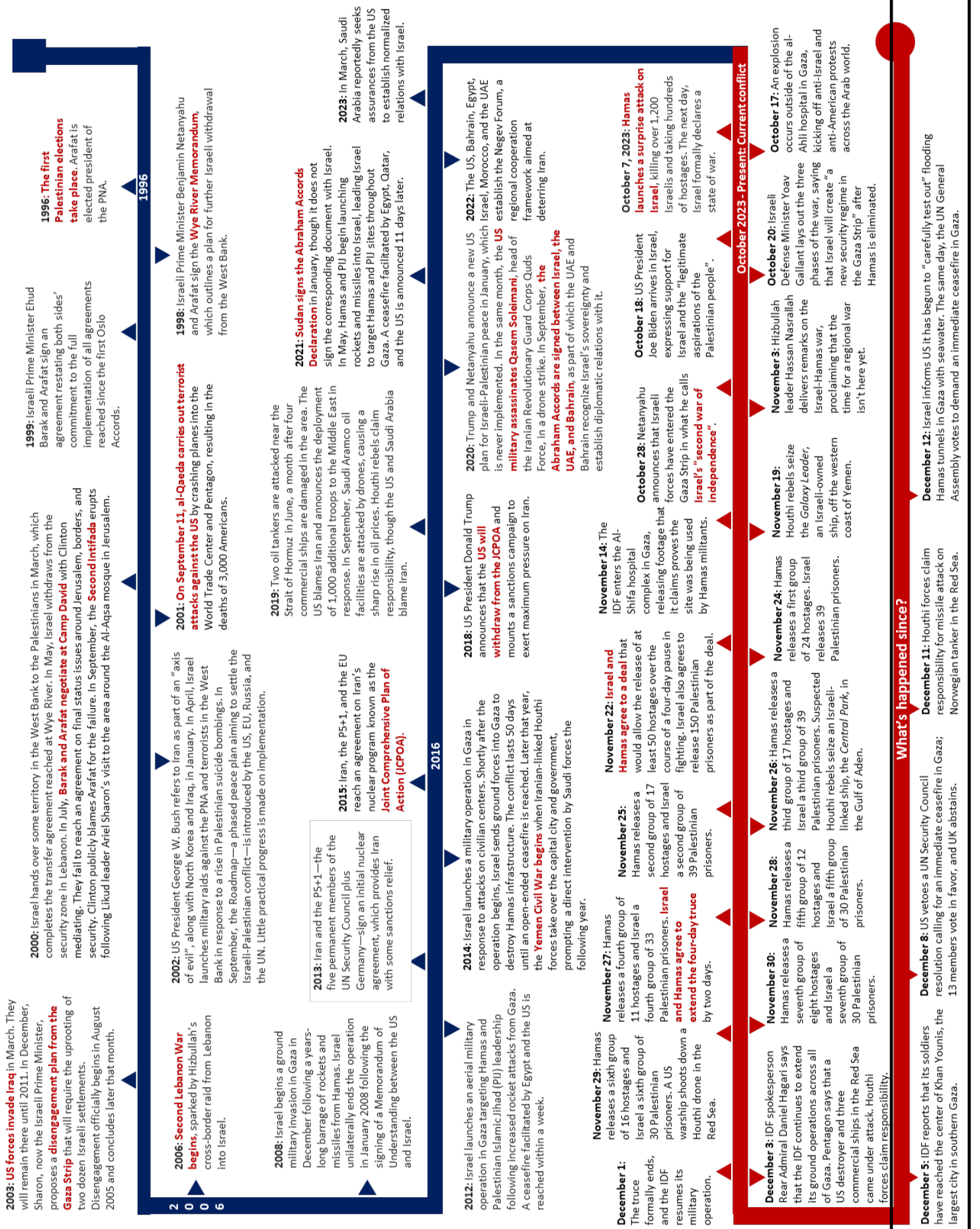
1900-Present

Geopolitical Risk Index, 2019=100

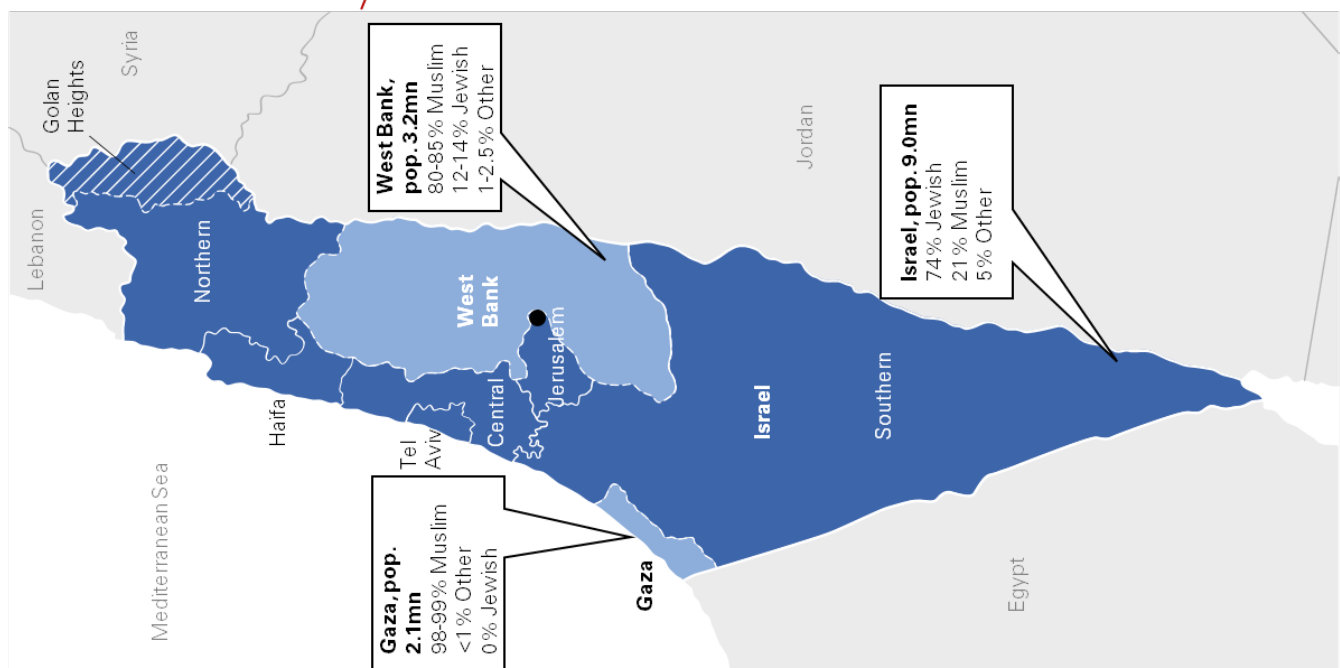
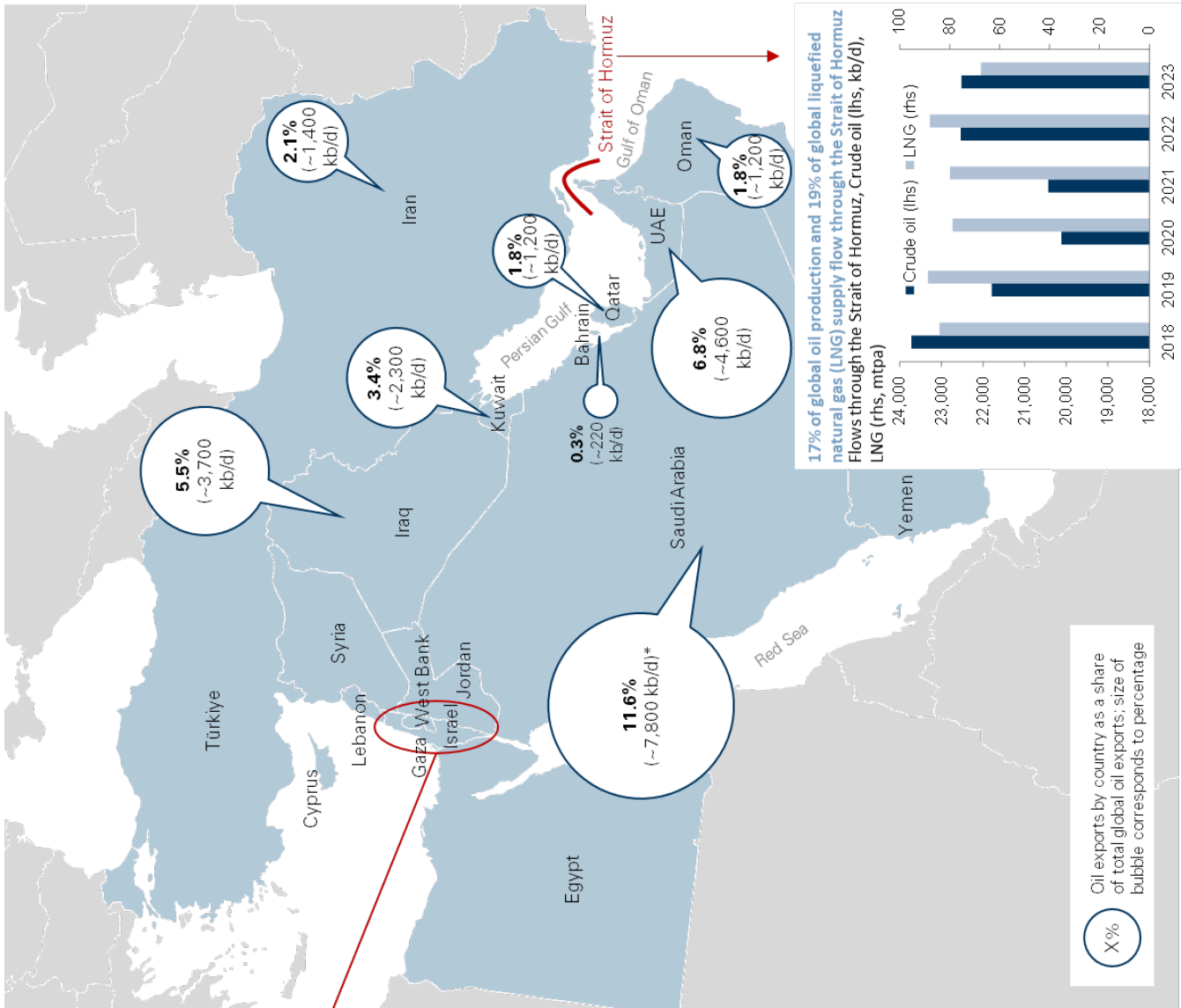


