

Évaluation numérique rigoureuse de fonctions D-finies en SageMath

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4 octobre 2016

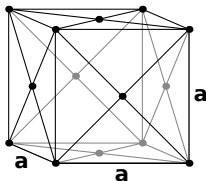
[arxiv:1607.01967](https://arxiv.org/abs/1607.01967) [cs.SC]

prepared with GNU T_EX_{MACS}

Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} \text{dop6} = & 410085196915322880 z^{35} + 112905266474211563520 z^{34} + 1171669263761496 \backslash \\ & 1489920 z^{33} + 690817401287078917363200 z^{32} + 27204862643846611522761600 z^{31} + \\ & 778811406918247228618497600 z^{30} + 17044384124115240781429792800 z^{29} + 294245234 \backslash \\ & 066850000428339092800 z^{28} + 4083424587805117060272476125800 z^{27} + 459730295491197962 \backslash \\ & 35386142827300 z^{26} + 419695598890898253203455876749930 z^{25} + 30642971761740916717179 \backslash \\ & 85958725620 z^{24} + 17169584489259696388755804636033570 z^{23} + 645817719616848100772794 \backslash \\ & 75394020500 z^{22} + 51714221934272099420476126216766700 z^{21} - 147396739150443789927738 \backslash \\ & 0487903179960 z^{20} - 14237554341321335335392023192872385940 z^{19} - 8321634013439311501 \backslash \\ & 6834220980384454340 z^{18} - 364019154328107562568847906822488063550 z^{17} - 126157147851 \backslash \\ & 3401088177035093275526304300 z^{16} - 3528341032098896995323439017117956856150 z^{15} - \\ & 7964369518593778029521056070442794466900 z^{14} - 14280500726162786254712841163875001 \backslash \\ & 728600 z^{13} - 19534653115686342543580831960941978918000 z^{12} - 18398783334222380084238 \backslash \\ & 012428704731960000 z^{11} - 7553741785990309357234054786177488000000 z^{10} + 888743230941 \backslash \\ & 9522403983976171775697600000 z^9 + 21137039158366320685856256980012112000000 z^8 + \\ & 22682693553934804690446647295508800000000 z^7 + 149381834 \backslash \\ & 28146261190546354671616000000000 z^6 + 4690246528584816329940 \backslash \\ & 199400448000000000 z^5 - 87282900863478573892616245248000000 \backslash \\ & 0000 z^4 - 1104327940779745890150773145600000000000 z^3 - 353898 \backslash \\ & 708207580856772919296000000000000 z^2 - 520793429107744448741 \backslash \\ & 376000000000000000 z - 242879062193188503552000000000000000 + \end{aligned}$$



Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (3964156903514787840 z^{36} + 1104718489963413534720 z^{35} + 117871088739930352834560 z^{34} + \\ & 7183287516644479615795200 z^{33} + 293105835218942903781855360 z^{32} + 870657237873 \backslash \\ & 4984776799502400 z^{31} + 197949776138115866133849254880 z^{30} + 355549462414631854804645 \backslash \\ & 3851120 z^{29} + 51457898672013865098111291247320 z^{28} + 60652283497953184068452162523 \backslash \\ & 7020 z^{27} + 5835366836846027182876920856348950 z^{26} + 4545520250182635897460621998197 \backslash \\ & 4015 z^{25} + 279153404467502062948531557838260750 z^{24} + 125227539937283713406150704262 \backslash \\ & 8908795 z^{23} + 2943182802923552038161307584706940070 z^{22} - 10483513115206289398510413 \backslash \\ & 216920199750 z^{21} - 169948182933507479161257565568616530700 z^{20} - 1154969594776277160 \backslash \\ & 649077785983820553870 z^{19} - 5548694490781020038019823355124585193590 z^{18} - \\ & 20745229517577451272377158241970915439245 z^{17} - 62232963928794638659423069651761 \backslash \\ & 724690290 z^{16} - 150810045901978932864163493046405461262105 z^{15} - 2925286265230056616 \backslash \\ & 29390236883046859976150 z^{14} - 441395096063183148839008172248580337780300 z^{13} - 48412 \backslash \\ & 3578764537043031861206473715269343000 z^{12} - 31297658464933476345181066385800419642 \backslash \\ & 0000 z^{11} + 31415133499909950234831915395869293600000 z^{10} + 3307384600876745554684914 \backslash \\ & 82629558468000000 z^9 + 391096978918364972225128472061480072000000 z^8 + 232460170425 \backslash \\ & 948027345434850305279520000000 z^7 + 18060134934884299834847099345568000000000 z^6 - \\ & 100213400891192102370293326036992000000000 z^5 - 83859064515985136495903099458560 \backslash \\ & 00000000 z^4 - 2948705176880404905848732897280000000000 z^3 - 551648271974304222847 \backslash \\ & 2840192000000000000 z^2 - 37955378966350598718455808000000000000 z + 83793276456650 \backslash \\ & 033725440000000000000000) Dz + \end{aligned}$$

Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (8133356405487237120 z^{37} + 2294131782043664317440 z^{36} + 251295328534762193633280 z^{35} + \\ & 15795453015240816970091520 z^{34} + 666093618246765502077439680 z^{33} + 2046937571 \backslash \\ & 2416843040909376160 z^{32} + 481817338267338639783328749120 z^{31} + 896797312621202003251 \backslash \\ & 7991216960 z^{30} + 134696914854304536722281866954300 z^{29} + 165183365498487607982012588 \backslash \\ & 5678650 z^{28} + 16607490026343429532811575311949230 z^{27} + 1362638694543047991468592533 \backslash \\ & 46813455 z^{26} + 895865319327471447638111289873238710 z^{25} + 44897110742643849065299259 \backslash \\ & 90254793265 z^{24} + 14491852283494577826654003932547711690 z^{23} - 168509066471194546983 \backslash \\ & 174648133542750 z^{22} - 386265894549826881229123104470731096440 z^{21} - 3163259131060568 \backslash \\ & 584546113343781987561220 z^{20} - 16636182069413821170544684047556220568150 z^{19} - \\ & 66246740089393676080981537130378090658525 z^{18} - 2090802458728506315663121374496195 \backslash \\ & 61543730 z^{17} - 529097465740104776391772834675033946593335 z^{16} - 10650386207573139293 \backslash \\ & 91639361032363453750930 z^{15} - 1653651644685620142167009422124022555221700 z^{14} - 1829 \backslash \\ & 383474513975929874027770563298831967800 z^{13} - 108870989683690580666028414927762156 \backslash \\ & 8328000 z^{12} + 437384067337328886944483963336952904080000 z^{11} + 167838036536543200662 \backslash \\ & 5451473236269012000000 z^{10} + 1564385355592027935922683162898655112000000 z^9 + 30360 \backslash \\ & 7398715325954207032303663107840000000 z^8 - 92955426338455477113648380158474560000 \backslash \\ & 0000 z^7 - 1334658535726482371536908049179648000000000 z^6 - 941977534006524837182879 \backslash \\ & 263564800000000000 z^5 - 35029765385278767758927501660160000000000 z^4 - 64286241473 \backslash \\ & 892148234640584704000000000000 z^3 - 374585057515485750985850880000000000000 z^2 + \\ & 668706777983396247404544000000000000000 z + 728637186579565510656000000000000 \backslash \\ & 0000) Dz^2 + \end{aligned}$$

Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (6219625486549063680 z^{38} + 1775531336308022522880 z^{37} + 199409996635132589752320 z^{36} + \\ & 12904862497592448920163840 z^{35} + 561222248755128125708191680 z^{34} + 17798695421 \backslash \\ & 072697669468739680 z^{33} + 432530168604725658189210596640 z^{32} + 8315189920333341531658 \backslash \\ & 617695280 z^{31} + 129103723904595771409928232487740 z^{30} + 1639190738531986170699647097 \backslash \\ & 803790 z^{29} + 17111040709840823035760757618682440 z^{28} + 14651890144386180365877132986 \backslash \\ & 6897880 z^{27} + 1015534278806669843159745327151252620 z^{26} + 54963382760530760750687544 \backslash \\ & 67310102760 z^{25} + 20890574209714927539267068315744951640 z^{24} + 301646099705919471898 \backslash \\ & 27076234922007050 z^{23} - 289127416281529376142095631015519267120 z^{22} - 30536692798730 \backslash \\ & 63346793150591937974700130 z^{21} - 17566486109105161467894504789161406270600 z^{20} - \\ & 73673650638461574538679743097050051115220 z^{19} - 24040743896755739891331729697533 \backslash \\ & 6574702980 z^{18} - 619168293687639511251067273975020197114100 z^{17} - 124122530329046062 \backslash \\ & 3795990859905959226579320 z^{16} - 1835553795134837646262350779261931882894750 z^{15} - \\ & 1670314602837141110845640706031012073555700 z^{14} + 3066874861862296186275087607527 \backslash \\ & 5710932000 z^{13} + 2931594155313390328935716187001614568260000 z^{12} + 49194564588996664 \backslash \\ & 98684069708388548285600000 z^{11} + 3777365646243762653104795884206143332000000 z^{10} + \\ & 68195639154415674514017863641593600000000 z^9 - 311881093752325372623566678266609 \backslash \\ & 6800000000 z^8 - 3771833787399616704258908808294288000000000 z^7 - 248844483193099682 \backslash \\ & 4908954989144320000000000 z^6 - 89395910342209380332330526274560000000000 z^5 - 1000 \backslash \\ & 83705719332806676962561024000000000000 z^4 + 2564203084567737476418017280000000000 \backslash \\ & 0000 z^3 + 10280761031833373040014131200000000000000 z^2 + 10337540084597585682432000 \backslash \\ & 0000000000000 z) Dz^3 + \end{aligned}$$

Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (2192816677949990400 z^{39} + 633490213477308768000 z^{38} + 72864986011484455353600 z^{37} + \\ & 4847486869795537260532800 z^{36} + 217014017048761645614816000 z^{35} + 708801699580 \backslash \\ & 0124707996090560 z^{34} + 177409657131610270482016190640 z^{33} + 351308991273658415654923 \backslash \\ & 8676620 z^{32} + 56201587732740449959670675451690 z^{31} + 73584775932673052902450424098 \backslash \\ & 8015 z^{30} + 7934411063073314432988482485900500 z^{29} + 7040517191263028635994557189677 \backslash \\ & 4110 z^{28} + 508882813920850610699235633677324220 z^{27} + 291338677229064650128281265554 \backslash \\ & 6011475 z^{26} + 12237989774964463385062890926963215950 z^{25} + 2730316387455561605215589 \backslash \\ & 8475524386210 z^{24} - 84400724272601405065271773264397209530 z^{23} - 1309329548085768562 \backslash \\ & 973129072537724164955 z^{22} - 8229269199062442444264260234977847805360 z^{21} - \\ & 35948740918844475140318574840001115213670 z^{20} - 1192466813203331345939144884033 \backslash \\ & 28142970080 z^{19} - 304273308297438630162837099041285050546455 z^{18} - 57714503089590179 \backslash \\ & 0697311126386896036767490 z^{17} - 707778167790136602728038144967670916837350 z^{16} - \\ & 153341406553907334245470038125935935813900 z^{15} + 16112029206288259429402194065158 \backslash \\ & 76419542000 z^{14} + 4188993616205017046899739124211544543460000 z^{13} + 5699626392082018 \backslash \\ & 037453259396194906388000000 z^{12} + 4145140187203309836183311398252469964000000 z^{11} + \\ & 95068892397133773199630362250506960000000 z^{10} - 322447694713681036240924354097202 \backslash \\ & 9600000000 z^9 - 3636835528138928302767664987399536000000000 z^8 - 210391871123659328 \backslash \\ & 5373196111532800000000000 z^7 - 55159060242541438416411785825280000000000 z^6 + 1162 \backslash \\ & 15925694410902420898178048000000000000 z^5 + 11283852768448237101798156288000000000 \backslash \\ & 0000 z^4 + 26640440911690813973554790400000000000000 z^3 + 24272726277931776073728000 \backslash \\ & 0000000000000 z^2) Dz^4 + \end{aligned}$$

Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (390720062616543744 z^{40} + 114216661424360307456 z^{39} + 13440822351615963069696 z^{38} + \\ & 917965180366474611870720 z^{37} + 42237673932263775988570560 z^{36} + 14182188393104 \backslash \\ & 81932976078400 z^{35} + 36487206836408001197689910640 z^{34} + 74250415206276560223775945 \backslash \\ & 2720 z^{33} + 12205694666919011642462560650930 z^{32} + 16425102239444377898676373653 \backslash \\ & 9405 z^{31} + 1821767115612836434053737404755054 z^{30} + 1665793830282400726724372436543 \backslash \\ & 4191 z^{29} + 124533460849620200009711445328730256 z^{28} + 743593796442908540070532245488 \backslash \\ & 378205 z^{27} + 3336004607088107531634361889061221370 z^{26} + 902022216185473608420262982 \backslash \\ & 4390547047 z^{25} - 9198824722943404205447421299404277112 z^{24} - 27944986880240251417567 \backslash \\ & 7041789492570017 z^{23} - 1907863427661939885576723126598906643790 z^{22} - 85740836464757 \backslash \\ & 10050757565542672979674555 z^{21} - 28405587296847231070183606856583770811720 z^{20} - \\ & 69574258175312955514440713973653616428745 z^{19} - 11499143689248771166993784982491 \backslash \\ & 2517430330 z^{18} - 70378017201579863364495432167182725333675 z^{17} + 2616419665010891478 \backslash \\ & 43656083216157842879550 z^{16} + 1049410824795136384837467209810025539400000 z^{15} + 2089 \backslash \\ & 663780964272997600159898811800513390000 z^{14} + 259786002679636380331331345092974504 \backslash \\ & 0000000 z^{13} + 1759136834585156085432113720072647266000000 z^{12} - 13467561499122371310 \backslash \\ & 8740928290811280000000 z^{11} - 1578996098791370746284707453439169200000000 z^{10} - 15568 \backslash \\ & 11681322720025894531955998040000000000 z^9 - 67890891761349944176134243479520000000 \backslash \\ & 0000 z^8 + 3149221592935046990103881875200000000000 z^7 + 192407344459752425261121833 \backslash \\ & 472000000000000 z^6 + 10412684021044478206062895104000000000000 z^5 + 20982276643045 \backslash \\ & 3935990128640000000000000000 z^4 + 178743809832799664332800000000000000000 z^3) Dz^5 + \end{aligned}$$

Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (35882454730090752 z^{41} + 10612604051614486656 z^{40} + 1276532600942212775168 z^{39} + \\ & 89393980129433032096320 z^{38} + 4221606838983473228197008 z^{37} + 145494567985766484 \backslash \\ & 898923048 z^{36} + 3840828004490920060950969480 z^{35} + 80160062388267727172211985080 z^{34} + \\ & 1350855094398006902682870922050 z^{33} + 18631082892630536824222949409585 z^{32} + 2118 \backslash \\ & 15796834464054711973645322142 z^{31} + 1986708322085667572665525016037411 z^{30} + 1526308 \backslash \\ & 2383031406770429022758762048 z^{29} + 94068732852089205756130773605094705 z^{28} + 4410553 \backslash \\ & 76229095921513357130918811338 z^{27} + 1319636945498761264973744224282378779 z^{26} - 1376 \backslash \\ & 26809673226795399591264079041112 z^{25} - 31072001737970299221405533198706303141 z^{24} - \\ & 226886176666918560987240200768631693150 z^{23} - 1033954017266382248984767586852072 \backslash \\ & 344191 z^{22} - 3356732946224373601649087937349109785896 z^{21} - 757312621278500761889122 \backslash \\ & 5542456994124245 z^{20} - 9076459539413303184641722134776573895810 z^{19} + 10278671248090 \backslash \\ & 335377408918358815408788425 z^{18} + 85149274357043292385925033653294291853550 z^{17} + \\ & 240689360358498296007939096187740586134000 z^{16} + 4294098789219576487905557752682 \backslash \\ & 42743350000 z^{15} + 495779225046771906420255540348281344800000 z^{14} + 28712136337931261 \backslash \\ & 6871562346484465378000000 z^{13} - 119682652007548350954457856750250720000000 z^{12} - \\ & 395683465592680867401293480616198000000000 z^{11} - 32738346275504238594974769124082 \backslash \\ & 4000000000 z^{10} - 86642575450501391066787202019520000000000 z^9 + 5970468397217067954 \backslash \\ & 8931977222400000000000 z^8 + 7251161027741239099083936307200000000000 z^7 + 33882896 \backslash \\ & 75587207195688626176000000000000 z^6 + 631115677130491732576665600000000000000 z^5 + \\ & 512323021813756999680000000000000000000 z^4) Dz^6 + \end{aligned}$$

Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (1600200173148416 z^{42} + 478782978712278912 z^{41} + 58815380786135567104 z^{40} + 4218590 \backslash \\ & 040421804170816 z^{39} + 204216444469816446653424 z^{38} + 7214118624119937529541160 z^{37} + \\ & 195106070712453547506798168 z^{36} + 4168870319524368197533959000 z^{35} + 7187441279 \backslash \\ & 5312940511795668940 z^{34} + 1013528039913249207367842378270 z^{33} + 11775924181048893848 \backslash \\ & 357395670676 z^{32} + 112862055818213392356279768225402 z^{31} + 8863404948364755698667411 \backslash \\ & 39358344 z^{30} + 5592675973186567437279733685351646 z^{29} + 2698363575933371124342782835 \backslash \\ & 4079724 z^{28} + 85059388463264142313662526542420618 z^{27} + 2481695683318164448040331315 \backslash \\ & 0735864 z^{26} - 1739731529923503295984796806526752758 z^{25} - 13215685421423157401833903 \backslash \\ & 137021991092 z^{24} - 60101514732517779329542749898893453858 z^{23} - 18740612193374001721 \backslash \\ & 2741167478185137320 z^{22} - 367088786736715063908412462166156515566 z^{21} - 136331238303 \backslash \\ & 988349001415414181532146340 z^{20} + 2052937632229799753666758504303681446150 z^{19} + \\ & 8942220864711302092023950168348534856300 z^{18} + 22112779083456047399791690319673356 \backslash \\ & 808000 z^{17} + 36662299830964853548300895468723502480000 z^{16} + 38663936209054739955701 \backslash \\ & 649076784708400000 z^{15} + 15575841209632684184725074680551176000000 z^{14} - 23399775927 \backslash \\ & 110778754739301057544560000000 z^{13} - 45957581844555068108338692961807200000000 z^{12} - \\ & 32525005285459811112066289505232000000000 z^{11} - 366121829233752392904666430464000 \backslash \\ & 0000000 z^{10} + 10970395301506611292814537164800000000000 z^9 + 9713112405197935942595 \backslash \\ & 533824000000000000 z^8 + 426097871942078389250377728000000000000 z^7 + 7564670791225 \backslash \\ & 3502668800000000000000000000 z^6 + 5920177140958969774080000000000000000 z^5) Dz^7 + \end{aligned}$$

