



ZRE: Coronavirus PIT ECL Impact Analysis – Indirect Effects on a US/UK Hypothetical Credit Portfolio As of March 23, 2020

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ECL Impact Analysis: Trial Portfolio Using ZRE With Updated EDFs to Assess Indirect PIT Coronavirus Loss Effects

- US/UK hypothetical corporate/commercial credit portfolio of about \$1.7 bil in limits was developed – detail below
- Trial portfolio has an LGD x EAD-weighted TTC PD of 0.89% and EAD-weighted, TTC LGD of 32%, the one-year TTC loss is **\$3.3 million**
- ZRE runs in two modes; simulation of our industry/region credit cycles (Uses a Mean Reversion/Momentum Model) utilizing ‘pure’ PIT credit measures - which produces an ‘unconditional’ estimate of ECLs or ZRE runs in scenario mode (‘conditional’) where 3-4 scenarios on various macro and other factors can be provided
- This analysis presented here is from the **‘unconditional’ simulation approach** which is fully automated and can therefore be run with **changes in daily one-year EDFs**
- FYI, the automated E2E simulation approach for ECLs can run a portfolio of 400-500k facilities E2E in about 3-4 hours
- **ECLs for this trial portfolio assessed using Ind/Reg cycle-adjusted PIT measures:**
 - **Pre-Substantial Coronavirus: December 31, 2019**
 - **Post-3.5% USA Market Sell-Off: Monday, March 23, 2020**

Overview Cont: ECL Impact Analysis Using ZRE Dynamically

- Estimates from a trial portfolio of US and UK corporate and commercial facilities with a wide range of PDs, EADs, and industry segments
- One-year and lifetime ECLs as of 23 Mar 2020 up relative to values as of 31 Dec 2019 by about 2.4x and about 2.0x, respectively
- ECLs still not as extreme as CCAR 2020 stress values; stock prices as of Mar 23 down about 35% from Dec 31 whereas the severely adverse scenario assumes a fall of over 60%; corporate spreads, while up sharply in Mar, still well below 2008-09 highs
- Stress results based on the CCAR 2020 Severely Adverse scenario indicates that ECLs could rise by an additional 3x for an over 7x rise since Dec 2019

| | ZRE Inputs | | | | | | | | | ZRE Outputs CU (000s) | | ZRE Outputs CU (000s) | | Ratio 23 Mar | | Ratio Stress/Dec |
|-------|------------------|---------|---------|---------|---------|---------------------------|------------------|--------------------|---------------------------|-----------------------|-----------------|-----------------------|-----------------|------------------|-----------------|---------------------|
| | Basel Parameters | | | | | Other Facility Attributes | | | | 31-Dec-19 | | 23-Mar-20 | | 2020/31 Dec 2019 | | |
| FAC # | TTC PD | TTC LGD | TTC EAD | TTC CCF | TTC FCF | Maturity in Years | (Millions CU) | One-Year TTC EL | One-Year Static PIT EL | One-Year ECL | Lifetime ECL | One-Year ECL | Lifetime ECL | One-Year ECL | Lifetime ECL | One Year ECL |
| All | 0.89% | 32% | 1,178 | 66% | 97% | 2.52 | 1725 | 3,309 | 1,858 | 1,742 | 4,515 | 4,216 | 9,623 | 2.42 | 2.13 | 7.36 |

Source: ZRE application, Moody's Credit Edge EDFs – 'CU' stands for 'Currency Units'

Trial Portfolio ECL Details – Dec 31, 2019 & March 23th, 2020 (1/2)

Tables Provide Details on TTC PD/LGD/EAD (CCF), Exposures & The Industry/Regions Using Our Credit Cycle Indices for this Hypothetical ‘Trial’ Portfolio of about \$1.7 bil in Limits

| Classification Information | | | ZRE Inputs | | | | | | | | | | | Calculations CU (000s) | | ZRE Outputs CU (000s) | | ZRE Outputs CU (000s) | | Ratio 23 Mar 2020/31 Dec 2019 | |
|----------------------------|-----------|------------|------------------|---------|---------|---------|---------|--------------------------------------|---------------|----------------|------------------|-------------------------------------|-------|------------------------|------------------------|-----------------------|--------------|-----------------------|--------------|-------------------------------|--------------|
| | | | Basel Parameters | | | | | Other Facility & Borrower Attributes | | | | | | 31-Dec-19 | | 31-Dec-19 | | 23-Mar-20 | | | |
| FAC # | Portfolio | Product | TTC PD | TTC LGD | TTC EAD | TTC CCF | TTC CCF | Maturity in Years | (Millions CU) | Expected Usage | Primary Region | Primary Industry | EIR | One-Year TTC EL | One-Year Static PIT EL | One-Year ECL | Lifetime ECL | One-Year ECL | Lifetime ECL | One-Year ECL | Lifetime ECL |
| 1 | SME | Term | 0.72% | 25% | 5 | 100% | 100% | 5.97 | 5 | 100% | North America | Media | 3.24% | 9 | 5 | 5 | 58 | 16 | 128 | 3.34 | 2.20 |
| 2 | LC | Backstop | 0.12% | 35% | 49 | 70% | 100% | 1.05 | 70 | 0% | North America | Business and Consumer Services | 2.54% | 20 | 10 | 11 | 12 | 41 | 44 | 3.61 | 3.56 |
| 3 | SME | Term | 0.05% | 30% | 5 | 100% | 100% | 5.54 | 5 | 100% | North America | Business and Consumer Services | 2.26% | 1 | 0 | 0 | 10 | 2 | 24 | 3.68 | 2.44 |
| 4 | SME | Term | 0.06% | 30% | 12 | 100% | 100% | 0.75 | 12 | 100% | North America | Business and Consumer Services | 3.29% | 2 | 1 | 1 | 1 | 3 | 3 | 3.89 | 3.89 |
| 5.1 | LC | Revolving | 0.17% | 35% | 60 | 70% | 100% | 1.91 | 70 | 50% | North America | Business and Consumer Services | 2.48% | 34 | 18 | 19 | 51 | 67 | 156 | 3.50 | 3.06 |
| 5.2 | LC | Term | 0.17% | 35% | 40 | 100% | 100% | 2.00 | 40 | 100% | North America | Business and Consumer Services | 2.48% | 23 | 12 | 13 | 37 | 44 | 110 | 3.44 | 2.98 |
| 6 | SME | Term | 0.17% | 30% | 2 | 100% | 100% | 5.25 | 2 | 100% | North America | Business and Consumer Services | 3.08% | 1 | 1 | 1 | 8 | 2 | 19 | 3.31 | 2.38 |
| 7 | SME | Term | 4.04% | 25% | 5 | 100% | 100% | 3.00 | 5 | 100% | North America | Construction | 4.47% | 49 | 37 | 37 | 119 | 94 | 246 | 2.57 | 2.07 |
| 8 | SME | Revolving | 0.51% | 25% | 7 | 20% | 100% | 0.68 | 12 | 50% | North America FI | Finance, Insurance, and Real Estate | 2.42% | 9 | 5 | 3 | 3 | 8 | 8 | 2.15 | 2.15 |
| 9 | LC | Backstop | 0.72% | 30% | 49 | 70% | 100% | 0.50 | 70 | 0% | North America | Transportation | 2.57% | 103 | 68 | 32 | 32 | 111 | 111 | 3.42 | 3.42 |
| 10 | SME | Term | 2.42% | 25% | 15 | 100% | 100% | 1.14 | 15 | 100% | North America FI | Finance, Insurance, and Real Estate | 4.02% | 89 | 56 | 59 | 68 | 113 | 130 | 1.93 | 1.90 |
| 11 | LC | Revolving | 0.27% | 35% | 29 | 20% | 100% | 6.52 | 80 | 20% | UK | Medical | 1.73% | 26 | 8 | 10 | 218 | 38 | 493 | 3.92 | 2.26 |
| 12 | SME | Term | 0.51% | 25% | 12 | 100% | 100% | 4.75 | 12 | 100% | North America | Hotels and Leisure | 2.80% | 15 | 9 | 9 | 84 | 38 | 237 | 4.13 | 2.82 |
| 13 | LC | Term | 0.12% | 35% | 80 | 100% | 100% | 1.75 | 80 | 100% | North America | Basic Industries | 2.73% | 33 | 19 | 20 | 47 | 71 | 148 | 3.57 | 3.13 |
| 14 | SME | Term | 22.63% | 25% | 10 | 100% | 100% | 1.18 | 10 | 100% | North America FI | Finance, Insurance, and Real Estate | 7.35% | 552 | 391 | 393 | 447 | 678 | 757 | 1.73 | 1.69 |
| 15 | SME | Term | 0.72% | 25% | 12 | 100% | 100% | 5.71 | 12 | 100% | North America | Retail and Wholesale Trade | 3.02% | 21 | 14 | 16 | 158 | 47 | 325 | 2.98 | 2.06 |
| 16 | SME | Revolving | 2.42% | 25% | 1 | 30% | 100% | 1.84 | 2 | 50% | North America | Construction | 2.47% | 8 | 6 | 6 | 11 | 16 | 28 | 2.79 | 2.48 |
| 17 | SME | Term | 11.03% | 25% | 5 | 100% | 100% | 2.08 | 5 | 100% | North America | Construction | 9.74% | 135 | 108 | 103 | 195 | 231 | 380 | 2.25 | 1.95 |
| 18 | LC | Backstop | 0.72% | 30% | 35 | 70% | 100% | 0.75 | 50 | 0% | North America | Oil and Gas | 2.58% | 74 | 60 | 42 | 42 | 155 | 155 | 3.66 | 3.66 |
| 19 | SME | Contingent | 6.61% | 25% | 1 | 20% | 25% | 0.99 | 12 | 20% | North America | Construction | 4.76% | 17 | 13 | 13 | 13 | 33 | 33 | 2.49 | 2.49 |
| 20 | LC | Backstop | 0.27% | 35% | 36 | 45% | 100% | 0.50 | 80 | 0% | North America | Consumer Products | 2.18% | 33 | 19 | 9 | 9 | 31 | 31 | 3.62 | 3.62 |
| 21.1 | LC | Revolving | 0.72% | 30% | 22 | 20% | 100% | 0.75 | 80 | 10% | North America | Retail and Wholesale Trade | 2.58% | 47 | 32 | 25 | 25 | 79 | 79 | 3.19 | 3.19 |
| 21.2 | LC | Term | 0.72% | 30% | 80 | 100% | 100% | 0.75 | 80 | 100% | North America | Retail and Wholesale Trade | 2.58% | 171 | 116 | 88 | 88 | 261 | 261 | 2.95 | 2.95 |