Note: The index from 1985 on counts the number of articles in 11 US, UK, and Canadian newspapers mentioning phrases related to geopolitical tensions. The index from 1900 on performs the same analysis using the archives of three newspapers, the New York Times, the Wall Street Journal, and the Financial Times. The choice of newspapers for both indices imply a measure of geopolitical risk as covered by the Anglo-Saxon press. See [here](#) for more information.

Source: Dario Caldara & Matteo Iacoviello, Federal Reserve Board, Goldman Sachs GIR.



...with escalation potentially impacting oil



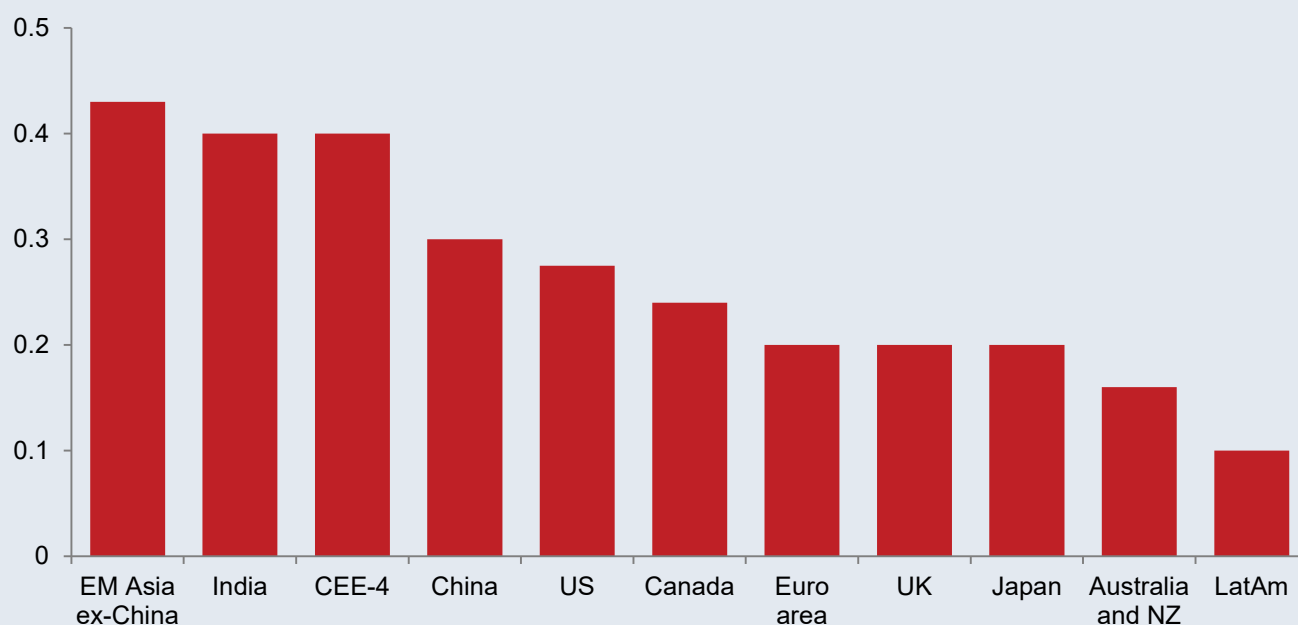
Note: In 2019, the US became the only country (besides Israel) to officially recognize the Golan Heights as being under the sovereignty of Israel. Outside of that, it is internationally recognized as a Syrian territory. Population figures are 2023 estimates from the CIA's World Factbook. *Minority of Saudi Arabia oil exports flow through the Red Sea. Source: CIA's World Factbook, Getty Images, Xper, Goldman Sachs GIF. Special thanks to GS Commodity Strategists Callum Bruce and Daniel Moreno for the chart.

...with severe economic impacts

GS GIR economists estimate the impact a \$10/bbl rise in Brent crude oil prices would have on inflation and GDP growth across major economies and regions. Their key findings are below.

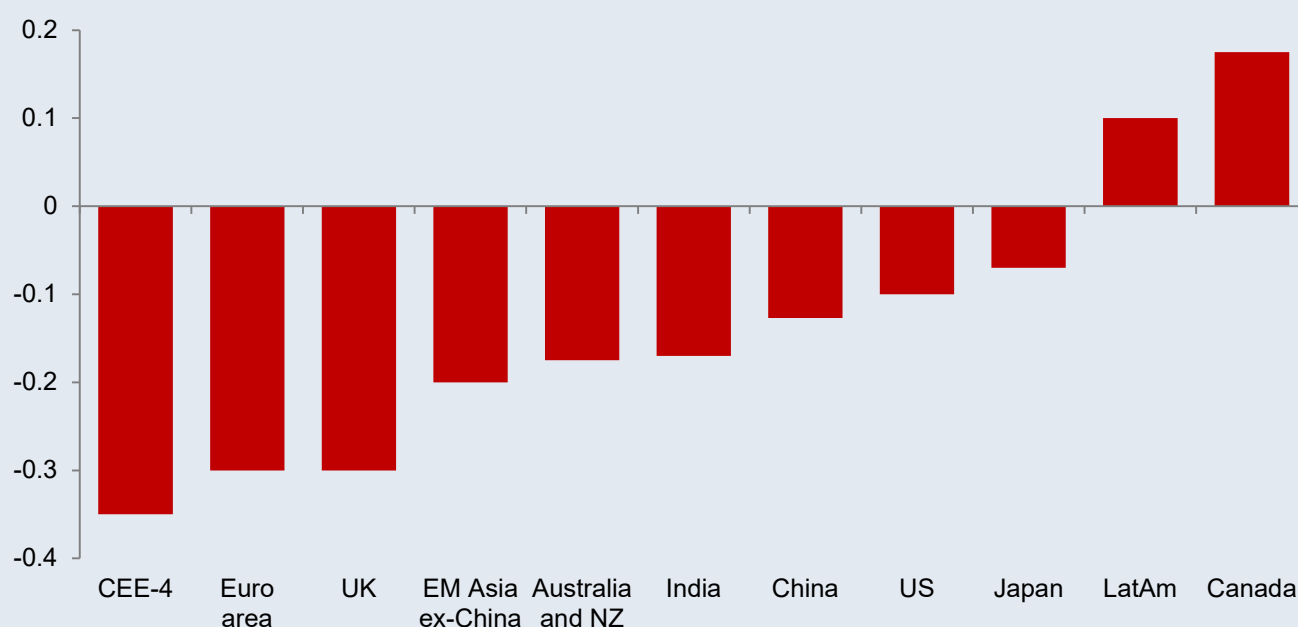
A \$10/bbl increase in oil prices would have moderate impacts on inflation, with generally larger impacts across EMs than DMs...

Effect of a \$10/bbl increase in Brent oil prices on headline inflation, pp



...as well as modest negative impacts on growth, though net oil exporters such as Canada and some Latin American economies would see a positive impact

Effect of a \$10/bbl increase in Brent oil prices on GDP, %



Notes and source: Figures and methodology originally published in Joseph Briggs and Devesh Kodnani's "Global Economics Analyst: The Boost to Global Growth and Inflation from China's Reopening", February 2, 2023. Impacts on China inflation and GDP come from Jonathan Sequeira's "Potential Impact of Tighter Oil Supply on Emerging Asia", February 23, 2022.