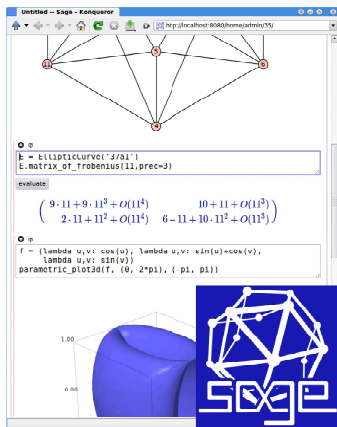
Face-Centered Cubic Lattices

[Koutschan 2013]

$$\begin{aligned} & (27122036833024 z^{43} + 8208413201024064 z^{42} + 1028987679702510976 z^{41} + 75518451 \backslash \\ & 137118783792 z^{40} + 3743195619381989907184 z^{39} + 135369638077546936261428 z^{38} + 374561 \backslash \\ & 5314367420203992832 z^{37} + 81811619367860049045984675 z^{36} + 144046663724820391377433 \backslash \\ & 4250 z^{35} + 20724331113040275023719172850 z^{34} + 245446627541652046097792768214 z^{33} + \\ & 2395828801191215780780578117794 z^{32} + 19147407470673111231862249418166 z^{31} + 1228 \backslash \\ & 63963621496746370188659696702 z^{30} + 602621255648485924378700672331054 z^{29} + 19351926 \backslash \\ & 64301617476137337671088360 z^{28} + 694152712036783264243644290673234 z^{27} - 39030042885 \backslash \\ & 818935455901289133872622 z^{26} - 297645962803933196564873733670191774 z^{25} - 1329742929 \backslash \\ & 728007215704002549281591538 z^{24} - 3903989614825648819224432657208727646 z^{23} - 603801 \backslash \\ & 5534019664017777438417359311914 z^{22} + 7565280951156009750992823479550694170 z^{21} + \\ & 83328126336960183101771239549883786325 z^{20} + 29785983697247118038201732716290595 \backslash \\ & 5900 z^{19} + 681226694393685252017130073908325840500 z^{18} + 105550431693258622661339004 \backslash \\ & 4310017920000 z^{17} + 974982625144110654834660688990434600000 z^{16} + 809214817274247946 \backslash \\ & 23135930623472000000 z^{15} - 1245692778975371208980497936649580000000 z^{14} - 1877612972 \backslash \\ & 166046542841525891548000000000 z^{13} - 1186201691981014544058180007080000000000 z^{12} - \\ & 4424139263701398029187830400000000000 z^{11} + 5265884988502355913417731200000000 \backslash \\ & 0000 z^{10} + 410999234738834010247469568000000000000 z^9 + 174333012213810958051184640 \backslash \\ & 00000000000 z^8 + 2995053035474379315363840000000000000 z^7 + 227699120806114222080 \backslash \\ & 0000000000000000 z^6) Dz^8 \end{aligned}$$

order 8, degree 43, 43-digit coefficients

What it Is: A SageMath Implementation



- ▷ Python library
- ▷ “A viable alternative to Magma, Maple, Mathematica and Matlab”

```
sage: Pols.<z> =
PolynomialRing(QQ)
```

```
sage: (z + 1)*(z-1)
```

```
z^2 - 1
```



<http://sagemath.org/>
GNU GPL v2+

What it Is: Based on ore_algebra

[Kauers, Jaroschek, Johansson, 2013-]

```
sage: from ore_algebra import OreAlgebra
```

```
sage: DiffOps.<Dz> = OreAlgebra(Pols)
```

```
sage: DiffOps
```

```
Univariate Ore algebra in Dz over Univariate Polynomial Ring  
in z over Rational Field
```

```
sage: Dz*z
```

```
z*Dz + 1
```

Features: Euclidean arithmetic, closure properties, formal solutions, desingularization, first-order factors, guessing...



http://www.risc.jku.at/research/combinat/software/ore_algebra/

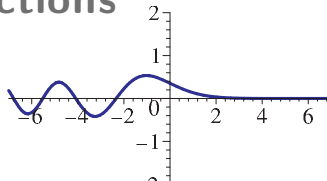
What it Is: The `-analytic` Branch

- ▷ **Symbolic-numeric** extensions for `ore_algebra`
- ▷ Real & complex arithmetic based on **Arb** [Johansson 2012–]
(`{Real,Complex}BallField` in Sage)
- ▷ Both for “end users” and for prototyping algorithms
- ▷ Development branch, not (yet) integrated into any release of `ore_algebra`



http://marc.mezzarobba.net/code/ore_algebra-analytic
GNU GPL v2+

What it Does: Special Functions



```
sage: diffop = Dz^2 - z
```

```
sage: diffop.numerical_solution(  
    [1/(gamma(2/3)*3^(2/3)), -1/(gamma(1/3)*3^(1/3))],  
    [0, i], 1e-40)
```

```
[0.3314933054321411889845293326171343458866 +/- 5.51e-41] +  
[-0.31744985896844377347764292790925852645896 +/- 7.23e-42]*I
```

```
sage: ComplexBallField(138)(i).airy_ai()
```

```
[0.33149330543214118898452933261713434588655 +/- 5.25e-42] +  
[-0.31744985896844377347764292790925852645896 +/- 1.59e-42]*I
```

What it Does: D-Finite Functions

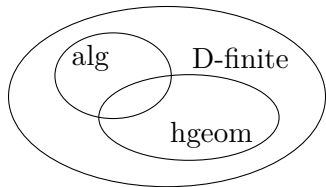
[Stanley, Zeilberger... 1980-]

An analytic function $y: \mathbb{C} \rightarrow \mathbb{C}$ is **D-finite** (holonomic) iff it satisfies a linear homogeneous ODE with polynomial coefficients:

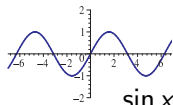
$$a_r(z) y^{(r)}(z) + \cdots + a_1(z) y'(z) + a_0(z) y(z) = 0, \quad a_j \in \mathbb{K}[z]$$

Philosophy:

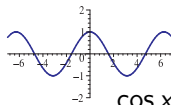
Provide **general algorithms** for D-finite functions, using { ODE + initial values } as a data structure.