Source: ZRE application, Moody's Credit Edge EDFs – 'CU' stands for 'Currency Units'

Trial Portfolio ECL Details – Dec 31, 2019 & March 23th, 2020 (2/2)

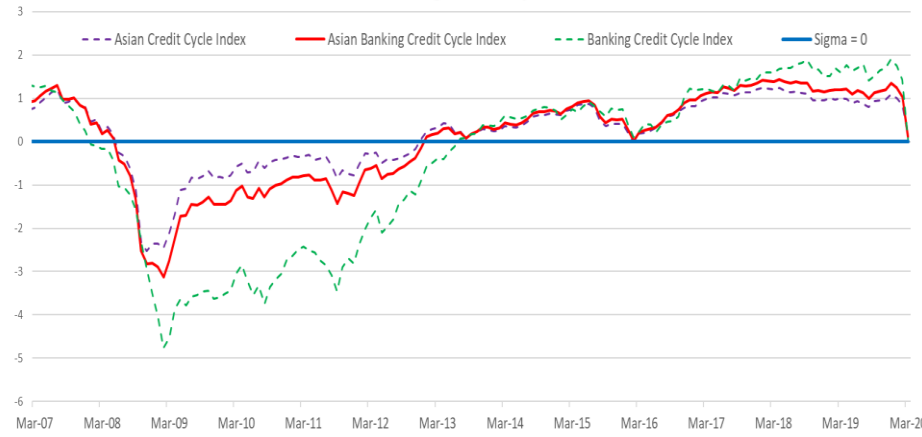
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| | | | Basel Parameters | | | | | Other Facility & Borrower Attributes | | | | | | 31-Dec-19 | | 31-Dec-19 | | 23-Mar-20 | | 2020/31 Dec 2019 | |
| FAC # | Portfolio | Product | TTC PD | TTC LGD | TTC EAD | TTC CCF | TTC FCF | Maturity in Years | (Millions CU) | Expected Usage | Primary Region | Primary Industry | EIR | One-Year TTC EL | One-Year Static PIT EL | One-Year ECL | Lifetime ECL | One-Year ECL | Lifetime ECL | One-Year ECL | Lifetime ECL |
| 22 LC | Revolving | | 0.51% | 30% | 45 | 45% | 100% | 0.92 | 50 | 80% | North America FI | Banking | 2.43% | 67 | 40 | 38 | 38 | 77 | 77 | 2.02 | 2.02 |
| 23 SME | Term | | 0.17% | 30% | 10 | 100% | 100% | 3.50 | 10 | 100% | North America | Medical | 2.63% | 5 | 3 | 3 | 21 | 12 | 61 | 3.76 | 2.94 |
| 24 SME | Term | | 4.04% | 25% | 10 | 100% | 100% | 5.81 | 10 | 100% | North America | Basic Industries | 4.10% | 99 | 70 | 68 | 425 | 181 | 766 | 2.67 | 1.80 |
| 25 SME | Revolving | | 0.51% | 25% | 7 | 30% | 100% | 4.75 | 10 | 50% | North America | Basic Industries | 2.84% | 8 | 5 | 5 | 46 | 17 | 115 | 3.41 | 2.48 |
| 26 SME | Term | | 0.17% | 30% | 10 | 100% | 100% | 3.34 | 10 | 100% | North America | Hotels and Leisure | 2.35% | 5 | 3 | 3 | 19 | 13 | 61 | 4.41 | 3.24 |
| 27 LC | Backstop | | 6.61% | 30% | 49 | 70% | 100% | 1.50 | 70 | 0% | UK FI | Banking | 6.11% | 949 | 352 | 357 | 556 | 751 | 1,112 | 2.10 | 2.00 |
| 28 LC | Term | | 0.04% | 35% | 50 | 100% | 100% | 0.25 | 50 | 100% | UK | Transportation | 1.24% | 8 | 2 | 0 | 0 | 2 | 2 | 7.55 | 7.55 |
| 29 SME | Term | | 6.61% | 25% | 10 | 100% | 100% | 6.32 | 10 | 100% | North America | Medical | 3.99% | 161 | 124 | 122 | 640 | 309 | 1,105 | 2.53 | 1.73 |
| 30 LC | Revolving | | 0.51% | 30% | 34 | 20% | 100% | 3.89 | 50 | 60% | UK | Business and Consumer Services | 2.12% | 51 | 16 | 19 | 156 | 64 | 366 | 3.40 | 2.35 |
| 31 SME | Term | | 0.06% | 30% | 5 | 100% | 100% | 1.03 | 5 | 100% | North America | Machinery and Equipment | 2.31% | 1 | 1 | 1 | 1 | 2 | 2 | 3.79 | 3.76 |
| 32.1 LC | Revolving | | 0.17% | 35% | 14 | 45% | 100% | 4.25 | 30 | 0% | North America | Machinery and Equipment | 2.56% | 8 | 5 | 5 | 47 | 18 | 125 | 3.60 | 2.63 |
| 32.2 LC | Term | | 0.17% | 35% | 30 | 100% | 100% | 4.25 | 30 | 100% | North America | Machinery and Equipment | 2.56% | 17 | 11 | 12 | 106 | 39 | 268 | 3.36 | 2.53 |
| 33.1 LC | Revolving | | 0.27% | 35% | 27 | 35% | 100% | 1.50 | 50 | 30% | North America | Consumer Products | 4.30% | 25 | 15 | 15 | 27 | 50 | 81 | 3.26 | 3.04 |
| 33.2 LC | Term | | 0.27% | 35% | 70 | 100% | 100% | 1.36 | 70 | 100% | North America | Consumer Products | 4.30% | 65 | 38 | 40 | 61 | 125 | 181 | 3.10 | 2.95 |
| 34 LC | Revolving | | 0.12% | 35% | 42 | 20% | 100% | 0.87 | 70 | 50% | North America | Media | 2.18% | 17 | 8 | 8 | 8 | 28 | 28 | 3.76 | 3.76 |
| 35 SME | Contingent | | 0.12% | 30% | 1 | 20% | 25% | 0.85 | 5 | 80% | North America | Retail and Wholesale Trade | 2.18% | 0 | 0 | 0 | 0 | 1 | 1 | 3.51 | 3.51 |
| 36 LC | Revolving | | 2.42% | 30% | 24 | 30% | 100% | 2.84 | 80 | 0% | UK FI | Banking | 2.20% | 169 | 53 | 55 | 223 | 131 | 425 | 2.37 | 1.91 |
| 37 SME | Term | | 0.05% | 30% | 10 | 100% | 100% | 0.65 | 10 | 100% | North America | Business and Consumer Services | 2.49% | 2 | 1 | 0 | 0 | 2 | 2 | 4.05 | 4.05 |
| 38 SME | Revolving | | 4.04% | 25% | 9 | 70% | 100% | 0.50 | 12 | 20% | North America FI | Finance, Insurance, and Real Estate | 4.19% | 89 | 56 | 28 | 28 | 58 | 58 | 2.07 | 2.07 |
| 39 SME | Revolving | | 2.42% | 25% | 6 | 20% | 100% | 0.87 | 10 | 50% | North America | Oil and Gas | 4.60% | 35 | 30 | 25 | 25 | 79 | 79 | 3.12 | 3.12 |
| 40 LC | Revolving | | 0.04% | 35% | 48 | 20% | 100% | 1.50 | 70 | 60% | North America FI | Banking | 2.03% | 7 | 4 | 4 | 9 | 9 | 17 | 2.15 | 2.00 |
| 41 SME | Term | | 0.17% | 30% | 2 | 100% | 100% | 1.01 | 2 | 100% | North America | Mining | 3.38% | 1 | 1 | 1 | 1 | 2 | 2 | 3.31 | 3.30 |
| 42 SME | Revolving | | 0.27% | 30% | 3 | 30% | 100% | 1.62 | 10 | 0% | North America | Construction | 4.19% | 2 | 1 | 2 | 3 | 6 | 10 | 3.64 | 3.26 |
| 43 SME | Revolving | | 0.05% | 30% | 3 | 20% | 100% | 4.00 | 12 | 10% | North America | Retail and Wholesale Trade | 3.08% | 1 | 0 | 0 | 4 | 1 | 10 | 4.07 | 2.72 |
| 44 LC | Revolving | | 0.06% | 35% | 51 | 45% | 100% | 5.90 | 70 | 50% | UK | Media | 1.53% | 11 | 2 | 3 | 112 | 13 | 261 | 4.21 | 2.33 |
| 45 LC | Revolving | | 0.27% | 35% | 8 | 20% | 100% | 0.66 | 30 | 10% | North America | Media | 2.39% | 8 | 4 | 2 | 2 | 9 | 9 | 3.77 | 3.77 |
| 46 LC | Revolving | | 0.27% | 35% | 29 | 20% | 100% | 6.52 | 80 | 20% | UK | Medical | 1.73% | 26 | 8 | 10 | 218 | 38 | 493 | 3.92 | 2.26 |
| All | | | 0.89% | 32% | 1,178 | 66% | 97% | 2.52 | 1725 | | | | | 3,309 | 1,858 | 1,742 | 4,515 | 4,216 | 9,623 | 2.42 | 2.13 |