3

Amid all that, two **longer-term** questions attracted heated debate:



Can US economic and asset outperformance continue?

And is the potential of generative AI really that great?

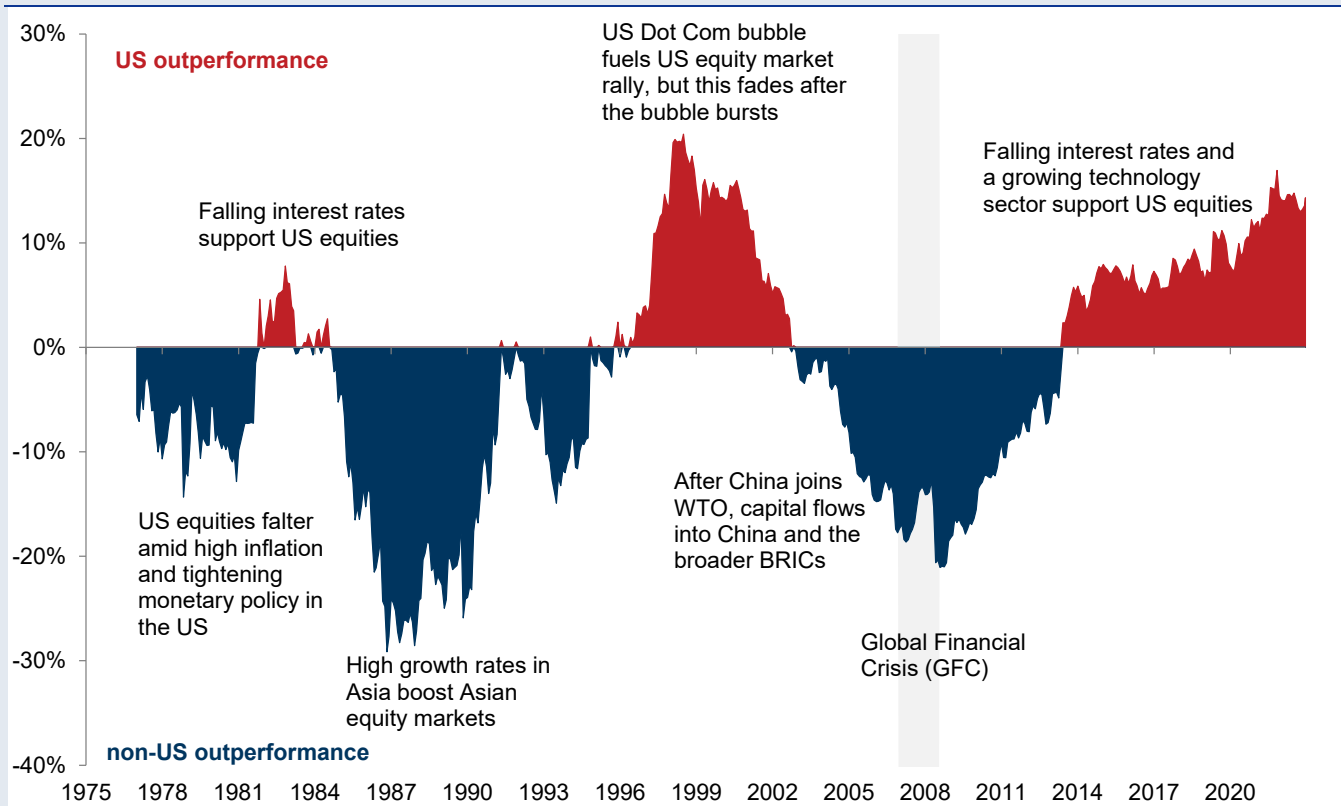


Pgs. 33-38

The pendulum swung toward US assets

While US equities have outperformed non-US equities over the past decade, historically, the performance of US versus non-US equities has rotated over time

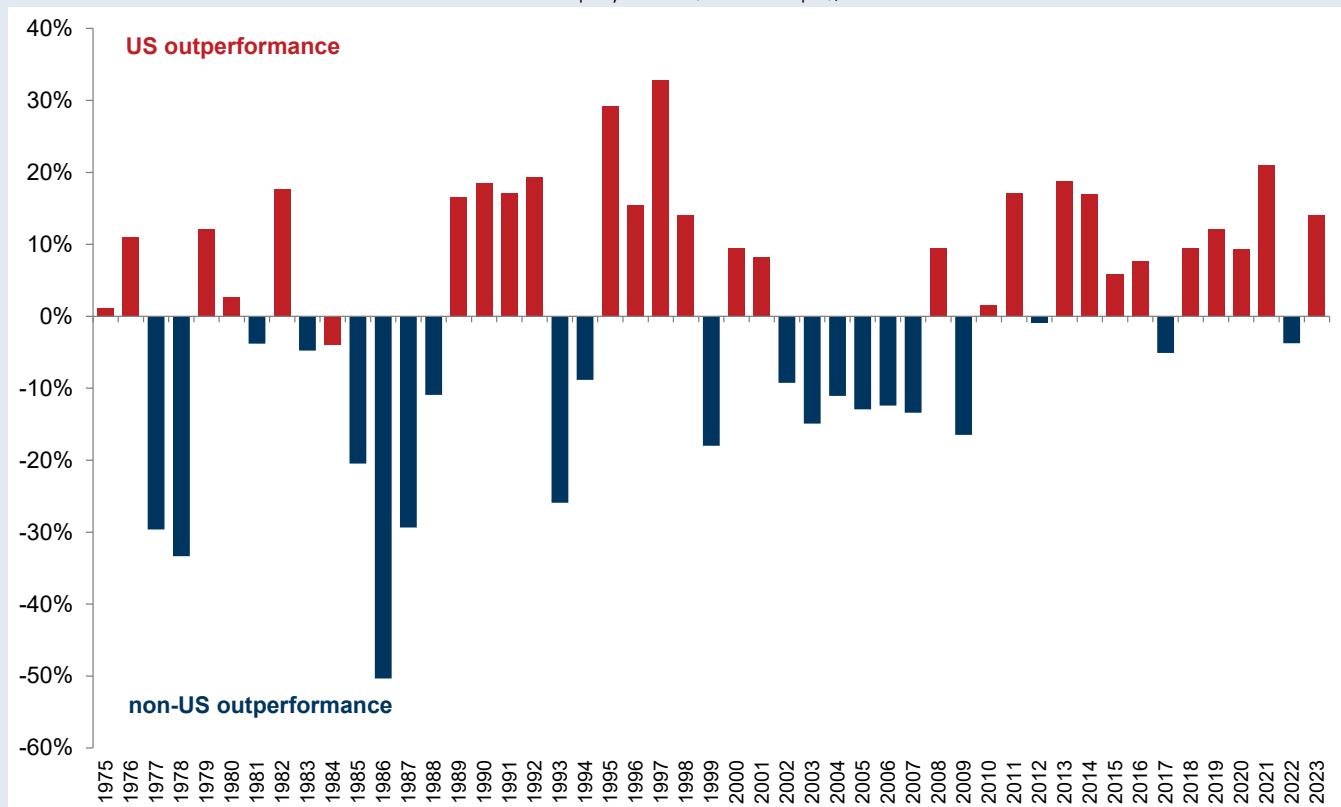
5-year rolling average of annualized monthly relative return of S&P 500 vs. World ex. US equity index (Worldscope), %



Source: Bloomberg, Worldscope, Goldman Sachs GIR.

On an annual basis, US equities have outperformed non-US equities in most years since the end of the Global Financial Crisis (GFC)

Annual relative return of S&P 500 vs. World ex. US equity index (Worldscope), %

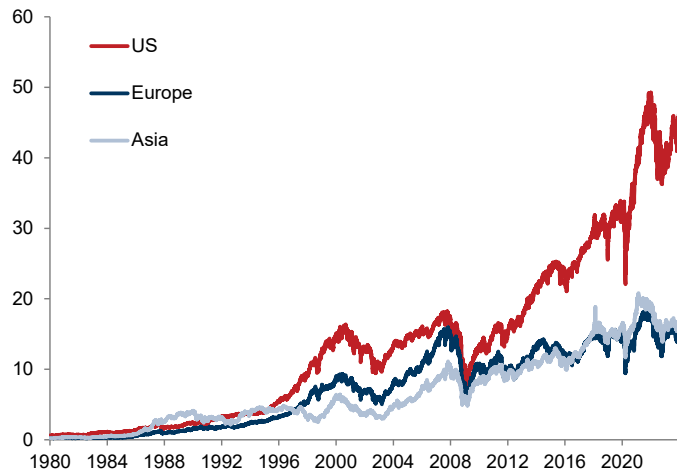


Source: Bloomberg, Worldscope, Goldman Sachs GIR.

...though there is more to the story

The US' market cap eclipses that of other major regions...