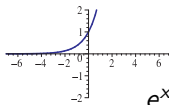
What it Does: D-Finite Functions



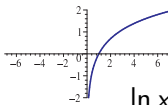
$\sin x$ ✓



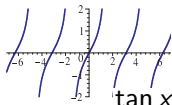
$\cos x$ ✓



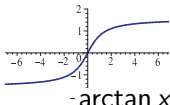
e^x ✓



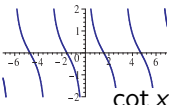
$\ln x$ ✓



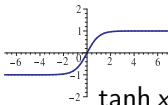
$\tan x$ ✗



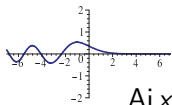
$-\arctan x$ ✓



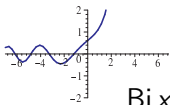
$\cot x$ ✗



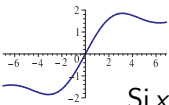
$\tanh x$ ✓



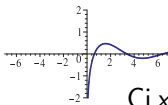
$Ai x$ ✓



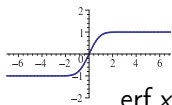
$Bi x$ ✓



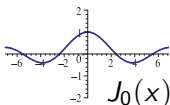
$Si x$ ✓



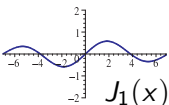
$Ci x$ ✓



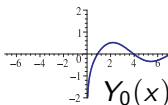
$\operatorname{erf} x$ ✓



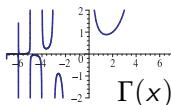
$J_0(x)$ ✓



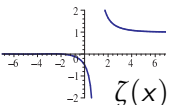
$J_1(x)$ ✓



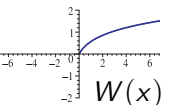
$Y_0(x)$ ✓



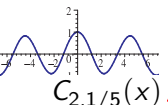
$\Gamma(x)$ ✗



$\zeta(x)$ ✗



$W(x)$ ✗



$C_{2,1/5}(x)$ ✗

What it Does: D-Finite Functions

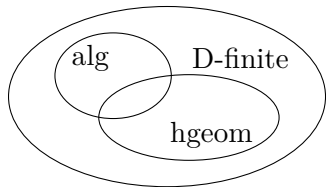
[Stanley, Zeilberger... 1980-]

An analytic function $y: \mathbb{C} \rightarrow \mathbb{C}$ is **D-finite** (holonomic) iff it satisfies a linear homogeneous ODE with polynomial coefficients:

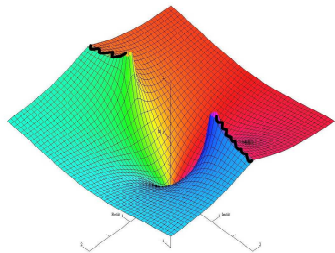
$$a_r(z) y^{(r)}(z) + \cdots + a_1(z) y'(z) + a_0(z) y(z) = 0, \quad a_j \in \mathbb{K}[z]$$

Philosophy:

Provide **general algorithms** for D-finite functions, using { ODE + initial values } as a data structure.



What is Does: Analytic Continuation



$$y(z) = \arctan(z)$$

$$(z^2 + 1)y''(z) + 2zy'(z) = 0$$

```
sage: dop = (z^2+1)*Dz^2 + 2*z*Dz
```

```
sage: dop.numerical_solution(  
    ini=[0,1], path=[0,1])
```

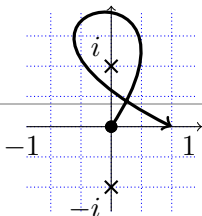
```
[0.78539816339744831 +/- 1.08e-18]
```

```
sage: dop.numerical_solution(  
    ini=[0,1],  
    path=[0,i+1,2*i,i-1,0,1])
```

```
[3.9269908169872415
```

```
+/- 4.81e-17]
```

```
+ [+/- 4.63e-21]*I
```



What it Does: Transition Matrices

$$(z^2 + 1)y''(z) + 2zy'(z) = 0 \quad \Rightarrow \quad \begin{bmatrix} y(1) \\ y'(1) \end{bmatrix} = \begin{bmatrix} \square & \square \\ \square & \square \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$