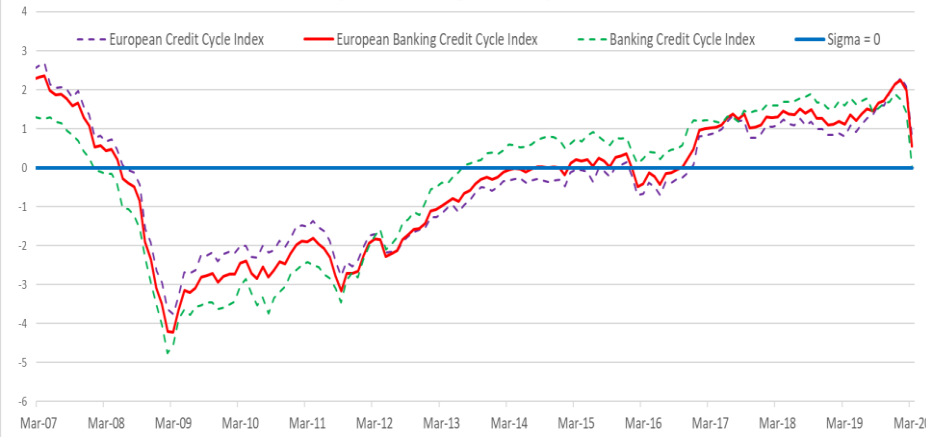
Source: ZRE application, Moody's Credit Edge EDFs – 'CU' stands for 'Currency Units'