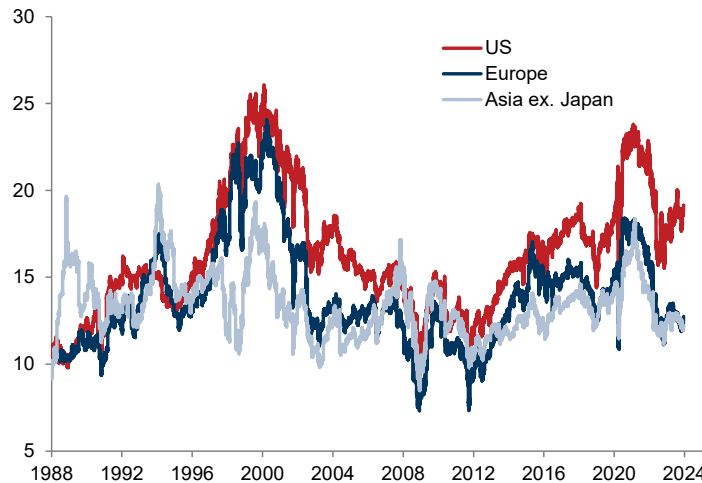
Market capitalization, \$tn



Source: Datastream, Goldman Sachs GIR.

...and US equities trade at a significant premium to other markets...

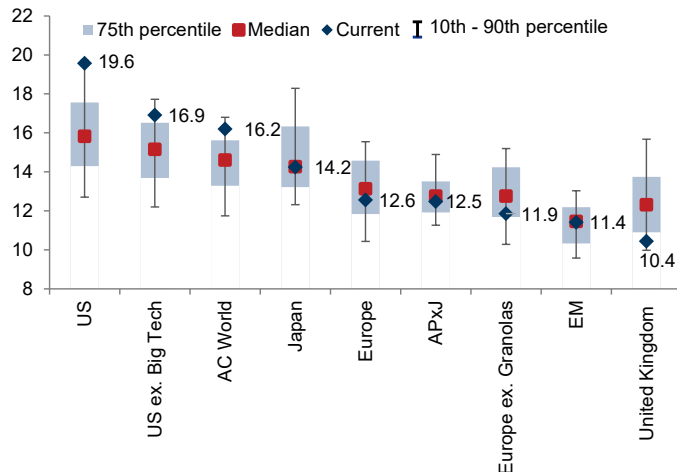
12m forward P/E ratio



Source: Datastream, Worldscope, Goldman Sachs GIR.

...and trade near the top of their historical valuation range

12m P/E multiple

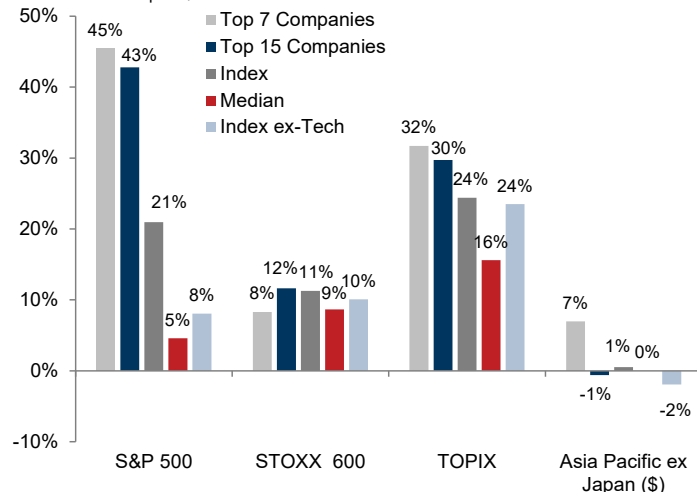


Note: Granolas are 11 of the largest European companies by market cap—GSK, Roche, ASML, Nestle, Novartis, Novo Nordisk, L'Oréal, LVMH, AstraZeneca, SAP, and Sanofi.

Source: FactSet, Goldman Sachs GIR.

However, much of the recent US equity exceptionalism is driven by a handful of big companies

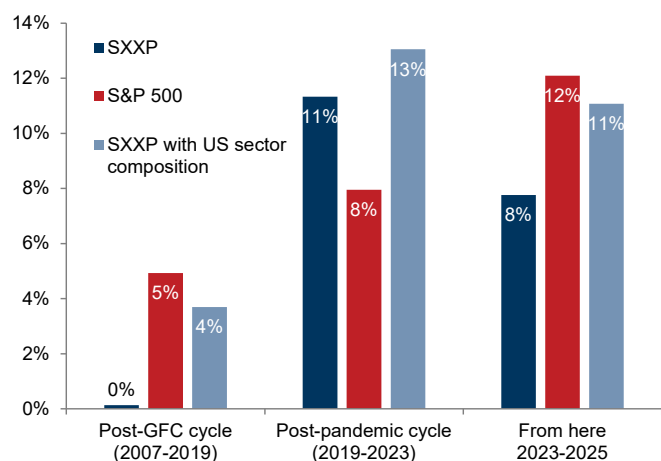
Year-to-date price return (in local currency terms, in \$ for Asia Pacific ex. Japan)



Source: Datastream, STOXX, Goldman Sachs GIR.

And on net, Europe has outgrown the US in the post-pandemic cycle

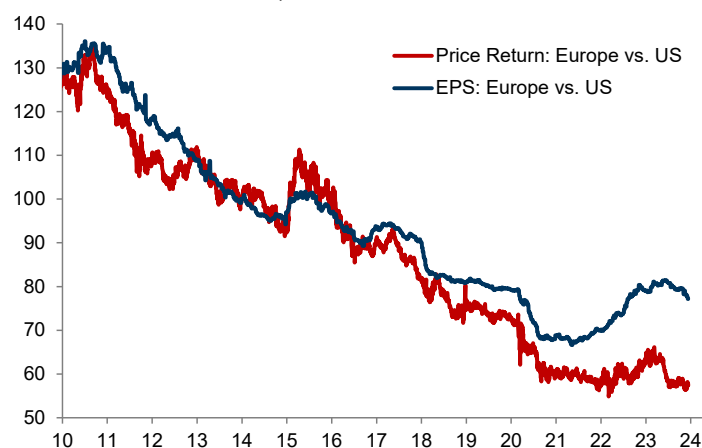
Annualized EPS growth, %



Source: Goldman Sachs GIR.

And overall since 2020, Europe has outperformed on improvement in its earnings

Price return performance and 12m forward EPS, STOXX 600 vs. S&P 500 (in local currency terms)

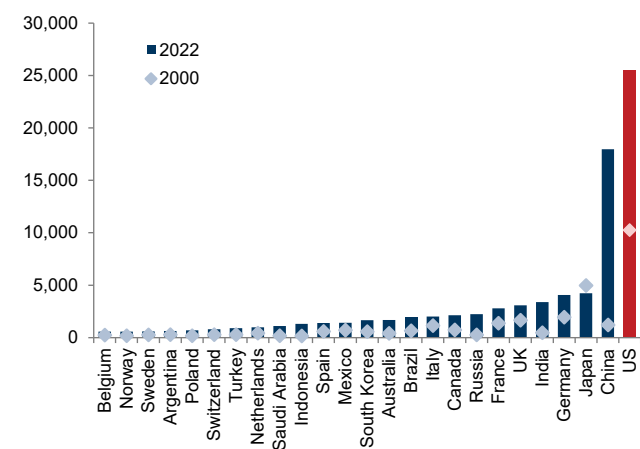


Source: Datastream, STOXX, Goldman Sachs GIR.

The US remains well positioned...

The US has long had the highest GDP in the world, and it has more than doubled since 2000, marking the second largest GDP growth after China...

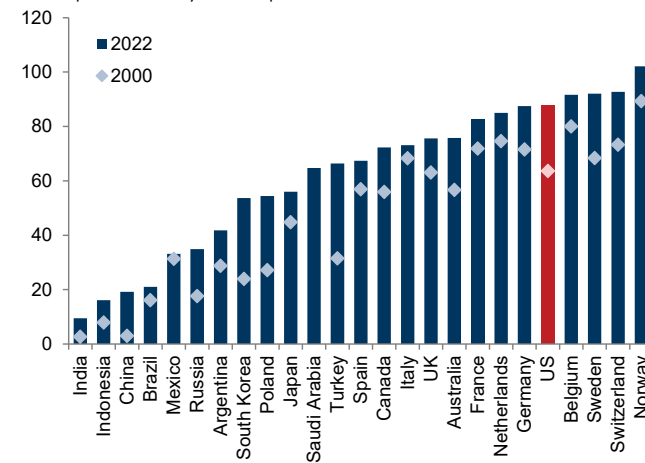
Nominal GDP, \$bn



Source: The World Bank, Goldman Sachs GIR.