↑
"transition matrix"

```
sage: dop.numerical_transition_matrix([0,1])
```

```
[ 1.0000000000000000 [0.7853981633974483 +/- 1.46e-17]]  
[                    0 [0.5000000000000000 +/- 1.03e-17]]
```

```
sage: n(pi/4)
```

```
0.785398163397448
```

$$f(z) = 1 \quad = 1 + 0 \cdot z + O(z^2)$$

$$g(z) = \arctan(z) \quad = 0 + 1 \cdot z + O(z^2)$$

$$\begin{bmatrix} \square & \square \\ \square & \square \end{bmatrix} = \begin{bmatrix} f(1) & g(1) \\ f'(1) & g'(1) \end{bmatrix}$$

What it Does: Regular Singular Points

The previous examples only involved **ordinary** (= non-singular) points.

$$z^2 y''(z) + zy'(z) + (z^2 - \nu^2) y(z) = 0 \quad (\text{Bessel eq.})$$

↑
singular point at 0
regular (\approx tame) in this case

✓ $z^{-3/2} \log z$

✓ $z^{i\sqrt{2}}$

✗ $e^{\pm 1/z}$

Theorem [Fuchs, 1866]

Assume that 0 is a regular singular point. Then, for some $D \ni 0$, there exists a basis of solutions defined on $D \setminus \{0\}$ of the form

$$z^\lambda (y_0(z) + y_1(z) \log z + \cdots + y_t(z) \log^t z), \quad \lambda \in \bar{\mathbb{Q}}, \quad y_i \text{ **analytic** on } D.$$

Regular Singular Connection Problems

$$z^2 y''(z) + zy'(z) + z^2 y(z) = 0 \quad \Rightarrow \quad \begin{bmatrix} y(1) \\ y'(1) \end{bmatrix} = \begin{bmatrix} \square & \square \\ \square & \square \end{bmatrix} \begin{bmatrix} a \\ b \end{bmatrix}$$

where $y(z) = a \cdot \log z + b \cdot \mathbf{1} + O(z)$

```
sage: dop = z*Dz^2 + Dz + z^2
```

```
sage: dop.local_basis_monomials(0)
```

```
[log(z), 1]
```

```
sage: dop.numerical_transition_matrix([0, 1], 1e-10)
```

```
[[0.071033860082 +/- 1.75e-13] [0.89193746813 +/- 2.73e-12]]  
[ [1.0960559318 +/- 2.73e-11] [-0.31515459259 +/- 4.76e-13]]
```

Applications: special functions, analytic combinatorics, resummation...

Asymptotics of Apéry Numbers

$$a_n = \sum_{k=0}^n \binom{n}{k}^2 \binom{n+k}{k}^2 \quad b_n = \sum_{k=1}^n \left(\frac{a_n}{k^3} - \sum_{m=1}^k \frac{(-1)^m \binom{n}{k}^2 \binom{n+k}{k}^2}{2 m^3 \binom{n}{m} \binom{n+m}{m}} \right)$$

(1, 5, 73, 1445, 33001...) (0, 6, 351/4, 62531/36, ...)

- ▷ The OGS $a(z)$ and $b(z)$ are solutions of $L = z^2(z^2 - 34z + 1) D_x^4 + \dots$
- ▷ Singular points: 0, $\alpha = (\sqrt{2} + 1)^4 \approx 33.9$, $\alpha^{-1} = (\sqrt{2} - 1)^4 \approx 0.0294$
- ▷ Prove: $a_n, b_n = \alpha^{n+o(n)}$ $b_n - \zeta(3) a_n = \alpha^{-n+o(n)}$
- ▷ Local expansion at α^{-1} : $a(z) = c_0 f_0(z) + c_1 f_1(z) + c_2 f_2(z) + c_3 f_3(z)$
where $f_0(\alpha^{-1} + t) = 1 + O(t^3)$ $f_3(\alpha^{-1} + t) = t + O(t^3)$
 $f_1(\alpha^{-1} + t) = \sqrt{t} + O(t^3)$ $f_4(\alpha^{-1} + t) = t + O(t^3)$
- ▷ Singularity analysis: ($c_1 \neq 0$)

$$a(z) \sim c_1 \sqrt{z - \alpha^{-1}} \quad \Rightarrow \quad a_n \sim c_1 [z^n] \sqrt{z - \alpha^{-1}} \sim \frac{c_1 i}{2\sqrt{\alpha\pi}} \alpha^n n^{-3/2}$$

Face-Centered Cubic Lattices

[Koutschan 2013]

```
sage: dop4 = ((-1 + z)*z^3*(2 + z)*(3 + z)*(6 + z)*(8 + z)*(4 + 3*z)^2*Dz^4 + 2*z^2*(4 + 3*z)*(-3456 - 2304*z + 3676*z^2 + 4920*z^3 + 2079*z^4 + 356*z^5 + 21*z^6)*Dz^3 + 6*z*(-5376 - 5248*z + 11080*z^2 + 25286*z^3 + 19898*z^4 + 7432*z^5 + 1286*z^6 + 81*z^7)*Dz^2 + 12*(-384 + 224*z + 3716*z^2 + 7633*z^3 + 6734*z^4 + 2939*z^5 + 604*z^6 + 45*z^7)*Dz + 12*z*(256 + 632*z + 702*z^2 + 382*z^3 + 98*z^4 + 9*z^5))
```

```
sage: dop4.local_basis_monomials(0)
```