Banking/Regional Credit Cycles as of March 23, 2020

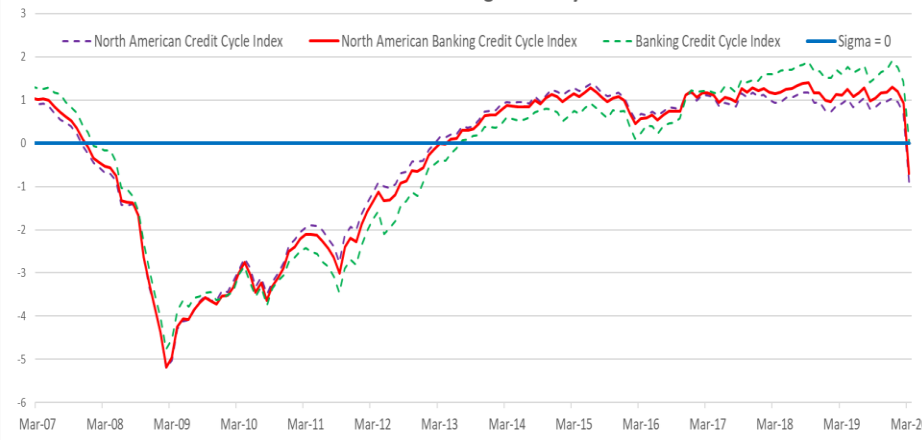
Asian Banking Credit Cycle Index



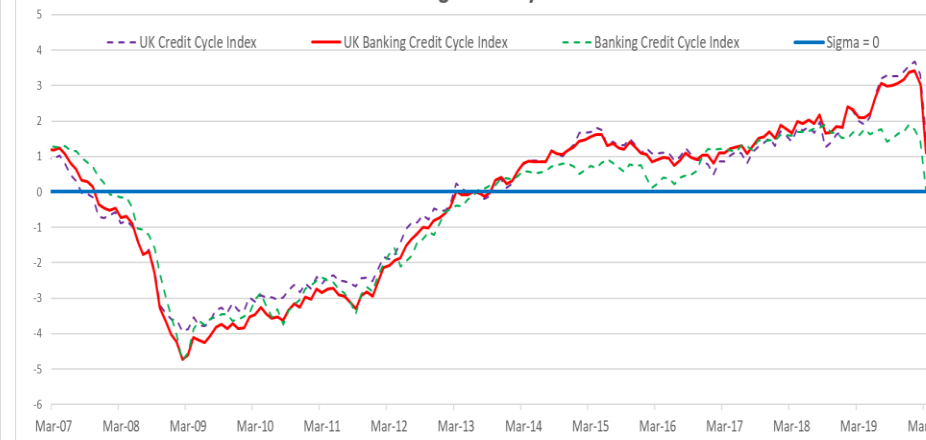
European Banking Credit Cycle Index



North American Banking Credit Cycle Index



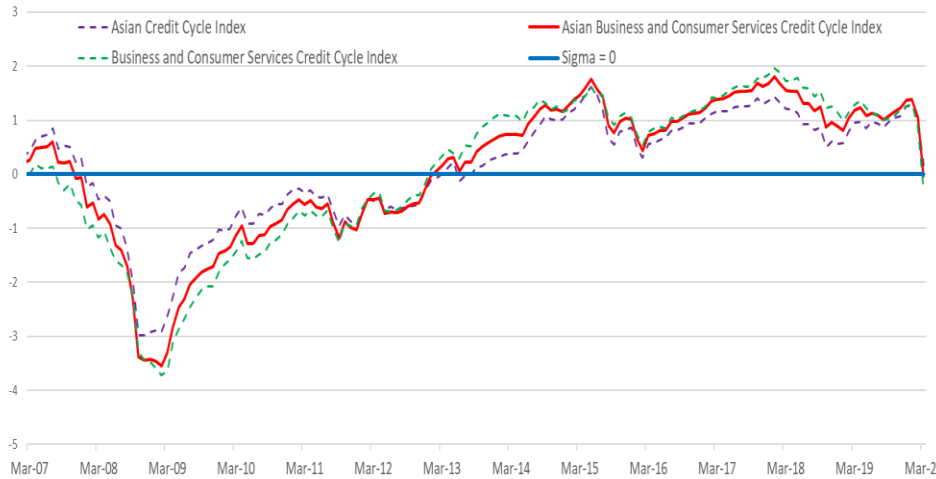
UK Banking Credit Cycle Index



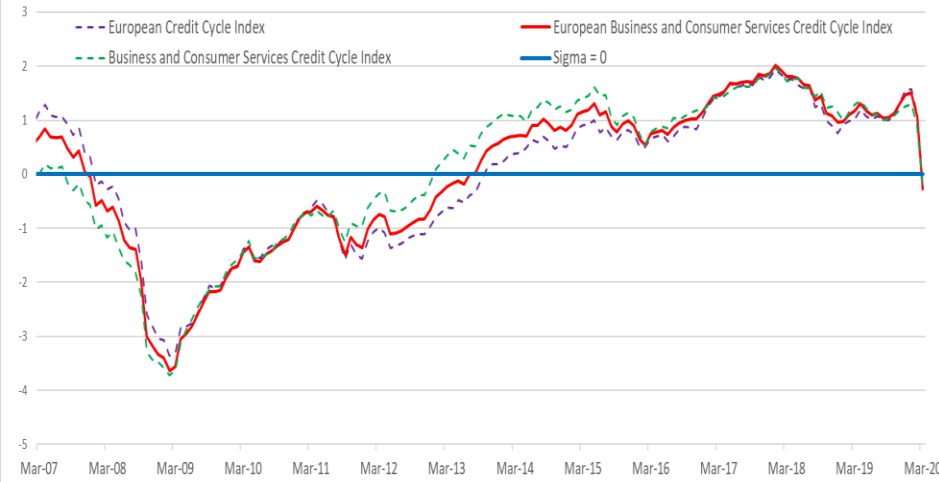
Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk

Business & Consumer Services/Regional Credit Cycles as of March 23, 2020

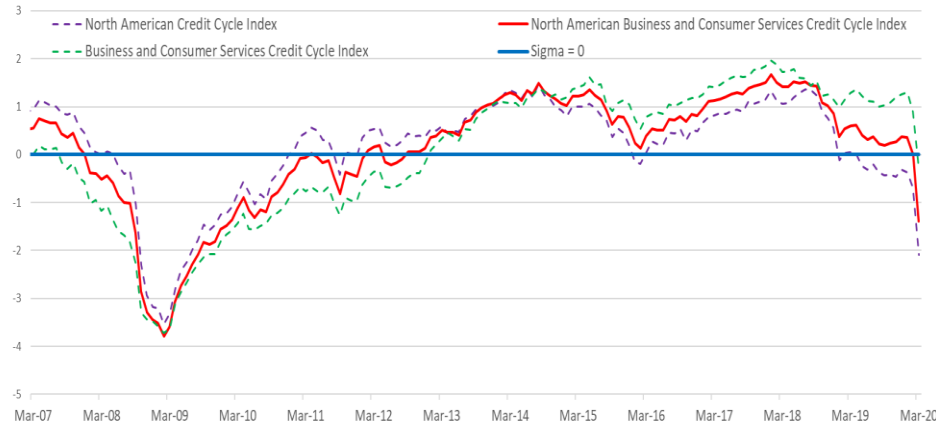
Asian Business and Consumer Services Credit Cycle Index



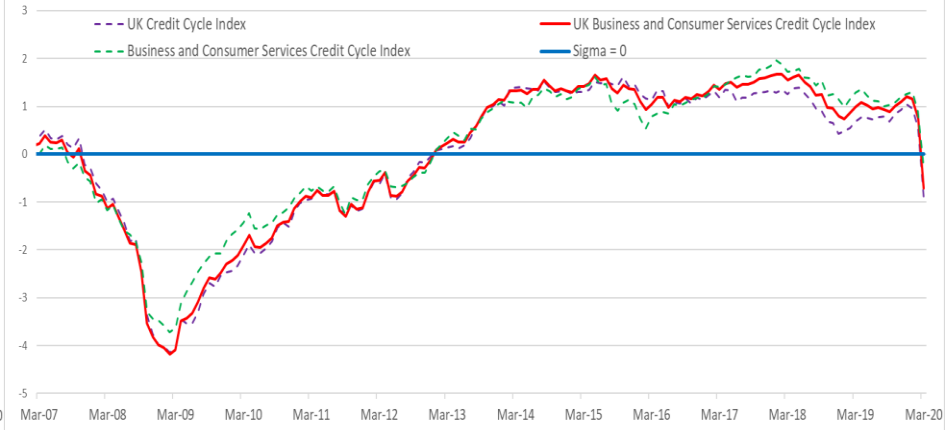
European Business and Consumer Services Credit Cycle Index



North American Business and Consumer Services Credit Cycle Index



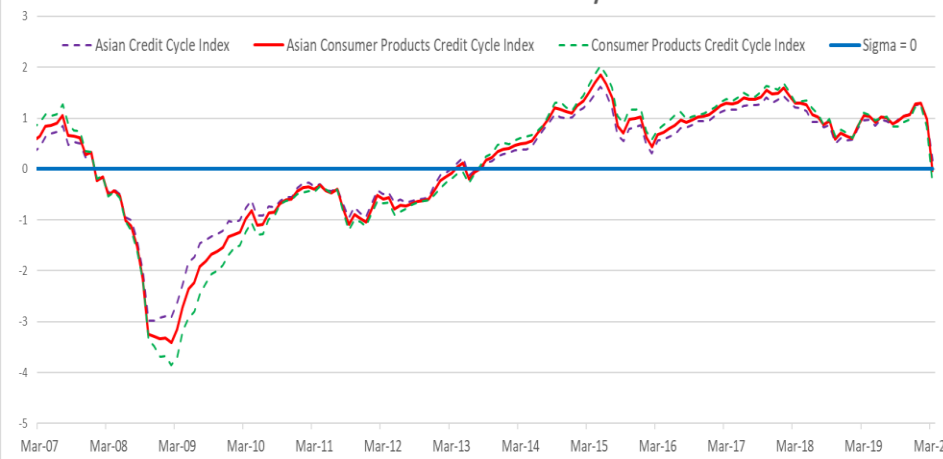
UK Business and Consumer Services Credit Cycle Index



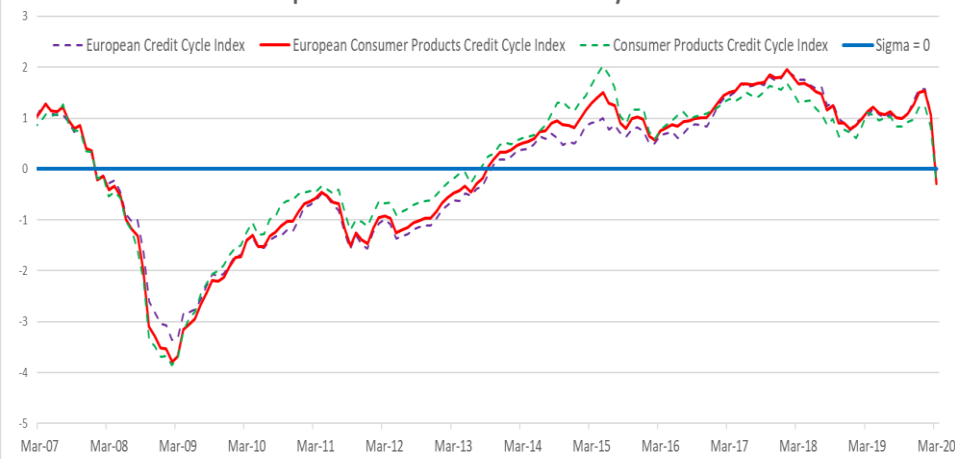
Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk

Consumer Products/Regional Credit Cycles as of March 23, 2020

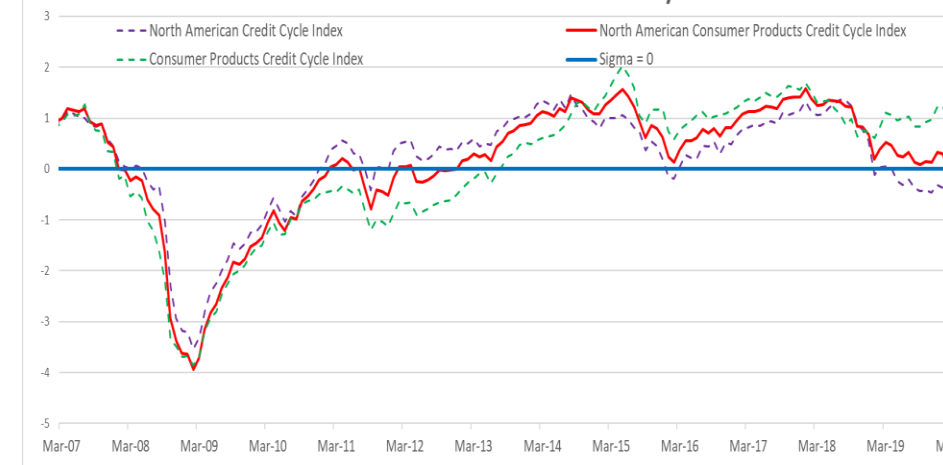
Asian Consumer Products Credit Cycle Index



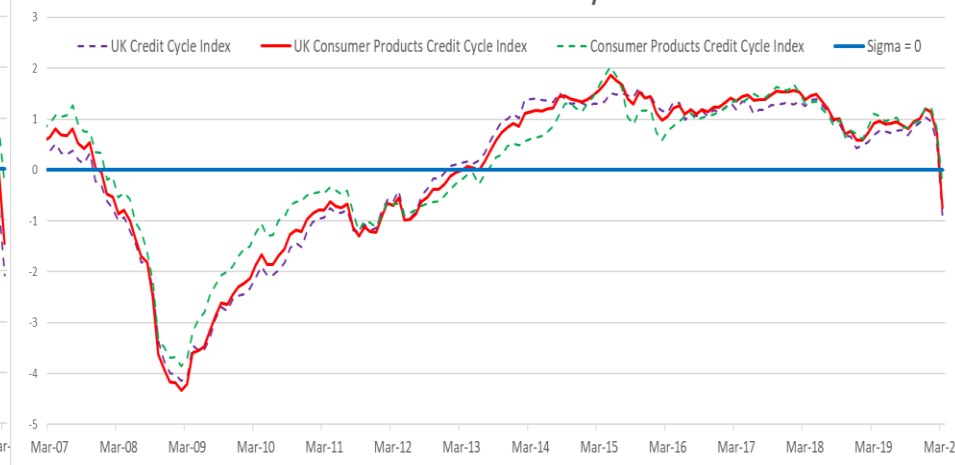
European Consumer Products Credit Cycle Index



North American Consumer Products Credit Cycle Index



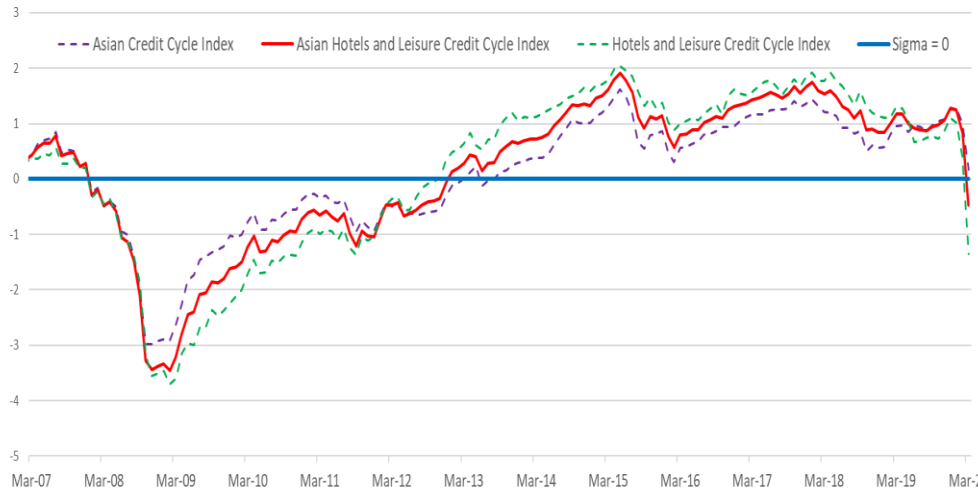
UK Consumer Products Credit Cycle Index



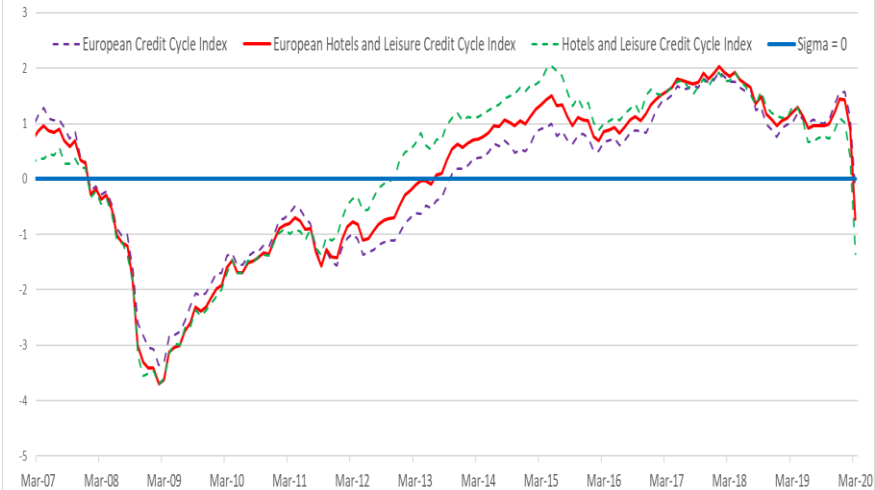
Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk

Hotels & Leisure/Regional Credit Cycles as of March 23, 2020

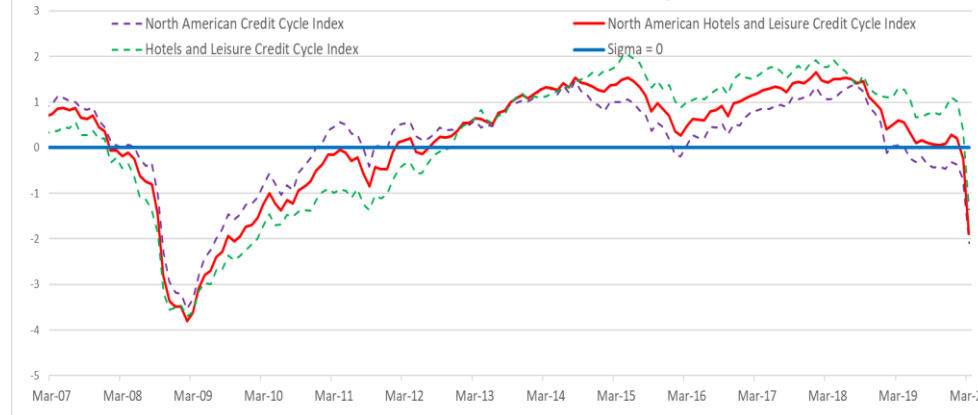
Asian Hotels and Leisure Credit Cycle Index