...as well as high levels of labor productivity, which has increased by close to 40% since 2000

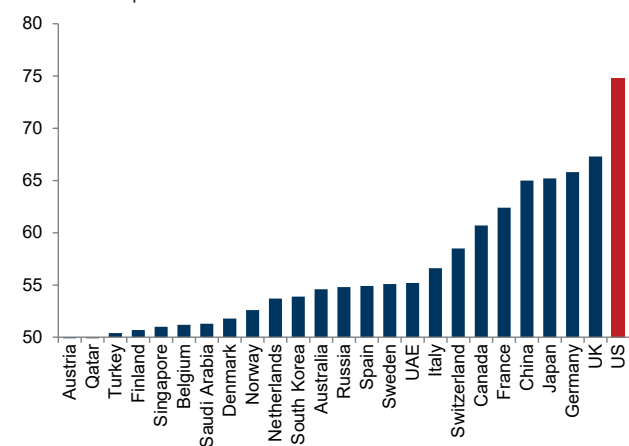
Labor productivity (GDP per hour worked in 2022 USD*)



*Converted using purchasing power parity. Source: Conference Board, Goldman Sachs GIR.

The US has a large global influence, ranking number one in global soft power...

Global soft power index



Note: The Global Soft Power Index incorporates a broad range of measures to assess nations' presence, reputation, and impact on the world stage. Data for 2023. Source: Brand Finance, Goldman Sachs GIR.

...and the US ranks high in global innovation, although the US' ranking in the Global Innovation Index fell from second to third this year

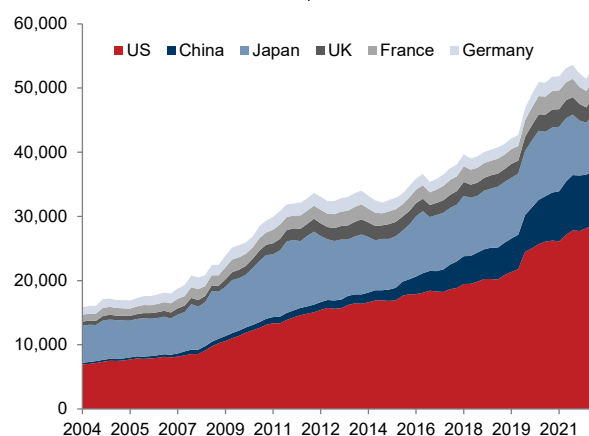
Global Innovation Index



*Index begins in 2013. Note: Indicates an economy's capacity for and success in innovation, measured by innovation input (elements of the economy that enable and facilitate innovative activities) and innovation output (the result of innovative activities within the economy). Source: Global Innovation Index, Goldman Sachs GIR.

The US also has the largest sovereign bond market in the world and it has grown by over 450% since 2000...

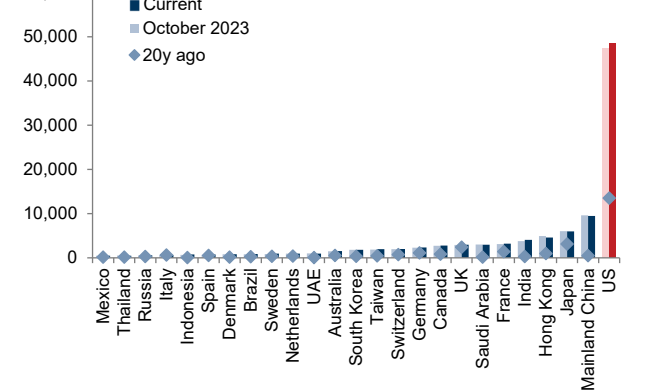
Government debt securities, \$bn



Source: Haver Analytics, Goldman Sachs GIR.

...and the largest equity market capitalization in the world, which has grown by over 250% in the last 20 years and is now almost five times larger than that of the next largest market

Total equity market capitalization per economy, \$bn

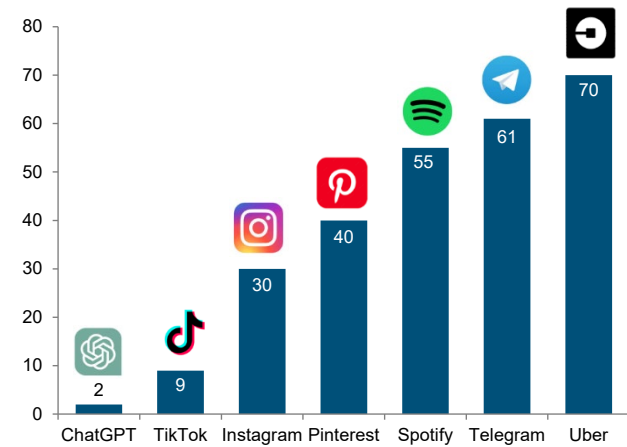


Source: Bloomberg, Goldman Sachs GIR.

...especially as the AI craze continues...

After its launch in November 2022, OpenAI's ChatGPT became the fastest application to surpass 100mn users

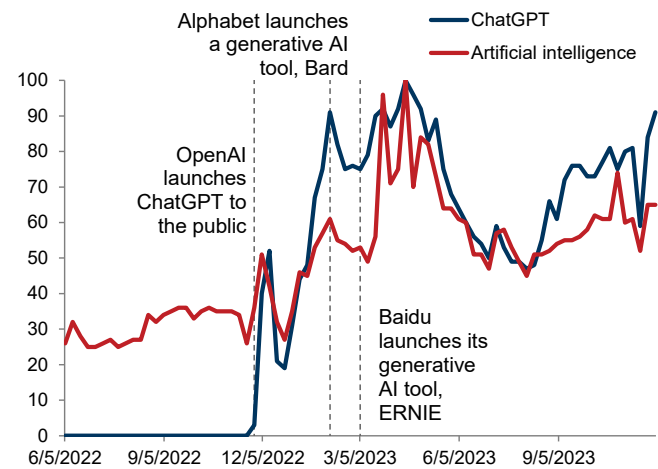
Number of months taken to surpass 100mn users



Source: Company data, Yahoo Finance, Goldman Sachs GIR.

And following ChatGPT's launch, interest in artificial intelligence increased and remains high

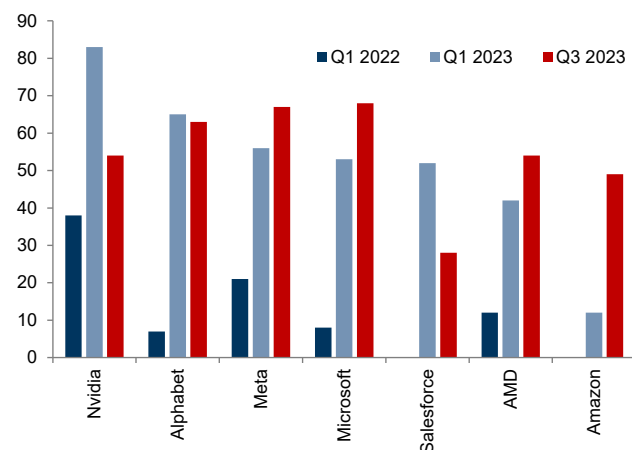
Google search trends



Source: Google Trends (<https://www.google.com/trends>), Goldman Sachs GIR.

Company management focus on opportunities from AI also increased and remains high

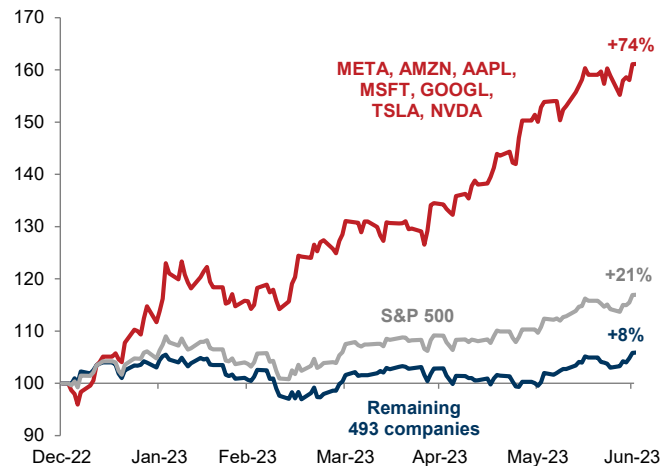
Mentions of "AI" in selected companies' earnings calls



Note: Includes mentions of "AI" in analyst/journalist questions. Source: Company data, Statista, Goldman Sachs GIR.

Mega-cap tech stocks have rallied sharply year-to-date, outperforming the broader S&P 500 index, driven by optimism about the potential benefits to companies from AI...