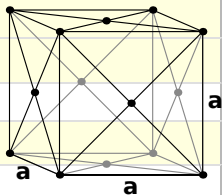
```
[1/6*log(z)^3, 1/2*log(z)^2, log(z), 1]
```

```
sage: dop4.local_basis_monomials(1)
```

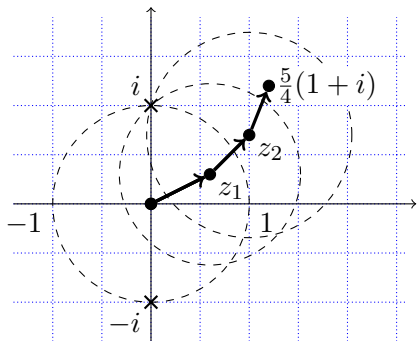
```
[1, (z - 1)*log(z - 1), z - 1, (z - 1)^2]
```

```
sage: dop4.numerical_transition_matrix([0, 1])[0, -1]
```

```
[1.1058437979212048 +/- 3.99e-17] + [+/- 6.96e-26]*I
```



How it Works: A Taylor Series Method



$$\arctan\left(\frac{5}{4}(1+i)\right) ?$$

$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0.57\dots + 0.22\dots \\ 0 & 0.72\dots - 0.20\dots \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$

$$\begin{bmatrix} y(z_2) \\ y'(z_2) \end{bmatrix} = \begin{bmatrix} 1 & 0.36\dots + 0.32\dots \\ 0 & 0.75\dots - 0.07\dots \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$

...

At each step, compute the sum of the power series expansion of each entry of the transition matrix.

The idea extends to the regular singular case.

How it Works: Recurrences

The **Taylor coefficients** of a D-finite function $y(z) = \sum_{n=0}^{\infty} y_n z^n$ obey a linear **recurrence relation** with polynomial coefficients:

$$b_s(n) y_{n+s} + \dots + b_1(n) y_{n+1} + b_0(n) y_n = 0.$$

(And conversely, for D-finite formal power series.)

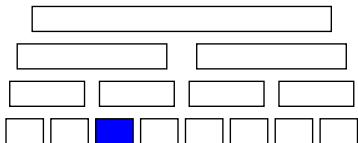
Leads to **fast algorithms** (not fully implemented yet)

[Schroepel 1972; Brent 1976; Chudnovsky & Chudnovsky 1988;
van der Hoeven 1999, 2001; M. 2010, 2012; Johansson 2014]

Best complexity:

time $O(M(n \log^2 n))$, space $O(n)$

for fixed z and $\varepsilon = 2^{-n}$



How it Works: Truncation Errors

Problem

$$\sum_{n=0}^{\infty} u_n z^n = \underbrace{\sum_{n=0}^{N-1} u_n z^n}_{\text{known}} + \underbrace{\sum_{n=N}^{\infty} u_n z^n}_{|\cdot| \leq ?}$$

“Adaptive” bounds:

$$Ax = b \quad \|A^{-1}\| \leq M \\ A \in \text{GL}_n(\mathbb{C})$$

$$A\tilde{x} = \tilde{b} \quad \Rightarrow \quad \|x - \tilde{x}\| \leq M \cdot \underbrace{\|b - \tilde{b}\|}_{\text{known}}$$

Compute a bound similar to M when A replaced with a differential operator?

How it Works: Majorant Series

[Cauchy; ...; van der Hoeven 2001; M. & Salvy 2010]

- ▷ Instead of directly bounding $|\sum_{n \geq N} u_n z^n|$, compute a **majorant series**:

$$\sum v_n z^n \in \mathbb{R}_{\geq 0}[[z]] \quad \text{s.t.} \quad \forall n, \quad |u_n| \leq v_n$$

- ▷ Bound the differential equation with a simple “**model equation**”:

$$L(z, D_z) \cdot u = 0 \quad \Leftarrow \quad v'(z) - \frac{1}{(1 - \alpha z)} v(z) = 0$$

for us: always 1st order

- ▷ Solve the model equation and study the solutions:

$$v(z) = \exp \int^z \frac{dt}{1 - \alpha t} \quad \left| \sum_{n=N}^{+\infty} u_n z^n \right| \leq \sum_{n=N}^{+\infty} v_n |z|^n \leq ?$$



Summary

What it is: an extension of ore_algebra written in/for SageMath

What it does: numerical analytic continuation & singular connection, for arbitrary D-finite functions, with rigorous error bounds

How it works: Taylor series, analytic continuation, recurrences, majorants, ball arithmetic...



Code available at

http://marc.mezzarobba.net/code/ore_algebra-analytic



Perspectives

Fast algorithms, lower-level code,
evaluation on intervals, D-finite functions as objects,
irregular singular connection problems [van der Hoeven 2006]...

Comments, bug reports, feature requests, examples welcome!

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