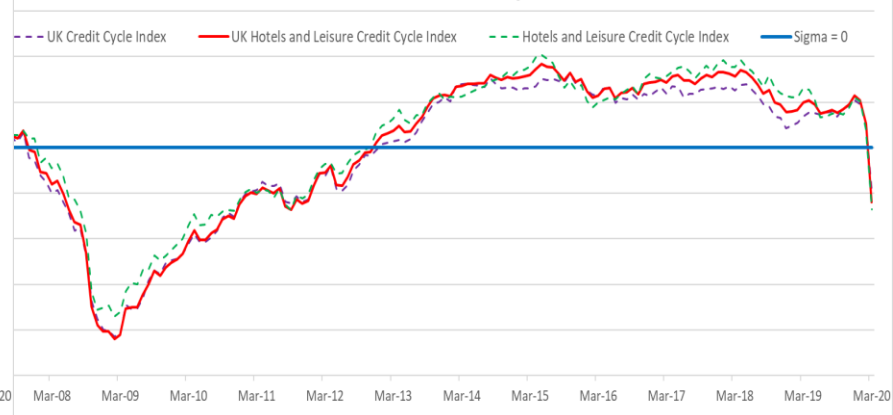
European Hotels and Leisure Credit Cycle Index



North American Hotels and Leisure Credit Cycle Index



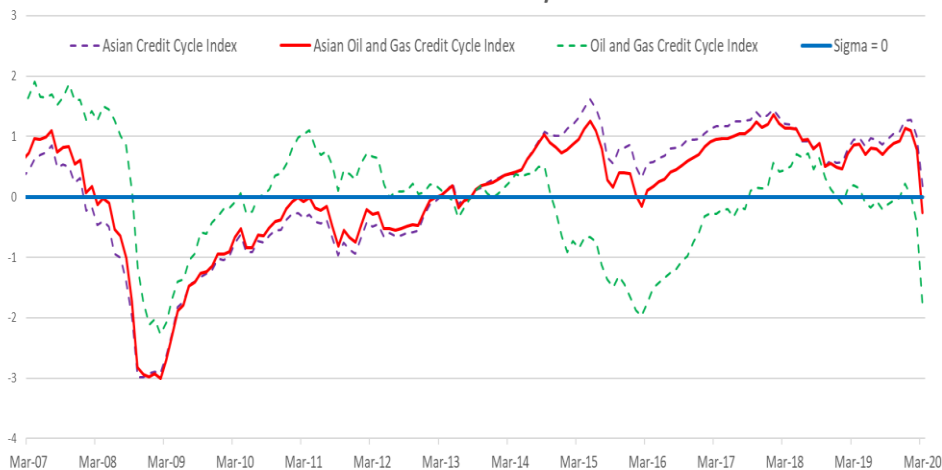
UK Hotels and Leisure Credit Cycle Index



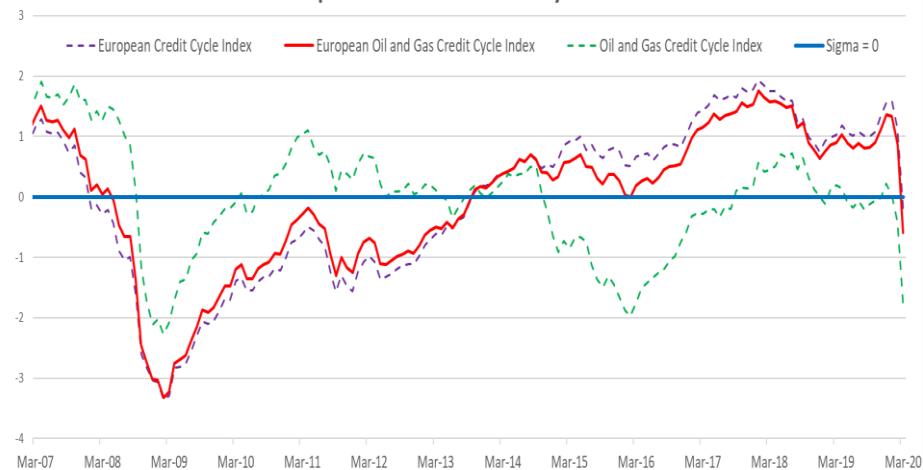
Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk

Oil & Gas/Regional Credit Cycles as of March 23, 2020

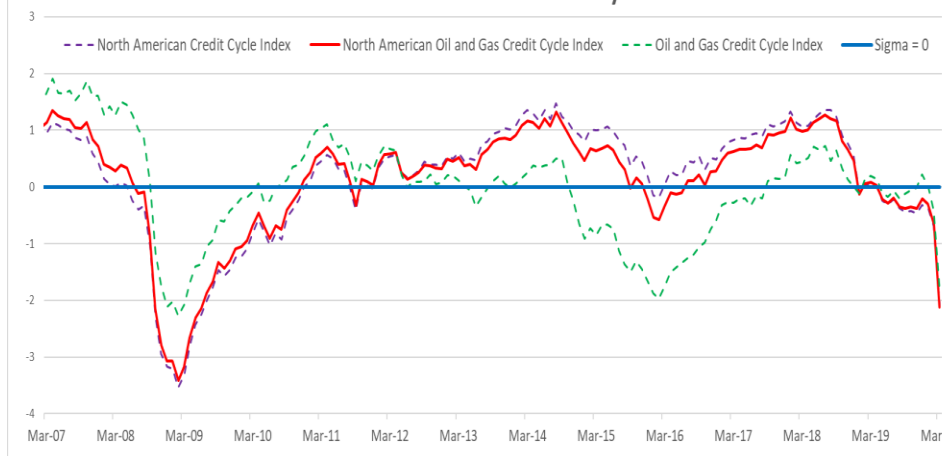
Asian Oil and Gas Credit Cycle Index



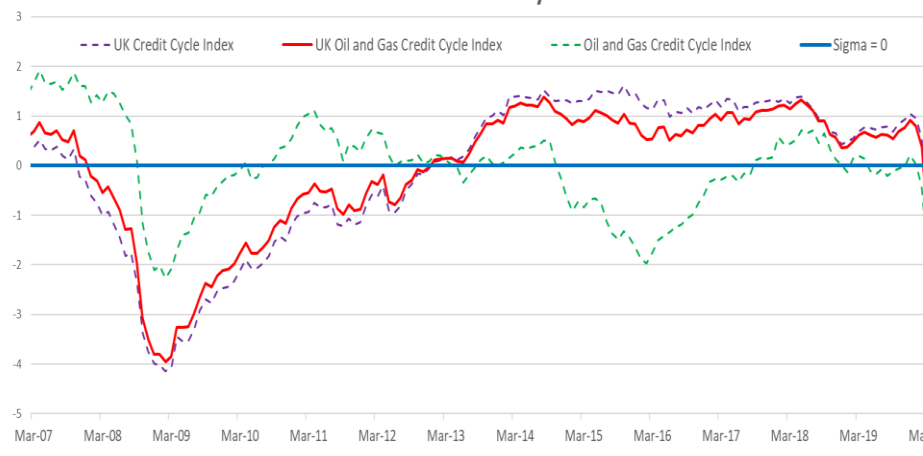
European Oil and Gas Credit Cycle Index



North American Oil and Gas Credit Cycle Index

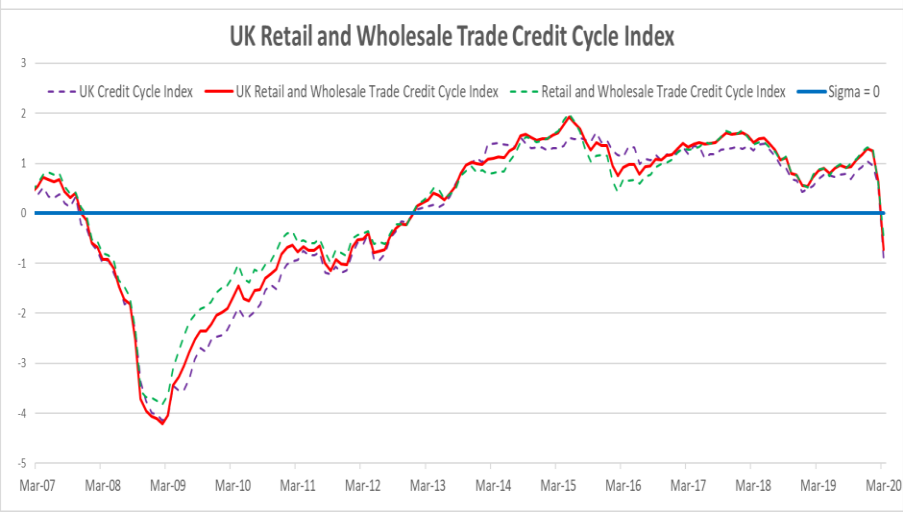
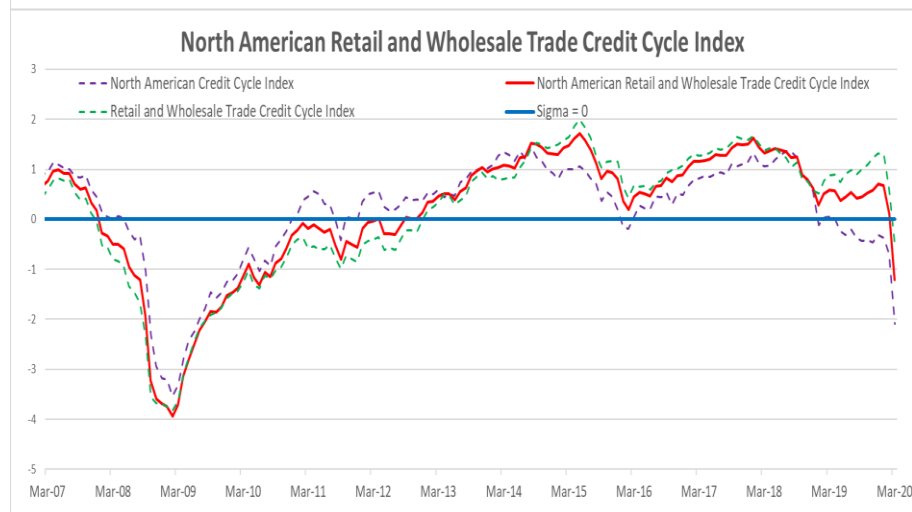
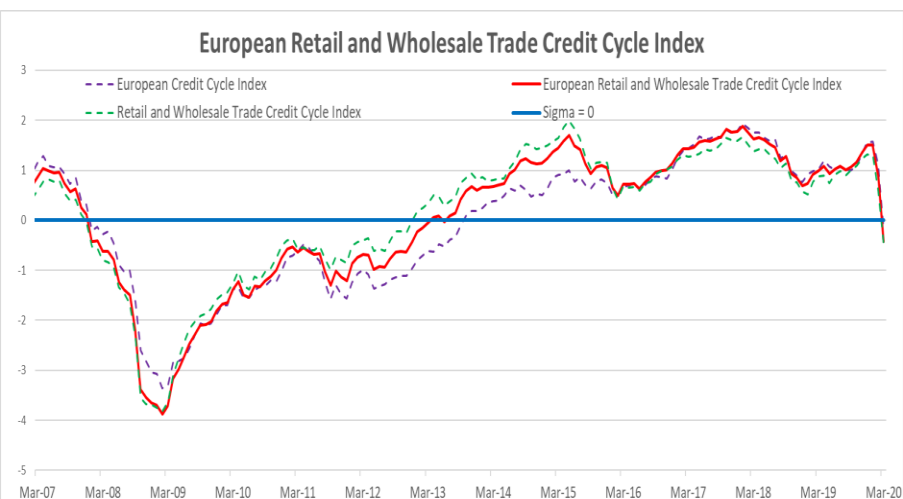
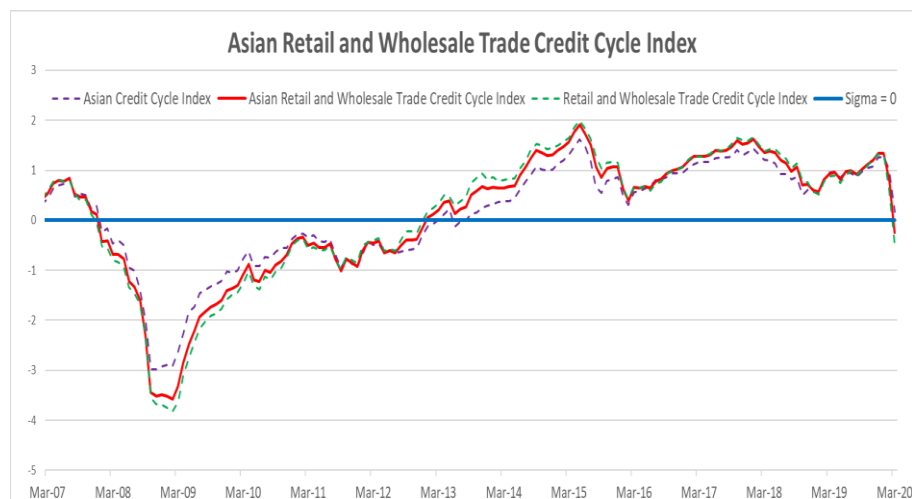


UK Oil and Gas Credit Cycle Index



Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk

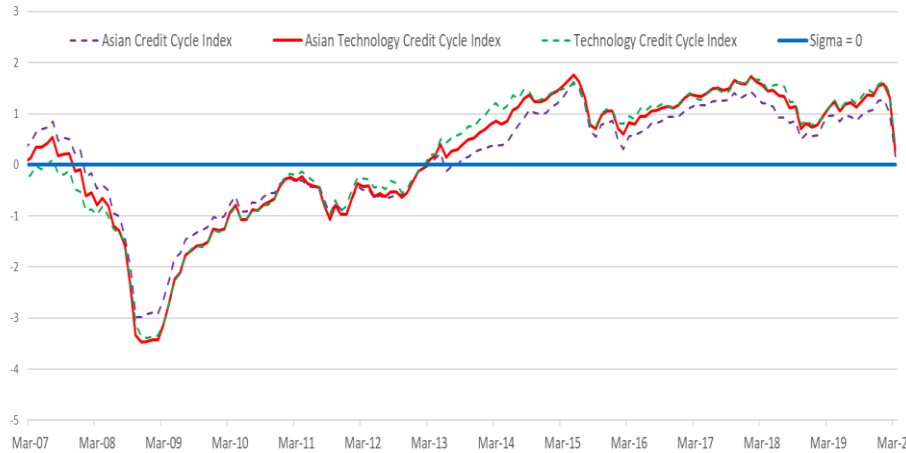
Retail/Wholesale Trade/Regional Credit Cycles as of March 23, 2020



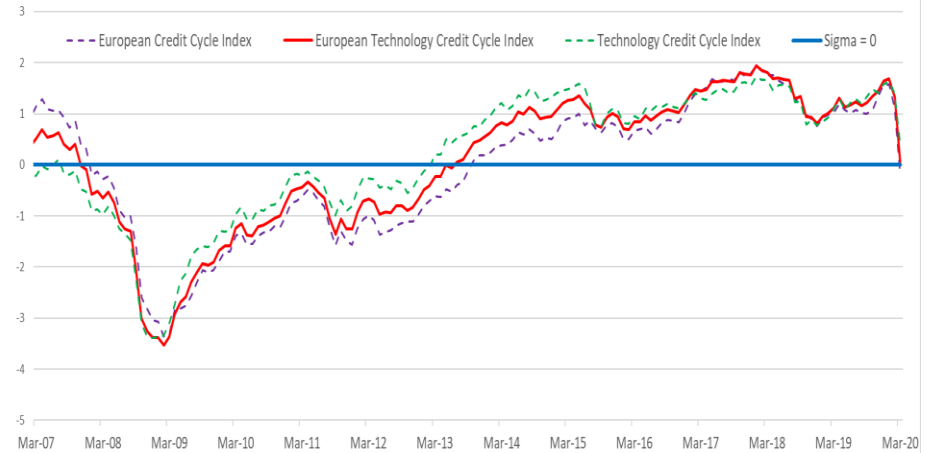
Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk