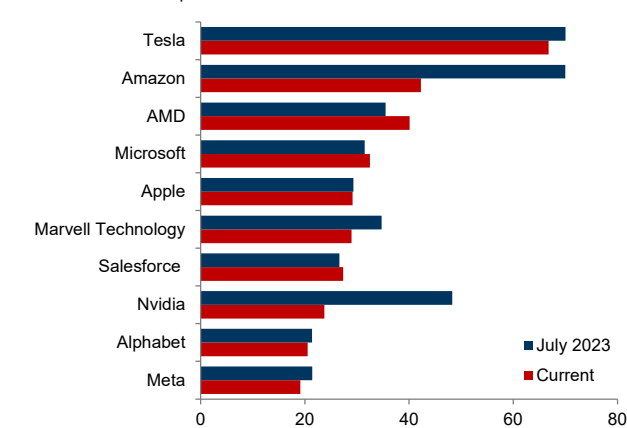
Indexed returns, 12/31/2022=100



Source: FactSet, Goldman Sachs GIR.

...and some AI-related stocks continue to trade with high price-to-earnings multiples

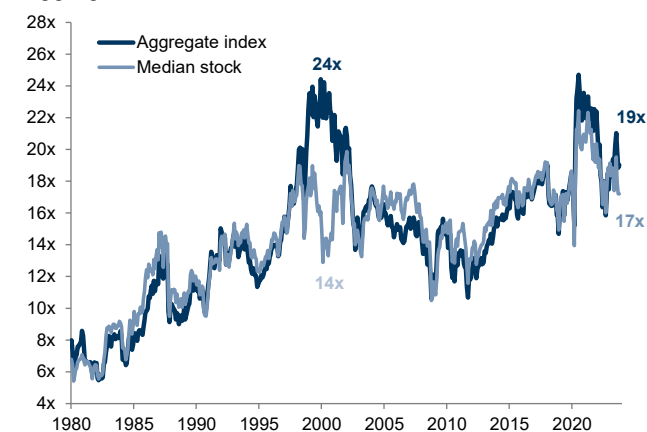
NTM P/E multiple



Source: Bloomberg, Goldman Sachs GIR.

However, the key beneficiaries of AI adoption have not pushed aggregate index valuation to the extreme level of the Dot Com Boom

Aggregate vs. median S&P 500 NTM P/E dislocation

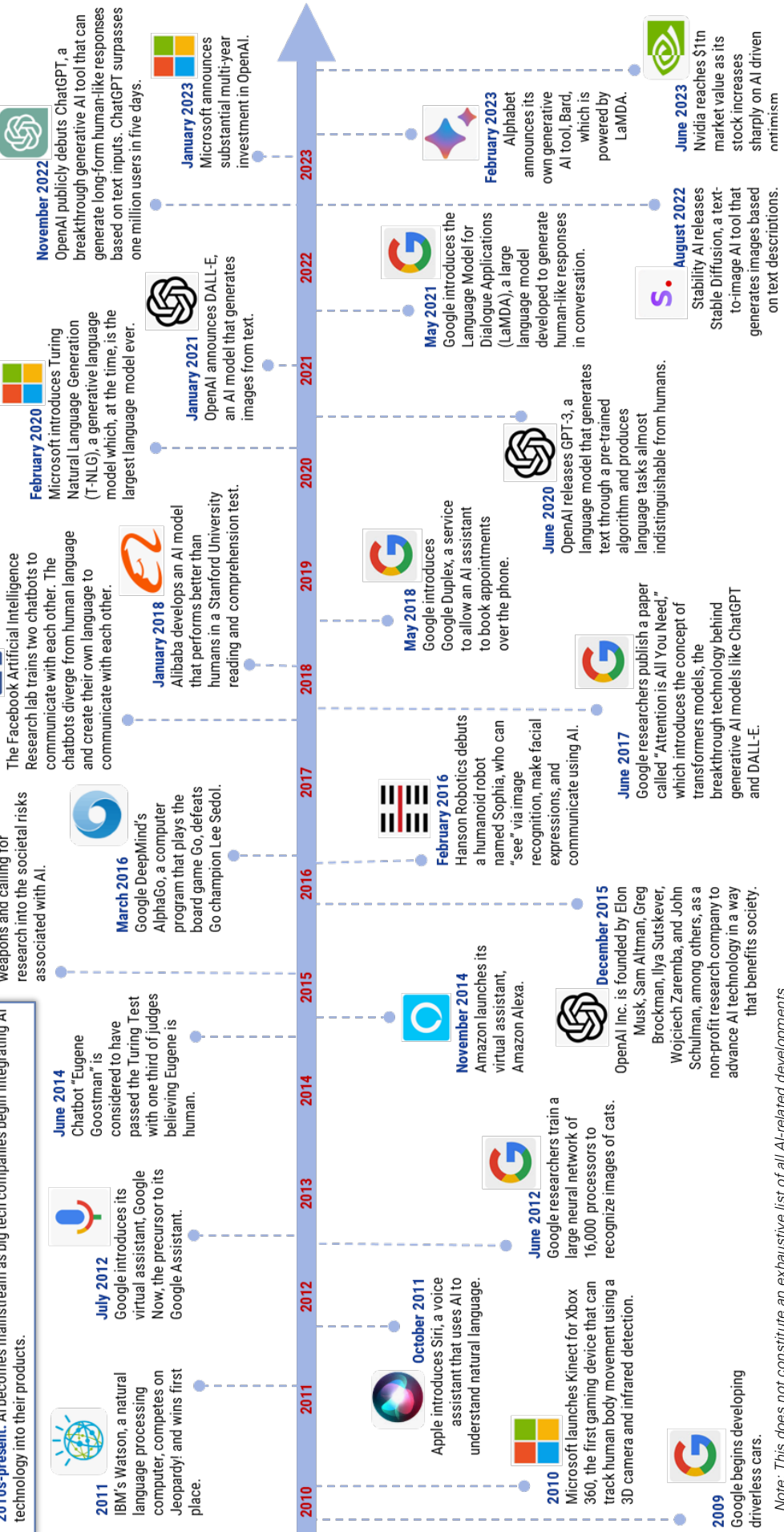


Source: Compustat, Goldman Sachs GIR.

...amid more developments in the field

Artificial intelligence (AI) through the decades
 1950s: The birth of AI. Alan Turing explores the possibility of machine intelligence and develops the Turing Test to test a machine's ability to show intelligent behavior.
 1960s: Enthusiasm about AI spreads and funding pours into the field, leading to the development of the first AI chatbot, ELIZA.
 1970s: Enthusiasm and funding for AI wanes as the technology fails to live up to optimistic expectations, leading to an AI winter.
 1980s: The rise of machine learning revives focus on AI.
 1990s-2000s: With the emergence of the internet, big data, and increased computational power, AI innovation expands rapidly.
 2010s-present: AI becomes mainstream as big tech companies begin integrating AI technology into their products.

What's happened since?
 July 2023: The Biden Administration announces that it has gotten voluntary commitments from AI developers including Google, Amazon, Meta, Microsoft, OpenAI, Anthropic and OpenAI, to develop AI in a safe and secure manner. Google, Microsoft, OpenAI and Anthropic announce that they are starting a new industry group which will work with policymakers to promote safe AI development.
 September 2023: Amazon announces it will invest up to \$4bn in AI start-up Anthropic as it seeks to establish a larger footprint in AI development.
 November 2023: Sam Altman, CEO of OpenAI, is removed by the board, only to be reinstated days later after OpenAI employees threaten to quit without him. Artificial intelligence software is used to isolate John Lennon's voice from an old demo to produce a new Beatles song.



Note: This does not constitute an exhaustive list of all AI-related developments.
 Source: Forbes, digitalwellbeing.org, Penn State University, YourStory, Goldman Sachs GIR.
 Special thanks to GS equity research analysts for help with the timeline. Original version published in Americas Technology: Generative AI – Part I: Laying out the investment framework

For those who still don't know what AI is!

Artificial intelligence (AI) is the science of creating intelligent machines. AI is a broad concept that encompasses several different subfields, including machine learning, natural language processing, neural networks, and deep learning.

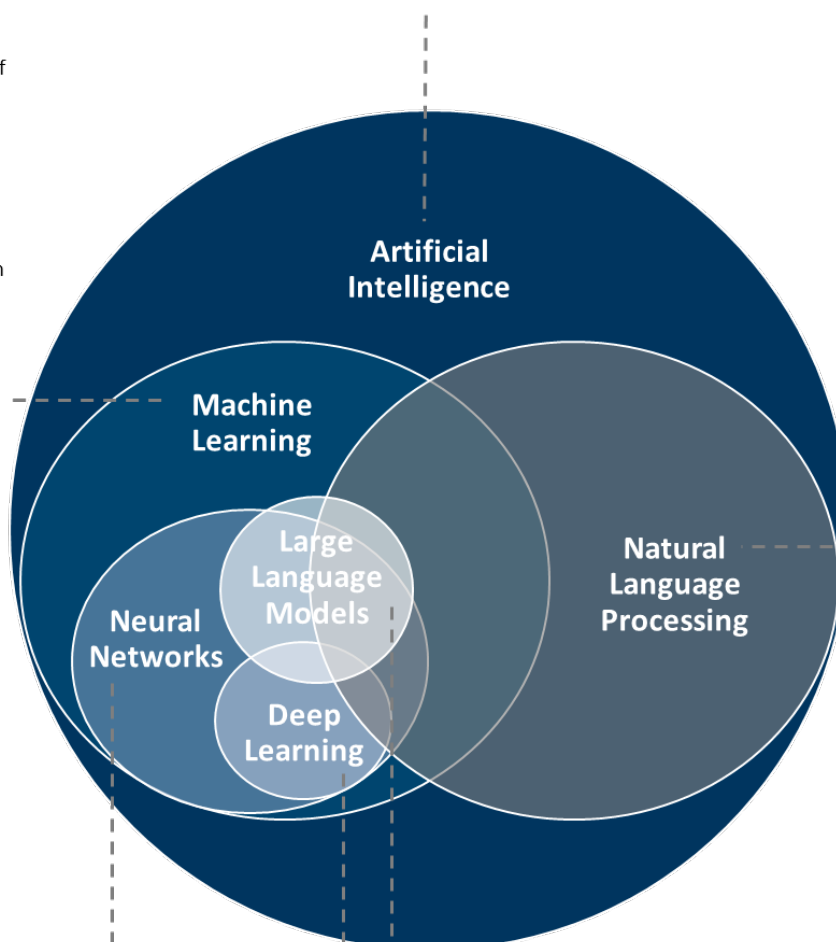
Artificial intelligence (AI) is the broadest term used to classify machines that mimic human intelligence. There are three main categories of AI: artificial narrow intelligence, artificial general intelligence, and artificial super intelligence. Artificial narrow intelligence is considered “weak AI”, which is trained to perform specific tasks, like voice or image recognition. Artificial general and super intelligence are considered “strong AI”, which has cognitive abilities equal to/greater than those of humans. No practical examples of strong AI exist today.

Generative AI is a type of AI system that generates text, images, and other content in response to natural language prompts.

Machine learning is a subfield of AI that focuses on developing models and algorithms to help computers improve their performance through experience. Large amounts of data are fed into a computer, which then discovers patterns in that data and uses it to make predictions and decisions. There are three major types of machine learning models: (1) supervised machine learning, which uses labeled datasets to train models, (2) unsupervised machine learning, which uses algorithms to analyze unlabeled datasets, and (3) semi-supervised machine learning algorithms, which sits between the first two.

Transformer models are machine learning models designed to process sequences of elements. The premise of the model is an attention mechanism, which enables the model to learn and understand the relationship between words in a sentence.

Neural networks are a subfield of machine learning. They are mathematical models inspired by the human brain structure. Each neuron, or node, of the network takes an input, performs a computation, and creates an output. If the output of any individual node is above a specified threshold value, the node is activated and sends data to the next layer of the network. One of the best-known neural networks is Google’s search algorithm.



Natural Language Processing (NLP) is a subfield of AI focused on giving computers the ability to understand text and spoken word in a similar manner to human beings. NLP uses computational linguistics combined with statistical, machine learning, and deep learning models to enable computers to understand human language. It does so using two techniques: (1) syntactic analysis, which identifies the structure and relationship between words in sentences, and (2) semantic analysis, which focuses on the meaning of the words and their context in the sentence. Google Translate is one example of NLP technology in the real world; chatbots like Siri and Alexa also rely on NLP.

Large language models (LLM) are a type of machine learning model that are trained on large amounts of unlabeled data using self-supervised learning or semi-supervised learning to perform NLP tasks. LLMs use deep neural networks to generate outputs. ChatGPT is the most well-known example of an LLM.

Deep learning is neural networks with three or more layers. Deep learning differs from “classical” machine learning by the type of data it works with and methods by which it learns. While machine learning algorithms leverage more structured, labeled data to make predictions, deep learning doesn’t necessarily require a labeled dataset, and it’s less dependent on human interaction. Deep learning is used in many applications, such as speech recognition and autonomous driving.

Source: IBM, Goldman Sachs GIR.

Special thanks to GS equity research analysts for graphic. Original version published in *Americas Technology: Generative AI – Part I: Laying out the investment framework*.

Summary of our key forecasts

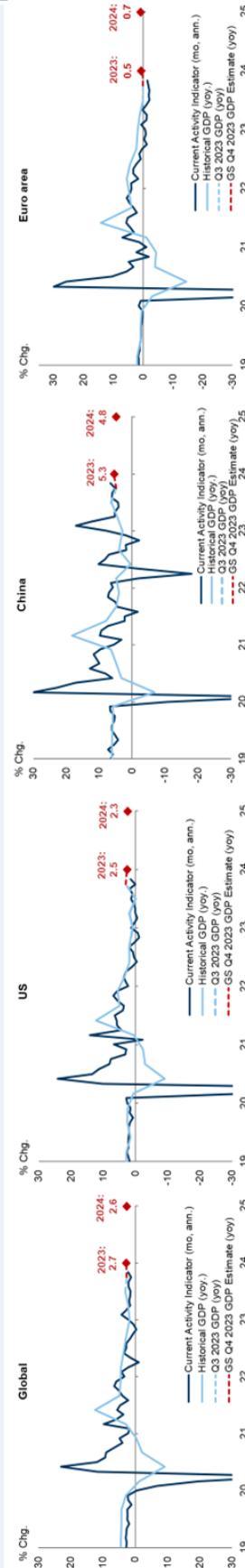
GS GIR: Macro at a glance

Watching

- **Globally**, we expect real GDP growth of 2.6% yoy in 2024, reflecting tailwinds from strong real household income growth, a recovery in manufacturing activity, and a start to rate cuts as inflation cools. We expect global core inflation to fall back toward 2% by the end of 2024 as core goods inflation continues to decline, shelter inflation falls further, and the supply-demand balance in the labor market continues to improve.
- **In the US**, we expect real GDP growth of 2.0% in 2024 on a Q4/Q4 basis, reflecting easing financial conditions amid a start to Fed rate cuts and strong real disposable income growth. We continue to see a below-consensus 15% probability of entering a recession over the next 12 months. We expect core PCE inflation to decline to 2.2% by Dec 2024, reflecting disinflation from the advanced stage of rebalancing in the labor, housing rental, and car markets. We expect the unemployment rate to decline to 3.6% in 2024 and remain there for the next few years.
- **We believe the Fed's** hiking cycle is complete and that the Fed will remain on hold at the current Fed funds rate range of 5.25-5.5% until the first 25bp cut in March 2024, after which we expect 25bp cuts in May and June followed by quarterly cuts until the terminal rate range reaches 3.25-3.5% in September 2025, though the pace will ultimately depend on how financial conditions respond. On balance sheet policy, we expect the Fed to slow the pace of balance sheet runoff in 4Q24 and to finish runoff in 1Q25.
- **In the Euro area**, following a period of stagnation in 2H23, we expect real GDP growth to increase to 0.7% yoy in 2024, reflecting a pickup in real disposable income, a start to ECB rate cuts, and an improvement in manufacturing activity, which should more than offset the building headwind from fiscal policy. We expect core inflation to slow further to 1.9% yoy by December 2024, reflecting continued declines in services inflation and normalizing wage growth.
- **We believe the ECB's** hiking cycle is complete and that the ECB will remain on hold at 4.00% until the first rate cut in April 2024, after which we expect rate cuts to proceed at a 25bp/meeting pace until the policy rate reaches 2.25% by early 2025, although we see some risk that the ECB begins cutting in March and accelerates the pace to 50bp in April.
- **In China**, we expect real GDP growth to slow to 4.8% yoy in 2024 as China continues to face several growth headwinds, including a prolonged property downturn, though we expect a material offset from a step up in policy easing and pick up in investment growth. We expect policy easing to be front-loaded and growth momentum to be stronger in the first half of 2024. Over the longer term, we maintain our cautious view on China's growth outlook given deteriorating demographics, property and local government deleveraging, and global supply chain de-risking.
- **WATCH WAR IN THE MIDDLE EAST AND DETERIORATING DM PUBLIC DEBT PROFILE.** Continued maritime trade disruptions from the war in the Middle East, especially if it escalates to interrupt trade through the Strait of Hormuz, could lead to significant increases in energy prices that would likely lower global growth, on net. The deteriorating public debt profile in DMs is a growing concern, though we think markets will remain patient unless next year's US elections bring the possibility of fresh unfunded fiscal expansion.

Goldman Sachs Global Investment Research.

Growth



Source: Haver Analytics and Goldman Sachs Global Investment Research. Note: GS CAI is a measure of current growth. For more information on the methodology of the CAI please see "Improving Our Within-Month CAI Forecasts," Global Economics Comment, Mar. 06, 2023.