Technology/Regional Credit Cycles as of March 23, 2020

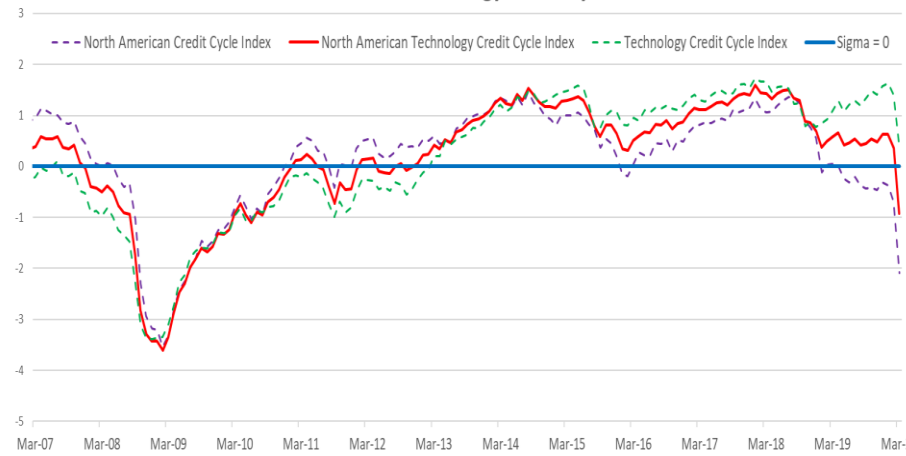
Asian Technology Credit Cycle Index



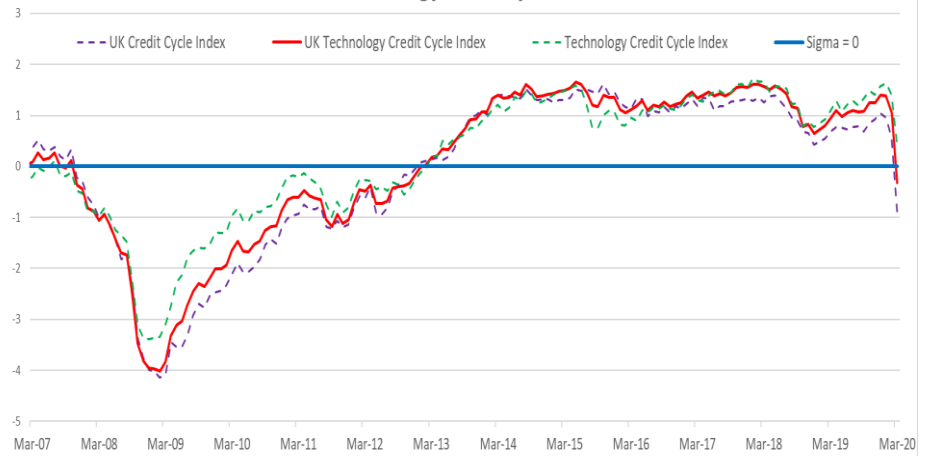
European Technology Credit Cycle Index



North American Technology Credit Cycle Index



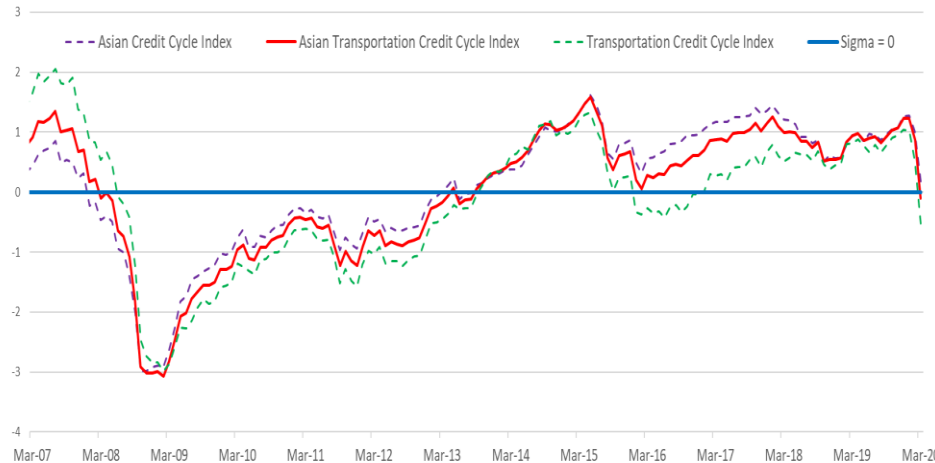
UK Technology Credit Cycle Index



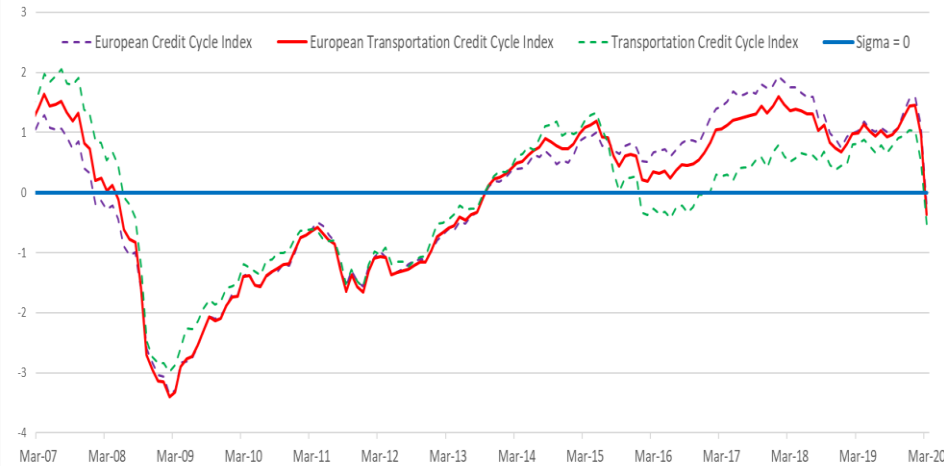
Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk

Transportation/Regional Credit Cycles as of March 23, 2020

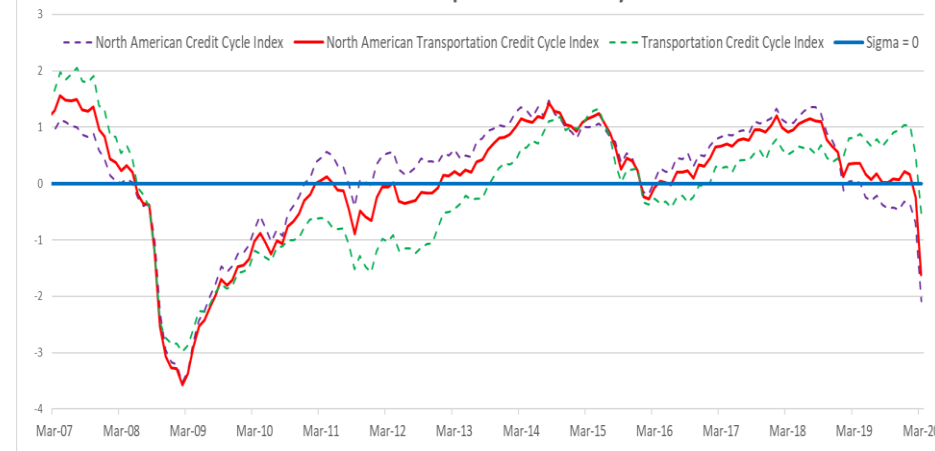
Asian Transportation Credit Cycle Index



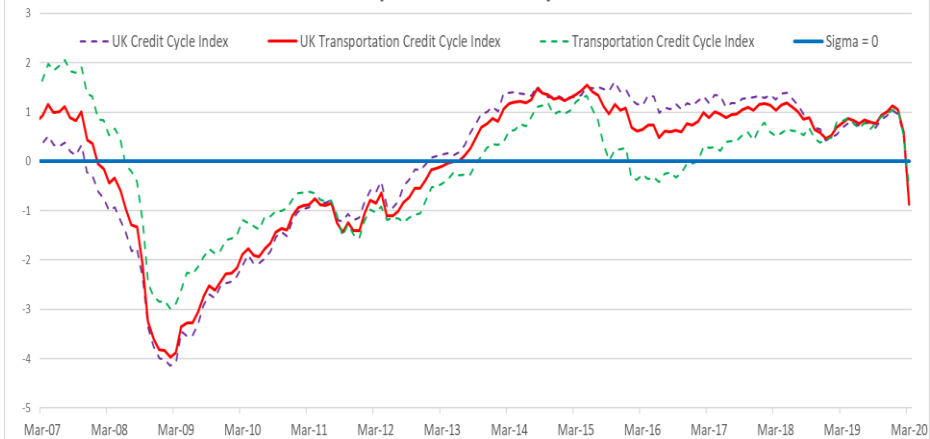
European Transportation Credit Cycle Index



North American Transportation Credit Cycle Index



UK Transportation Credit Cycle Index



Source: ZRE application, Moody's CreditEdge EDFs - 0 = TTC Credit Conditions – Cycles Shown in Sigma Units – Cycle Below 0 Implies PIT Risk > TTC Risk