Forecasts

Economics	GDP growth (%)				Interest rates 10Yr (%)		Markets				Equities									
	2023	2024		2024	Last	E2023	E2024	FX	Last	3m	12m	S&P 500	E2023	E2024		12m	YTD	E2023 PIE		
	GS (Q4/Q4) (CY)	GS (CY)	Cons. (CY)	Cons. (CY)									GS	Cons.	GS	Cons.				
Global	2.8	2.7	2.9	2.6	2.6	US	3.91	3.90	4.00	EUR/USD	1.09	1.08	1.12	Price	4,800	-	S&P500	8	22.9	21.7x
US	2.8	2.5	2.4	2.3	1.2	Germany	2.02	2.15	2.00	GBP/USD	1.27	1.28	1.35	EPS	\$224	\$237	MXXAPJ	7	2.0	14.6x
China	5.6	5.3	5.2	4.8	4.5	Japan	0.71	0.70	0.90	USD/JPY	142	145	140	Growth	1%	0%	Topix	14	23.3	16.2x
Euro area	0.2	0.5	0.5	0.7	0.6	UK	3.63	3.80	3.75	\$/CNY	7.10	7.15	7.05	STOXX 600	5	12.1	13.3x			
Policy rates (%)	2023		2024		Commodities		Credit (bp)		2023		2024		Wedge Tracker 2023 (%)							
	GS	Mkt.	GS	Mkt.	Crude Oil, Brent (\$/bbl)	Nat Gas (\$/mmBtu)	Copper (\$/mt)	Gold (\$/troy oz)	Unemp. Rate (%)	CPI (% yoy)	Unemp. Rate (%)	CPI (% yoy)	Q1	Q2	Q3	Q4				
US	5.38	4.50	4.13	3.68	77	80	80	80	USD	IG	100	101	98	US	3.6	5.1	5.0	4.4	4.4	
Euro area	4.00	3.00	2.50	2.25	2.49	2.55	3.25	HY	336	363	350	Euro area	1.9	6.7	-	-	-	-	-	-
China	1.70	1.64	1.60	1.75	8,455	8,400	10,000	EUR	IG	150	157	150	China	0.3	-	-	-	-	-	-
Japan	-0.10	0.18	0.00	0.35	2,032	2,065	2,175	HY	395	417	405									

Source: Bloomberg, Goldman Sachs Global Investment Research. For important disclosures, see the Disclosure Appendix or go to www.gs.com/research/hedge.html. Market pricing as of December 15, 2023

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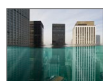
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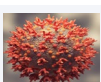
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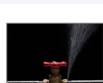
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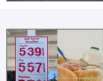
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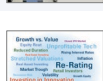
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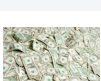
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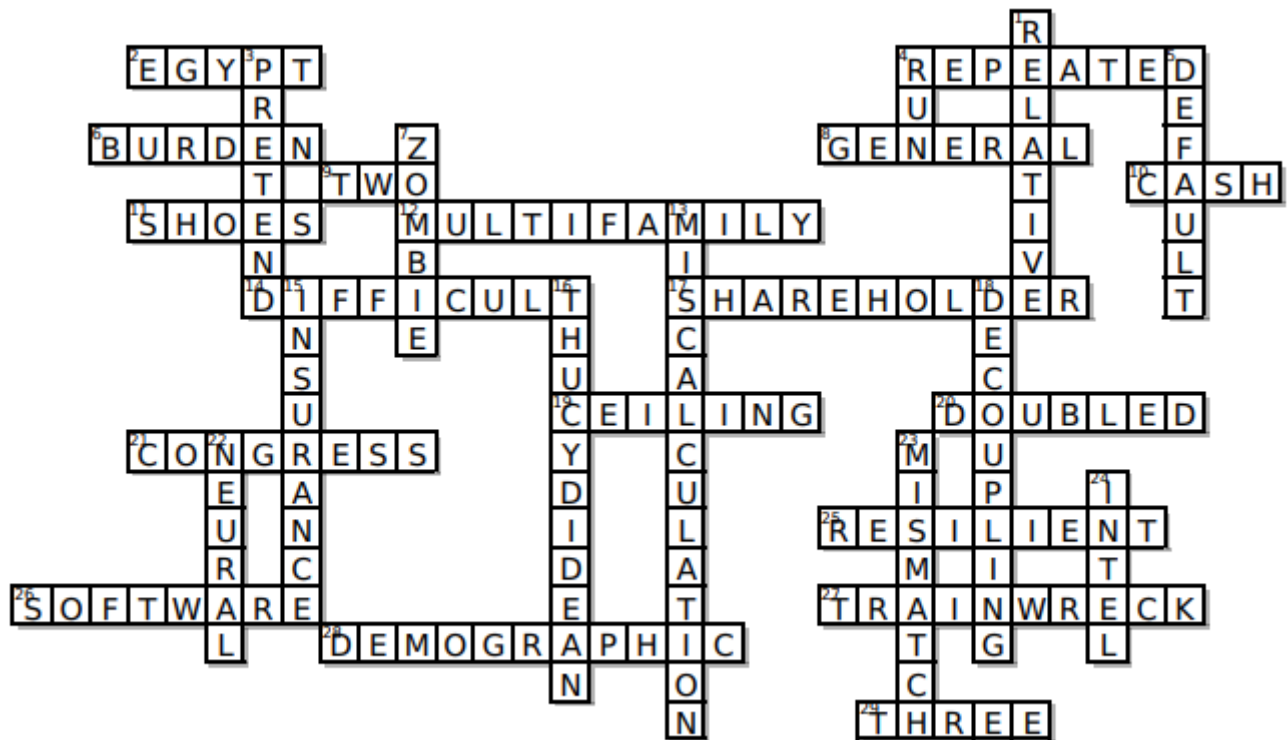


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Puzzle solutions

Crossword from pg. 2 of this report:



Glossary of GS proprietary indices

Current Activity Indicator (CAI)

GS CAIs measure the growth signal in a broad range of weekly and monthly indicators, offering an alternative to Gross Domestic Product (GDP). GDP is an imperfect guide to current activity: In most countries, it is only available quarterly and is released with a substantial delay, and its initial estimates are often heavily revised. GDP also ignores important measures of real activity, such as employment and the purchasing managers' indexes (PMIs). All of these problems reduce the effectiveness of GDP for investment and policy decisions. Our CAIs aim to address GDP's shortcomings and provide a timelier read on the pace of growth.

For more, see our CAI page and Global Economics Analyst: Trackin' All Over the World – Our New Global CAI, 25 February 2017.

Dynamic Equilibrium Exchange Rates (DEER)

The GSDEER framework establishes an equilibrium (or "fair") value of the real exchange rate based on relative productivity and terms-of-trade differentials.

For more, see our GSDEER page, Global Economics Paper No. 227: Finding Fair Value in EM FX, 26 January 2016, and Global Markets Analyst: A Look at Valuation Across G10 FX, 29 June 2017.

Financial Conditions Index (FCI)

GS FCIs gauge the "looseness" or "tightness" of financial conditions across the world's major economies, incorporating variables that directly affect spending on domestically produced goods and services. FCIs can provide valuable information about the economic growth outlook and the direct and indirect effects of monetary policy on real economic activity.

FCIs for the G10 economies are calculated as a weighted average of a policy rate, a long-term risk-free bond yield, a corporate credit spread, an equity price variable, and a trade-weighted exchange rate; the Euro area FCI also includes a sovereign credit spread. The weights mirror the effects of the financial variables on real GDP growth in our models over a one-year horizon. FCIs for emerging markets are calculated as a weighted average of a short-term interest rate, a long-term swap rate, a CDS spread, an equity price variable, a trade-weighted exchange rate, and—in economies with large foreign-currency-denominated debt stocks—a debt-weighted exchange rate index.

For more, see our FCI page, Global Economics Analyst: Our New G10 Financial Conditions Indices, 20 April 2017, and Global Economics Analyst: Tracking EM Financial Conditions – Our New FCIs, 6 October 2017.

Goldman Sachs Analyst Index (GSAI)

The US GSAI is based on a monthly survey of GS equity analysts to obtain their assessments of business conditions in the industries they follow. The results provide timely "bottom-up" information about US economic activity to supplement and cross-check our analysis of "top-down" data. Based on analysts' responses, we create a diffusion index for economic activity comparable to the ISM's indexes for activity in the manufacturing and nonmanufacturing sectors.

Macro-Data Assessment Platform (MAP)

GS MAP scores facilitate rapid interpretation of new data releases for economic indicators worldwide. MAP summarizes the importance of a specific data release (i.e., its historical correlation with GDP) and the degree of surprise relative to the consensus forecast. The sign on the degree of surprise characterizes underperformance with a negative number and outperformance with a positive number. Each of these two components is ranked on a scale from 0 to 5, with the MAP score being the product of the two, i.e., from -25 to +25. For example, a MAP score of +20 (5;+4) would indicate that the data has a very high correlation to GDP (5) and that it came out well above consensus expectations (+4), for a total MAP value of +20.

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Reg AC

We, Allison Nathan, Jenny Grimberg, and Ashley Rhodes, hereby certify that all of the views expressed in this report accurately reflect our personal views, which have not been influenced by considerations of the firm's business or client relationships.

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